# FEniCS Course

Overview and Introduction

Lecturer
Simon Funke
Berlin, January 23–24 2018



### Course outline

- Tue ★ Overview and Introduction

  L01 Installation of FEniCS
  - L02 Static linear PDEs
  - **L04** Time-dependent PDEs
- $Wed \star PDE$ -constrained optimisation
  - L13 Introduction to dolfin-adjoint
  - L14 From sensitivity to optimisation
  - L16 Optimisation challenge

The lectures can be downloaded from http://simonfunke.com/fenics-lecture

### Full list of FEniCS lectures

- **L00** Introduction to FEM
- L01 Installation of FEniCS
- L02 Static linear PDEs
- L03 Static nonlinear PDEs
- L04 Time-dependent PDEs
- L05 Happy hacking: Tools, tips and coding practices
- L06 Static hyperelasticity
- L07 Dynamic hyperelasticity
- L08 The Stokes problem
- L09 Incompressible Navier–Stokes
- L10 Discontinuous Galerkin methods for elliptic equations
- L11 A posteriori error estimates and adaptivity
- L12 Computing sensitivities
- L13 Introduction to dolfin-adjoint
- L14 From sensitivities to optimisation
- L14 One-shot optimisation
- L16 Optimal control of the Navier-Stokes equations

All lectures can be downloaded from

http://fenicsproject.org/pub/course/





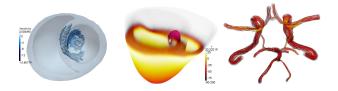
The FEniCS Project is a collection of open-source software components aimed at the numerical solution of partial differential equations using finite element methods

### Key distinguishing features

- FEniCS (Python/C++) code is quick to write and easy to read
- 'Any' finite element formulation of 'any' partial differential equation can be coded
- Automated code generation is heavily used under the hood to create efficient, specialized, low-level code
- Performance implicit problems with over 12 000 000 000 degrees of freedom can be solved in a couple of minutes

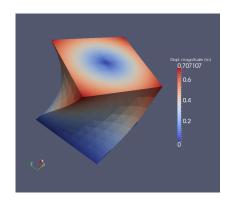
# FEniCS has been used for a wide range of equations and applications

Reaction-diffusion equations; Stokes with or without nonlinear viscosity; compressible and incompressible Navier-Stokes; RANS turbulence models; shallow water equations; Bidomain equations; nonlinear and linear elasticity; nonlinear and linear viscoelasticity; Schrödinger; Biot's equations for porous media, fracture mechanics, electromagnetism, liquid crystals including liquid crystal elastomers, combustion, ... and coupled systems of the above, ...



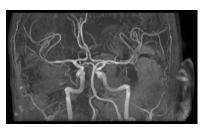
for simulating blood flow, computing calcium release in cardic tissue, computing the cardiac potential in the heart, simulating mantle convection, simulating melting ice sheets, computing the optimal placement of tidal turbines, simulating and reconstructing tsunamis, simulating the flow of cerebrospinal fluid and the deformation of the spinal cord, simulating waveguides. ...

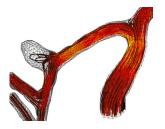
## Hyperelasticity



```
from fenics import *
mesh = UnitCubeMesh(24, 16, 16)
V = VectorFunctionSpace(mesh, "Lagrange", 1)
left = CompiledSubDomain("(std::abs(x[0])
   < DOLFIN_EPS) && on_boundary")
right = CompiledSubDomain("(std::abs(x[0] - 1.0)
   < DOLFIN EPS) && on boundary")
c = Expression(("0.0", "0.0", "0.0"), degree=0)
r = Expression(("0.0".
0.5*(y0+(x[1]-y0)*cos(t)-(x[2]-z0)*sin(t)-x[1])
0.5*(z0+(x[1]-y0)*sin(t)+(x[2]-z0)*cos(t)-x[2])
v0=0.5, z0=0.5, t=pi/3, degree=3)
bcl = DirichletBC(V. c. left)
bcr = DirichletBC(V, r, right)
bcs = [bcl. bcr]
v = TestFunction(V)
n = Function(V)
 = Constant((0.0, -0.5, 0.0))
 = Constant((0.1, 0.0, 0.0))
I = Identity(V.cell().d)
F = I + grad(u)
Ic = tr(F.T*F)
J = det(F)
E, nu = 10.0, 0.3
mu. lmbda = Constant(E/(2*(1 + nu))).
   Constant(E*nu/((1 + nu)*(1 - 2*nu)))
psi = (mu/2)*(Tc - 3) - mu*In(J) +
   (lmbda/2)*(ln(J))**2
Pi = psi*dx - dot(B, u)*dx - dot(T, u)*ds
F = derivative(Pi, u, v)
solve(F == 0, u, bcs)
plot(u, interactive=True, mode="displacement")
```

# Computational hemodynamics





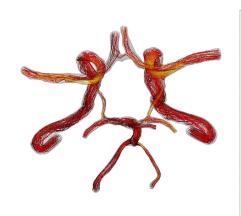
- Low wall shear stress may trigger aneurysm growth
- Solve the incompressible Navier–Stokes equations on patient-specific geometries

$$\dot{u} + u \cdot \nabla u - \nabla \cdot \sigma(u, p) = f$$
$$\nabla \cdot u = 0$$

 Use PDE-constrained optimisation to assimilate measurements into simulation.

