The Process of Computational Science

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My approach to Computational Science is

Holistic

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CompSci

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CompSci

starting with the numerics of PDEs, and mathematics of the computation,

through the distillation into high quality numerical libraries,

to scientific discovery through computing.

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Community Involvement



Outline

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Collaborators

BIBEE Researchers



Classical DFT Researchers



Dirk Gillespie



Bob Eisenberg

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Bioelectrostatics

The Natural World



Bioelectrostatics

Physical Model



Bioelectrostatics

$$\sigma(\vec{r}) + \hat{\epsilon} \int_{\Gamma} \frac{\partial}{\partial n(\vec{r})} \frac{\sigma(\vec{r}') d^2 \vec{r}'}{4\pi ||\vec{r} - \vec{r}'||} = -\hat{\epsilon} \sum_{k=1}^{Q} \frac{\partial}{\partial n(\vec{r})} \frac{q_k}{4\pi ||\vec{r} - \vec{r}_k||}$$
(1)
$$(\mathcal{I} + \hat{\epsilon} \mathcal{D}^*) \sigma(\vec{r}) =$$
(2)

where we define

$$\hat{\epsilon} = \frac{1}{2} \frac{\epsilon_1 - \epsilon_2}{\epsilon_1 + \epsilon_2} < 0$$

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Bioelectrostatics Mathematical Model

The reaction potential is given by

$$\phi^{\mathsf{R}}(\vec{r}) = \int_{\Gamma} \frac{\sigma(\vec{r}') d^2 \vec{r}'}{4\pi\epsilon_1 ||\vec{r} - \vec{r}'||}$$

which defines the electrostatic part of the solvation free energy

$$\Delta G_{es} = \frac{1}{2} q^T \phi^R$$
$$= \frac{1}{2} q^T L q$$
$$= \frac{1}{2} q^T C A^{-1} B d$$

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Boundary element discretizations of the solvation problem (Eq. 1):

- can be expensive to solve, and hard to precondition
- are more accurate than required by intermediate design iterations

BIBEE Approximate \mathcal{D}^* by a diagonal operator

Boundary Integral-Based Electrostatics Estimation

Coulomb Field Approximation: uniform normal field

$$\left(1 - \frac{\hat{\epsilon}}{2}\right)\sigma_{CFA} = Bq \tag{3}$$

Preconditioning: consider only local effects

$$\sigma_P = Bq \tag{4}$$

Lower Bound: no good physical motivation

$$\left(1+\frac{\hat{\epsilon}}{2}\right)\sigma_{LB} = Bq \tag{5}$$

Operator Approximation

Energy Bounds: First Step Replace *C* with *B*

We will need the single layer operator \mathcal{S}

$$\mathcal{S} au(ec{r}) = \int rac{ au(ec{r}') d^2 ec{r}'}{4\pi ||ec{r}-ec{r}'||}$$

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Energy Bounds: First Step Replace *C* with *B*

The potential at the boundary Γ given by

$$\phi^{\textit{Coulomb}}(\vec{r}) = C^T q$$

can also be obtained by solving an exterior Neumann problem for τ ,

$$\phi^{Coulomb}(\vec{r}) = S\tau$$

= $S(\mathcal{I} - 2\mathcal{D}^*)^{-1}(\frac{2}{\hat{\epsilon}}Bq)$
= $\frac{2}{\hat{\epsilon}}S(\mathcal{I} - 2\mathcal{D}^*)^{-1}Bq$

so that the solvation energy is given by

$$\frac{1}{2}q^{T}CA^{-1}Bq = \frac{1}{\hat{\epsilon}}q^{T}B^{T}(\mathcal{I} - 2\mathcal{D}^{*})^{-T}\mathcal{S}(\mathcal{I} + \hat{\epsilon}\mathcal{D}^{*})^{-1}Bq$$

Operator Approximation

Energy Bounds: Second Step Quasi-Hermiticity

It is well known that (Hsaio and Wendland)

$$\mathcal{SD}^*=\mathcal{DS}$$

and

$$\mathcal{S}=\mathcal{S}^{1/2}\mathcal{S}^{1/2}$$

which means that we can define a Hermitian operator H similar to \mathcal{D}^*

$$H = \mathcal{S}^{1/2} \mathcal{D}^* \mathcal{S}^{-1/2}$$

leading to an energy

$$\frac{1}{2}q^{T}CA^{-1}Bq = \frac{1}{\hat{\epsilon}}q^{T}B^{T}\mathcal{S}^{1/2}(\mathcal{I}-2H)^{-1}(\mathcal{I}+\hat{\epsilon}H)^{-1}\mathcal{S}^{1/2}Bq$$

