Mathematical Interfaces of Automated Scientific Computing

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November 28, 2007 University of Kansas

Math Interfaces of Auto of Sci Comp

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The Automation of Scientific Computing

Algebraic Solvers
Functional Spaces
Equation Descriptions
Domain Representations

The Future of Scientific Computing

Acknowledgments

- L. Ridgway Scott (University of Chicago)
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Outline

Math Interfaces of Auto of Sci Comp

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- Science and Computing
 - Big Science
 - Little Science
- The Automation of Scientific Computing
 - Algebraic Solvers
 - Functional Spaces
 - Equation Descriptions
 - **Domain Representations**
- The Future of Scientific Computing

Science and Computing

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- Science and Computing
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Because experiments are expensive



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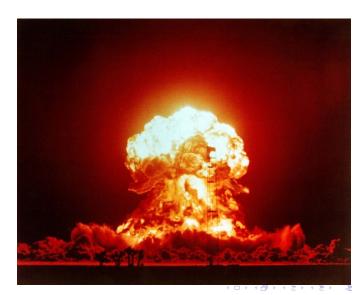
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Because experiments are dangerous



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Because experiments are not possible



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Because simulations are faster



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Because we need the data ASAP



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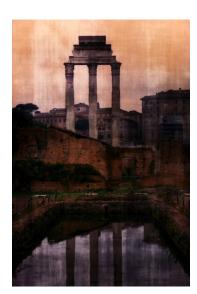
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- D'Alembert's Paradox
- Mass of Neutrino
- Rayleigh-Taylor
 Constant

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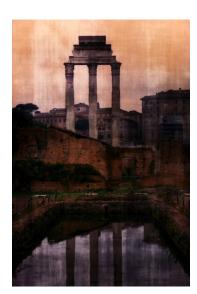
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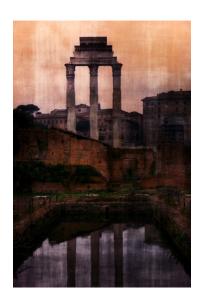
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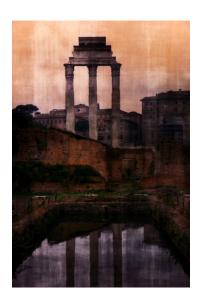
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Science and Computing

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The Future Scientific

The goal of this session is explore whether, when and why universities should do big or little science. Panelists may discuss why big science wastes money, exploits graduate students and makes research too short range. They may argue that little science produces results that are too deep and narrow, oblivious to global systems issues, not properly validated, and too out of touch with reality to ever be practical. Panelists may also find some advantages to both kinds of science.

ACM SIGARCH Computer Architecture News Volume 18, Issue 3a, June 1990

Big Science Little Science

Scientific
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- Requires large coding projects that are highly specialized
- Incredibly hard to design for maintainability, feature addition, and new hardware paradigms
- Expensive
- Resolves large open phenomena (or asks for more money)

Little Science and Rapid Development

- Usually only test on small or simple problems
- Can use (somewhat) exhaustive search of different possible methods.
- High Productivity Environment

Able to use inefficient methods.

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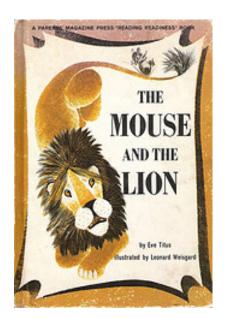
Science and Computing Big Science

Scientific Computing Algebraic Solvers Functional Spaces Equation Descriptions

The Future of Scientific

Automation becomes the Thorn

- Pervasive abstractions
- Write general code, Generate specific cod
- Fails due to bad interfaces



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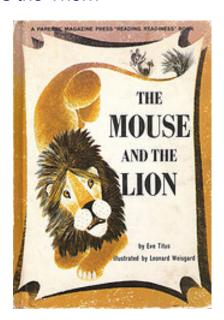
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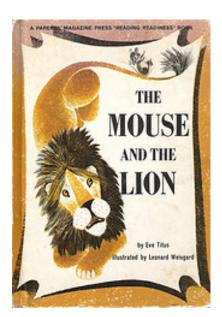
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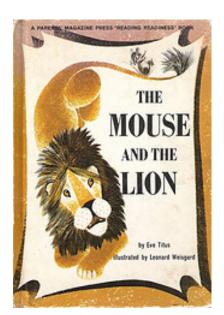
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The Productivity Factors