Valen-Sendstad, Mardal, Logg, Computational hemodynamics (2011) Funke, Nordaas, Evju, Alnæs, Mardal, arxiv (2018)

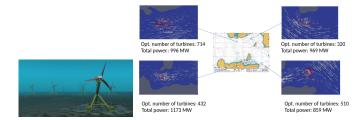
## Computational hemodynamics (contd.)



```
# Define Cauchy stress tensor
def sigma(v,w):
                return 2.0*mu*0.5*(grad(v) + grad(v).T) -
                                w*Identity(v.cell().d)
# Define symmetric gradient
def epsilon(v):
                return 0.5*(grad(v) + grad(v).T)
# Tentative velocity step (sigma formulation)
F1 = rho*(1/k)*inner(v, u - u0)*dx + rho*inner(v, u - u0)*dx + rho*inner(u, u - u0)*dx + rho*i
              grad(u0)*(u0 - w))*dx \
            + inner(epsilon(v), sigma(U, p0))*dx \
            + inner(v. p0*n)*ds - mu*inner(grad(U).T*n.
                           v)*ds \
             - inner(v. f)*dx
 a1 = lhe(F1)
L1 = rhs(F1)
# Pressure correction
a2 = inner(grad(g), k*grad(p))*dx
L2 = inner(grad(q), k*grad(p0))*dx - q*div(u1)*dx
# Velocity correction
a3 = inner(v, u)*dx
L3 = inner(v, u1)*dx + inner(v, k*grad(p0 -
              p1))*dx
```

- The Navier–Stokes solver is implemented in Python/FEniCS
- FEniCS allows solvers to be implemented in a minimal amount of code

# Simulation and optimisation of tidal turbine arrays



- Tidal turbine arrangement influences the total performance of an array.
- Solve the shallow water equations, and compute optimal design.

$$\dot{u} + u \cdot \nabla u - \nabla \cdot \sigma(u, p) = f$$
$$\nabla \cdot u = 0$$

# Hello World in FEniCS: problem formulation

### Poisson's equation

$$-\Delta u = f \quad \text{in } \Omega$$
$$u = 0 \quad \text{on } \partial \Omega$$

### Finite element formulation

Find  $u \in V$  such that

$$\underbrace{\int_{\Omega} \nabla u \cdot \nabla v \, \mathrm{d}x}_{\mathbf{a}(u,v)} = \underbrace{\int_{\Omega} f \, v \, \mathrm{d}x}_{\mathbf{L}(v)} \quad \forall \, v \in V$$

## Hello World in FEniCS: implementation

```
from fenics import *
mesh = UnitSquareMesh(32, 32)
V = FunctionSpace(mesh, "Lagrange", 1)
u = TrialFunction(V)
v = TestFunction(V)
f = Expression("x[0]*x[1]", degree=2)
a = dot(grad(u), grad(v))*dx
I. = f * v * dx
bc = DirichletBC(V, 0.0, DomainBoundary())
u = Function(V)
solve(a == L, u, bc)
plot(u)
```

### Basic API

- Mesh, Vertex, Edge, Face, Facet, Cell
- FiniteElement, FunctionSpace
- TrialFunction, TestFunction, Function
- grad(), curl(), div(), ...
- Matrix, Vector, KrylovSolver, LUSolver
- assemble(), solve(), plot()

- Python interface generated semi-automatically by SWIG
- C++ and Python interfaces almost identical

What happens behind the scences?