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Energy Bounds: Third Step Eigendecomposition

The spectrum of \mathcal{D}^* is in $\left[-\frac{1}{2}, \frac{1}{2}\right]$, and the energy is

$$\frac{1}{2}q^{T}CA^{-1}Bq = \sum_{i}\frac{1}{\hat{\epsilon}}\left(1-2\lambda_{i}\right)^{-1}\left(1+\hat{\epsilon}\lambda_{i}\right)^{-1}x_{i}^{2}$$

where

$$H = V \Lambda V^T$$

and

 $\vec{x} = V^T \mathcal{S}^{1/2} B q$

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Energy Bounds: Diagonal Approximations

The BIBEE approximations yield the following bounds

$$\frac{1}{2}q^{T}CA_{CFA}^{-1}Bq = \sum_{i} \frac{1}{\hat{\epsilon}} (1-2\lambda_{i})^{-1} \left(1-\frac{\hat{\epsilon}}{2}\right)^{-1} x_{i}^{2}$$
(6)
$$\frac{1}{2}q^{T}CA_{P}^{-1}Bq = \sum_{i} \frac{1}{\hat{\epsilon}} (1-2\lambda_{i})^{-1} x_{i}^{2}$$
(7)
$$\frac{1}{2}q^{T}CA_{LB}^{-1}Bq = \sum_{i} \frac{1}{\hat{\epsilon}} (1-2\lambda_{i})^{-1} \left(1+\frac{\hat{\epsilon}}{2}\right)^{-1} x_{i}^{2}$$
(8)

where we note that

$$|\hat{\epsilon}| < \frac{1}{2}$$

Operator Approximation

Energy Bounds: Diagonal Approximations

Electrostatic solvation free energies of met-enkephalin structures



Snapshots taken from a 500-ps MD simulation at 10-ps intervals.

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Operator Approximation

BIBEE Scalabiltiy



Boundary element discretizations of the solvation problem:

- can be expensive to solve, and hard to precondition
 - Bounding the electrostatic free energies associated with linear continuum models of molecular solvation, JCP, 2009
 - BIBEE-FMM (uses kifmm3d)
- are more accurate than required by intermediate design iterations
 - Accuracy is not tunable

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Evolution of BIBEE

- Sharp bounds for solvation energy
- Exploration of behavior in simplified geometries
 - Mathematical Analysis of the BIBEE Approximation for Molecular Solvation: Exact Results for Spherical Inclusions, JCP, 2011
 - Represent BIBEE as a deformed boundary condition
 - Fully developed series solution
 - Improve accuracy by combining CFA and P approximations
- Application to protein-ligand binding
 - Analysis of fast boundary-integral approximations for modeling electrostatic contributions of molecular binding, Molecular-Based Mathematical Biology, 2013

Future of **BIBEE**

- Framework for systematic exploration
 - Both analytical and computational foundation
- Reduced-basis Method with analytic solutions
 - Tested in protein binding paper above
 - The spatial high frequency part is handled by BIBEE/P topology is not important
 - The spatial low frequency part is handled by analytic solutions insensitive to bumpiness
 - Computational science and re-discovery: open-source implementations of ellipsoidal harmonics for problems in potential theory, CSD, 2012.
- Extend to other kernels, e.g. Yukawa
- Extend to full multilevel method

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Outline

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Collaborators

PETSc Developers





Barry Smith



Jed Brown



Andy Terrel



Peter Brune

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Problem

Traditional PDE codes cannot:

Compare different discretizations

- Different orders, finite elements
- finite volume vs. finite element

• Compare different mesh types

- Simplicial, hexahedral, polyhedral, octree
- Run 1D, 2D, and 3D problems

Enable an optimal solver

• Fields, auxiliary operators

Problem

Traditional Mesh/Solver Interface is Too General:

- Solver not told about discretization data, e.g. fields
- Cannot take advantage of problem structure
 - blocking
 - saddle point structure
- Cannot use auxiliary data
 - Eigen-estimates
 - null spaces

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Problem

Traditional Mesh/Solver Interface is Too Specific:

- Assembly code specialized to each discretization
 - dimension
 - cell shape
 - approximation space
- Explicit references to element type
 - getVertices(faceID), getAdjacency(edgeID, VERTEX), getAdjacency(edgeID, dim = 0)
- No interface for transitive closure
 - Awkward nested loops to handle different dimensions

Mesh Representation

We represent each mesh as a Hasse Diagram:

- Can represent any CW complex
- Can be implemented as a Directed Acyclic Graph
- Reduces mesh information to a single *covering* relation
- Can discover dimension, since meshes are ranked posets

We use an abstract topological interface to organize traversals for:

- discretization integrals
- solver size determination
- computing communication patterns

Mesh geometry is treated as just another mesh function.

