Exploiting structure in numerical libraries (PETSc)

Shrirang Abhyankar, Mark Adams (LBL), Satish Balay, **Jed Brown**, Peter Brune, Emil Constantinescu, Debojyoti Ghosh, Dmitry Karpeev, Matt Knepley (UChicago), Lois Curfman McInnes, Barry Smith, Hong Zhang

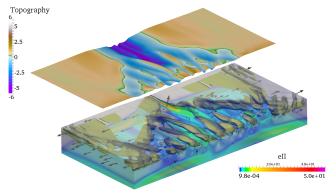
Mathematics and Computer Science Division, Argonne National Laboratory

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From natural structure to efficient algorithms

- Fluids, structures, plasma, chemistry, mesoscale materials, ...
- Conservation of mass, energy, ...
- Approximately balanced dynamics: weather systems, resonance
- Design accurate numerical methods that preserve compatibility
- Design efficient, scalable algorithms for solving associated algebraic problems



Structure is also needed for analysis of models

Optimization

- Smoothness
- Convexity
- Computability of gradients
- Data assimilation and experimental design
 - High-dimensional probability distributions

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- Sparsity of observations
- Stability analysis (bifurcations)

Make the best possible structure-exploiting methods:

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- reusable
- easy to use
- extensible
- composable

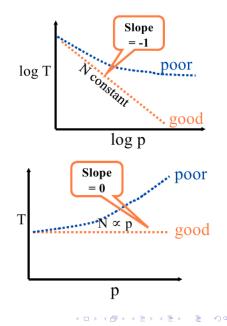
Scalability definitions

Strong scalability

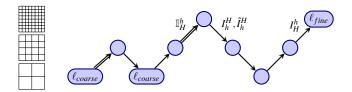
- Fixed problem size
- execution time T inversely proportional to number of processors p

Weak scalability

- Fixed problem size per processor
- execution time constant as problem size increases



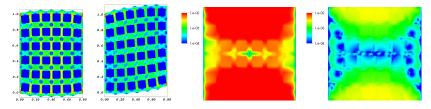
Full Multigrid(FMG)



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- start with coarse grid
- x is prolonged using \mathbb{I}_{H}^{h} on first visit to each finer level
- truncation error within one cycle
- about five work units for many problems
- highly efficient solution method

au corrections



- Plane strain elasticity, E = 1000, v = 0.4 inclusions in E = 1, v = 0.2 material, coarsen by 3².
- Solve initial problem everywhere and compute $\tau_h^H = A^H \hat{I}_h^H u^h I_h^H A^h u^h$
- Change boundary conditions and solve FAS coarse problem

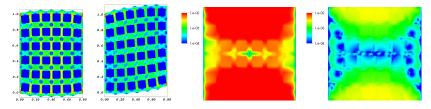
$$N^{H} \acute{u}^{H} = \underbrace{I_{h}^{H} \acute{f}^{h}}_{\acute{f}^{H}} + \underbrace{N^{H} \widehat{I_{h}^{H}} \widetilde{u}^{h} - I_{h}^{H} N^{h} \widetilde{u}^{h}}_{\tau_{h}^{H}}$$

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▶ Prolong, post-smooth, compute error $e^h = \acute{u}^h - (N^h)^{-1} \acute{f}^h$

• Coarse grid with τ is nearly $10 \times$ better accuracy

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The Great Solver Schism: Monolithic or Split?

Monolithic

- Direct solvers
- Coupled Schwarz
- Coupled Neumann-Neumann (need unassembled matrices)
- Coupled multigrid
- X Need to understand local spectral and compatibility properties of the coupled system

Split

- Physics-split Schwarz (based on relaxation)
- Physics-split Schur (based on factorization)
 - approximate commutators SIMPLE, PCD, LSC
 - segregated smoothers
 - Augmented Lagrangian
 - "parabolization" for stiff waves

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- X Need to understand global coupling strengths
- Preferred data structures depend on which method is used.
- Interplay with geometric multigrid.

Why is exploiting structure hard?

- Black box interfaces tend to exploit only one or two types of structure at a time
- Cutting-edge science often needs to exploit all available structure
- Generic data structures not well matched to evolving hardware
 - More concurrency, less memory per thread
 - Deeper memory hierarchy, heterogeneous execution
- Nonlinearity and coupling with other physical models can change the available structure
- Assumptions break down between model problems and production
- Assumptions fall through the cracks
 - E.g., model nonlinearity breaks assumption of Gaussian probability distribution
 - Switching to more "robust" method makes problem intractable

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 Applications seek to satisfy disparate user groups, make assumptions invalid in other contexts