How much code do I have to write:

Written Code	Generated Code
ANSI C: 50 lines	Assembler: 200 lines
FFC: 10 lines	C++: 20K lines
Quantum Chemistry: 6 symbols	FORTRAN: 1M lines

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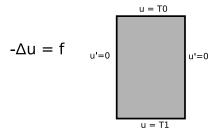
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Find u on domain Ω , given f and BC



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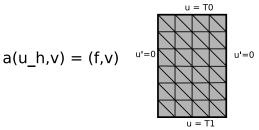
Find u on domain Ω , given f and BC, such that for all v in the function space S

$$a(u,v) = (f,v)$$
 $u'=0$ $u = T0$ $u'=0$

Functional Spaces
Equation Descriptions
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Find u_h on a triangulization of domain Ω , given f and BC, such that for all v in the function space S



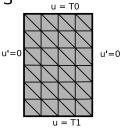
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Find u_h on a triangulization of domain Ω , given f and BC, such that for all v_h in the function space $V \subset S$

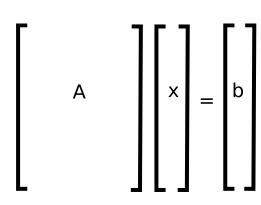
$$a(u_h,v_h) = (f,v_h)$$

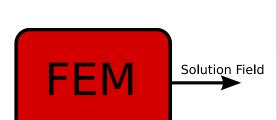




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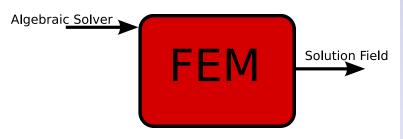
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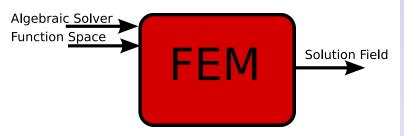
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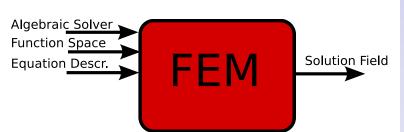
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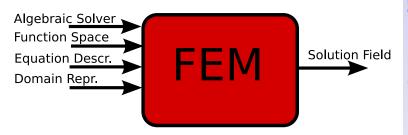
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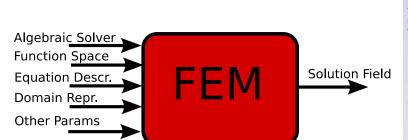
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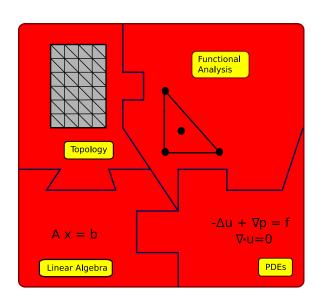
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Mathematics Necessary



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$\begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} y \\ y \end{bmatrix}$

- Model is able to capture lots of computations
- Reisz Representation Theorem

The Large Scale Success Story

- BLAS
- LAPACK
- Scalapack
- Atlas
- Flame
- Trilinos
- PETSc
- Hypre
- ... More to come (Salsa)

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Function Space Matters

Stokes Equation

- Taylor-Hood
- Crouzeix-Raviart
- Iterated Penalty

$$-\Delta \mathbf{u} + \nabla \mathbf{p} = f$$
$$\nabla \cdot \mathbf{u} = 0$$

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Function Space Matters

$$\frac{du}{dt} + u \cdot \nabla u = -\frac{\nabla \mathbf{p}}{\rho} + \nu \Delta \mathbf{u}$$

Navier-Stokes

- Stokes Solver
- Nonlinear Solver
- Time Stepping

Stokes Equation Taylor-Hood Crouzeix-Raviart Iterated Penalty

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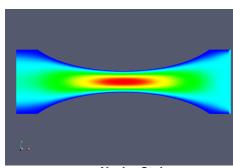
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Function Space Matters



Stokes Equation Taylor-Hood Crouzeix-Raviart Iterated Penalty Navier-Stokes Stokes Solver Nonlinear Solver Time Stepping Non-Newtonian Flow