Sample Meshes



Sample Meshes Optimized triangular mesh



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Sample Meshes Interpolated quadrilateral mesh



Sample Meshes Optimized quadrilateral mesh



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Sample Meshes Interpolated tetrahedral mesh


Mesh Abstraction

By abstracting on the key topological relations, the interface can be both concise and quite general

- Single relation
- Enables dimension-independent programming
- Dual is obtained by reversing arrows
- Can associate function(al)s with DAG points
- Dual operation gives the support of the function

Mesh Algorithms for PDE with Sieve I: Mesh Distribution, Knepley, Karpeev, Sci. Prog., 2009.

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Basic Operations Support



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I developed a single residual evaluation routine independent of spatial dimension, cell geometry, and finite element:



Discretizations Lagrange FEM H(div) FEM* H(curl) FEM* DG FEM *[‡]

- [†] Peter Brune, ANL
- * FEniCS Project
- [‡] Blaise Bourdin, LSU

We have also implemented a polyhedral FVM.

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$$F(\mathbf{u}) = 0$$

DimCell Types1Simplex2Tensor Product3Polyhedral6[†]Prism

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- [†] Peter Brune, ANL
- * FEniCS Project
- [‡] Blaise Bourdin, LSU

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$$F({\bf u}) = 0$$

Dim	Cell Types	
1	Simplex	
2	Tensor Product	
3	Polyhedral	
6†	Prism	

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FEM Integration Model

Proposed by Jed Brown

We consider weak forms dependent only on fields and gradients,

$$\int_{\Omega} \phi \cdot f_0(u, \nabla u) + \nabla \phi : \vec{f}_1(u, \nabla u) = 0.$$
(9)

Discretizing we have

$$\sum_{e} \mathcal{E}_{e}^{T} \left[B^{T} W^{q} f_{0}(u^{q}, \nabla u^{q}) + \sum_{k} D_{k}^{T} W^{q} \vec{f}_{1}^{k}(u^{q}, \nabla u^{q}) \right] = 0 \qquad (10)$$

- *f_n* pointwise physics functions
- *u^q* field at a quad point
- W^q diagonal matrix of quad weights
- *B,D* basis function matrices which reduce over quad points
- *E* assembly operator

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```
DMPlexComputeResidualFEM(dm, X, F, user)
{
    VecSet(F, 0.0);
    <Put boundary conditions into local input vector>
    <Extract coefficients and geometry for batch>
    <Integrate batch of elements>
    <Insert batch of element vectors into local vector>
    <Local to Global addition>
}
```

Batch Integration Set boundary conditions

```
DMPlexComputeResidualFEM(dm, X, F, user)
{
    VecSet(F, 0.0);
    DMPlexProjectFunctionLocal(dm, numComponents,
        bcFuncs, INSERT_BC_VALUES, X);
    <Extract coefficients and geometry for batch>
        <Integrate batch of elements>
        <Integrate batch of elements>
        <Insert batch of element vectors into local vector>
        <Local to Global addition>
```

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Batch Integration Extract coefficients and geometry

```
DMPlexComputeResidualFEM(dm, X, F, user)
{
 VecSet(F, 0.0);
  <Put boundary conditions into local input vector>
  DMPlexGetHeightStratum(dm, 0, &cStart, &cEnd);
  for (c = cStart; c < cEnd; ++c) {
    DMPlexComputeCellGeometry(dm, c, &v0[c*dim],
      &J[c*dim*dim], &invJ[c*dim*dim], &detJ[c]);
    DMPlexVecGetClosure(dm, NULL, X, c, NULL, &x);
    for (i = 0; i < cellDof; ++i) u[c*cellDof+i] = x[i];</pre>
    DMPlexVecRestoreClosure(dm, NULL, X, c, NULL, &x);
  <Integrate batch of elements>
  <Insert batch of element vectors into local vector>
  <Local to Global addition>
```

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```
DMPlexComputeResidualFEM(dm, X, F, user)
{
 VecSet(F, 0.0);
  <Put boundary conditions into local input vector>
  <Extract coefficients and geometry for batch>
  for (field = 0; field < numFields; ++field) {</pre>
    (*mesh->integrateResidualFEM) (Ne, numFields, field,
      quad, u,
      v0, J, invJ, detJ,
      f0, f1, elemVec);
    (*mesh->integrateResidualFEM) (Nr, ...);
  }
  <Insert batch of element vectors into local vector>
  <Local to Global addition>
```