# FEniCS code can be readable, scale with mathematical complexity, and provide high-performance

### Stokes with nonlinear viscosity

Given temperature T, find velocity u and pressure p such that

$$-\operatorname{div}(2\nu(u,T)\varepsilon(u) + pI) = \operatorname{Ra} T g$$
$$\operatorname{div} u = 0$$

in  $\Omega$  with (for instance)

$$\nu(u,T)=e^{-\alpha T}\,(u\cdot u).$$

#### Finite element formulation

Given temperature T, find  $(u, p) \in W = V \times Q$  such that

$$\int_{\Omega} 2\nu(u, T)\varepsilon(u) \cdot \varepsilon(v) + \operatorname{div}(v) p$$
$$+ \operatorname{div}(u) q - \operatorname{Ra}Tg \cdot v \, dx = 0$$

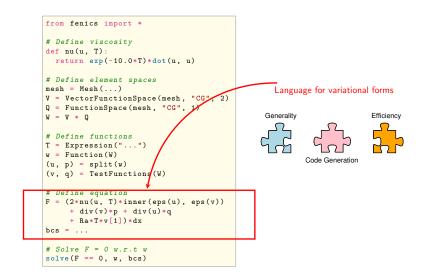
for all  $(v,q) \in W$ .

```
from fenics import *
# Define viscosity
def nu(u, T):
  return exp(-10.0*T)*dot(u, u)
# Define element spaces
mesh = Mesh(...)
V = VectorFunctionSpace(mesh, "CG", 2)
Q = FunctionSpace(mesh, "CG", 1)
W = V * O
# Define functions
T = Expression("...")
w = Function(W)
(u, p) = split(w)
(v. q) = TestFunctions(W)
# Define equation
F = (2*nu(u, T)*inner(eps(u), eps(v))
     + div(v)*p + div(u)*q
    + Ra*T*v[1])*dx
bcs = ...
# Solve F = 0 w r t w
solve(F == 0. w. bcs)
```

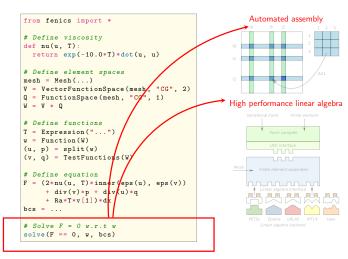
# FEniCS provides a wide range of (mixed) finite element spaces

from fenics import \* # Define viscosity def nu(u, T): return exp(-10.0\*T)\*dot(u, u) # Define element spaces mesh = Mesh(...)V = VectorFunctionSpace(mesh, "CG", 2) Q = FunctionSpace(mesh, "CG", 1) W = V \* O# Define functions T = Expression("...") w = Function(W) (u, p) = split(w)(v, q) = TestFunctions(W) # Define equation F = (2\*nu(u, T)\*inner(eps(u), eps(v))+ div(v)\*p + div(u)\*q + Ra\*T\*v[1])\*dx bcs = ... # Solve F = 0 w.r.t w solve(F == 0, w, bcs)

# FEniCS provides an expressive form language close to mathematical syntax



# FEniCS provides automated form assembly over finite element meshes and numerical linear algebra



Sounds great, but how do I find my way through the jungle?



### Three survival advices



Use the right Python tools



Explore the documentation



Ask, report and request

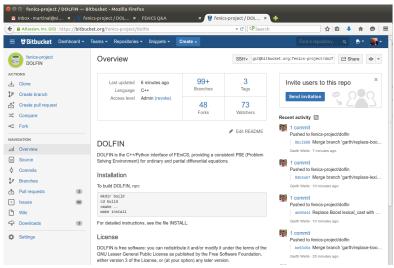


http://fenicsproject.org/documentation https://fenicsproject.org/tutorial



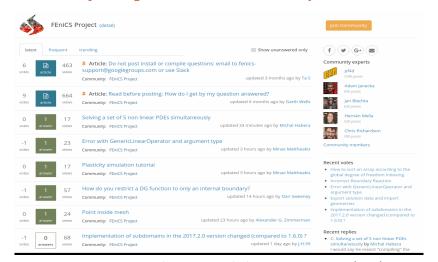
https://fenicsproject.org/olddocs/dolfin/2016.2.0/python/

# Development community is organized via bitbucket.org



http://bitbucket.org/fenics-project/

## Community help is available via QA forum



allanswered.com/community/s/fenics-project (new)

fenicsproject.org/qa (old)

### Let's get started and remember:

• Lectures can be downloaded from

```
simonfunke.com/p/fenics-course-berlin.html
```

• Data for exercises can be downloaded from

```
http://fenicsproject.org/pub/course/data
```

• Solutions for exercises can be downloaded from

```
https://github.com/funsim/hub_fenics_workshop/tree/master/solutions
```

### Installation alternatives



Docker images on Linux, Mac, Windows



PPA with apt packages for Debian and Ubuntu



™ Anaconda packages



■ Build from source

http://fenicsproject.org/download/

## The FEniCS challenge!

• Install FEniCS on your laptop!

http://fenicsproject.org/download/

- 2 Download and execute demo\_cahn-hilliard.py, try to visualize the results with Paraview.
- **3** Which elements are supported in dolfin Hint: Check documentation of dolfin.FunctionSpace?