- Oldroyd-B
- Grade 2

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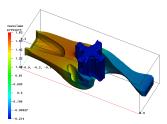
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Functional Spaces



Stokes Equation Taylor-Hood

Crouzeix-Raviart Iterated Penalty

Navier-Stokes Stokes Solver Nonlinear Solver Time Stepping

Non-Newtonian Odroyd-B Grade 2

 Couple to legacy Codes

Fluid Solid Interfaces

Free Boundary **Problems**

Success Story

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Functional Spaces

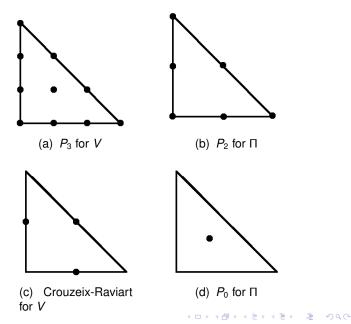
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- FIAT Algorithm [Kirby 2005]
- Syfi [Mardel et al 2007]

Stokes Function Spaces



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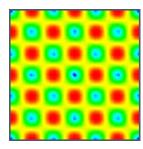
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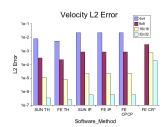
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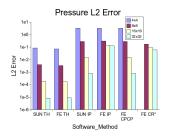
$$\mathbf{u} = \begin{bmatrix} \sin(3\pi x)\cos(3\pi y) \\ -\cos(3\pi x)\sin(3\pi y) \end{bmatrix}$$
$$p = \sin(3\pi x)\sin(3\pi y)$$

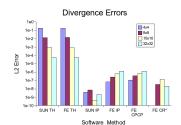


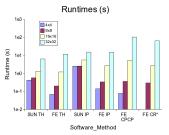
Important Numbers.

Comparison of Fourth Order









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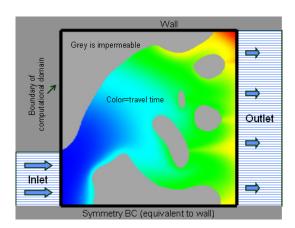
Equation Description

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Equation Descriptions

Optimization



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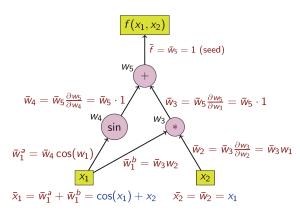
Backward propagation of derivative values

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Domain Representation

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Two Applications



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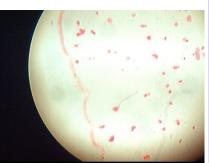
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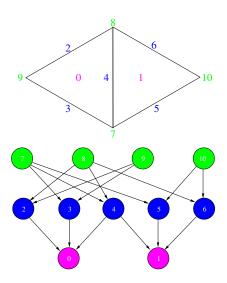
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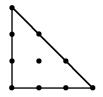
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Easy General Mesh



Simple Mesh

Points: 1,2,3

Edges: (1,2),(1,3),(2,3)

Face: (1,2,3)

Sieve Mesh

Points: 1,2,3

Edges: support(Points)

Face: support(Edges)

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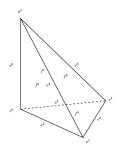
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Easy General Mesh



Simple Mesh

Points: 1,2,3,4

Edges: (1,2),(1,3),

(1,4),(2,3),(2,4),(3,4)

Face: (1,2,3),(1,2,4),

(1,3,4),(2,3,4)

Sieve Mesh

Points: 1,2,3,4

Edges: support(Points)

Faces: support(Edges)

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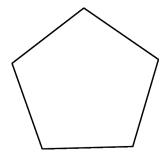
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Easy General Mesh



Sieve Mesh

Simple Mesh

Unsupported.

Points: 1,2,3,4,5

Edges: support(Points)

Faces: support(Edges)

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Automation Standard

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The Future of Scientific Computing

Already Matlab is standard. Why?

Already Matlab is standard. Why?

Because with $\$ \', the user does not have to chose between the following algorithms:

- Cholesky factorization
- QR factorization
- LU factorization
- Gaussian elimination with partial pivoting
- Least Squares fitting

Computing = Big Computing

We should not settle for less

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Questions

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