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Insert element vectors

```
DMPlexComputeResidualFEM(dm, X, F, user)
{
    VecSet(F, 0.0);
    <Put boundary conditions into local input vector>
    <Extract coefficients and geometry for batch>
    <Integrate batch of elements>
    for (c = cStart; c < cEnd; ++c) {
        DMPlexVecSetClosure(dm, NULL, F, c,
            &elemVec[c*cellDof], ADD_VALUES);
    }
    <Local to Global addition>
```

```
DMPlexComputeResidualFEM(dm, X, F, user)
{
 VecSet(F, 0.0);
  <Put boundary conditions into local input vector>
  <Extract coefficients and geometry for batch>
  <Integrate batch of elements>
  <Insert batch of element vectors into local vector>
  <Local to Global addition>
  /* Also applies constraint matrix $I^u_c$ */
  DMLocalToGlobalBegin(dm, F, ADD_VALUES, qF);
  DMLocalToGlobalEnd(dm, F, ADD VALUES, gF);
}
```

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```
FEMIntegrateResidualBatch(...)
{
  <Loop over batch of elements (e)>
    <Loop over quadrature points (q)>
      for (d = 0; d < \dim; ++d) {
        x[d] = v0[d];
        for (d2 = 0; d2 < dim; ++d2) {
          x[d] += J[d*dim+d2]*(quadPoints[q*dim+d2]+1);
      <Make u_q and gradU_q>
      <Call f_0 and f_1>
    <Loop over element vector entries (f, fc)>
      <Add contributions from f_0 and f_1>
```

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Calculate u_q and ∇u_q

```
FEMIntegrateResidualBatch(...)
  <Loop over batch of elements (e)>
    <Loop over quadrature points (q)>
      <Make x_q>
      for (f = 0; f < numFields; ++f) {</pre>
        for (b = 0; b < Nb; ++b) {
          for (comp = 0; comp < Ncomp; ++comp) {</pre>
            u[comp] += coefficients[cidx] *basis[q+cidx];
             for (d = 0; d < \dim; ++d) {
              <Transform derivative to real space>
              gradU[comp*dim+d] +=
                coefficients[cidx] *realSpaceDer[d];
      <Call f_0 and f_1>
    <Loop over element vector entries (f, fc)>
                                                             ъ
```

Calculate u_q and ∇u_q

```
FEMIntegrateResidualBatch(...)
           <Loop over batch of elements (e)>
                      <Loop over quadrature points (q)>
                                 <Make x_q>
                                   for (f = 0; f < numFields; ++f) {</pre>
                                              for (b = 0; b < Nb; ++b) {
                                                         for (comp = 0; comp < Ncomp; ++comp) {</pre>
                                                                   u[comp] += coefficients[cidx] *basis[q+cidx];
                                                                     for (d = 0; d < \dim; ++d) {
                                                                              realSpaceDer[d] = 0.0;
                                                                                for (q = 0; q < \dim; ++q) {
                                                                                         realSpaceDer[d] +=
                                                                                                    invJ[q*dim+d]*basisDer[(q+cidx)*dim+q];
                                                                              gradU[comp*dim+d] +=
                                                                                         coefficients[cidx] *realSpaceDer[d];
                                                                                                                                                                                                                                           < 口 > < 同 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < 回 > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ > < □ >
```

```
FEMIntegrateResidualBatch(...)
  <Loop over batch of elements (e)>
    <Loop over quadrature points (q)>
      <Make x g>
      <Make u_q and gradU_q>
      f0_func(u, gradU, x, &f0[g*Ncomp]);
      for (i = 0; i < Ncomp; ++i) {
        f0[q*Ncomp+i] *= detJ*quadWeights[q];
      f1_func(u, gradU, x, &f1[q*Ncomp*dim]);
      for (i = 0; i < Ncomp*dim; ++i) {</pre>
        f1[q*Ncomp*dim+i] *= detJ*quadWeights[q];
    <Loop over element vector entries (f, fc)>
      <Add contributions from f_0 and f_1>
```

Update element vector

```
FEMIntegrateResidualBatch(...)
  <Loop over batch of elements (e)>
    <Loop over quadrature points (q)>
      <Make x g>
      <Make u_q and gradU_q>
      <Call f_0 and f_1>
    <Loop over element vector entries (f, fc)>
      for (q = 0; q < Nq; ++q) {
        elemVec[cidx] += basis[q+cidx]*f0[q+comp];
        for (d = 0; d < \dim; ++d) {
          <Transform derivative to real space>
          elemVec[cidx] +=
            realSpaceDer[d] * f1[(q+comp) * dim+d];
```

GPU Integration

Porting to the GPU meant chanç only the element integration func

- Has the same flexibility as CPU versic
- Multiple threads execute each cell interest
- Achieves 100 GF/s for 2D P₁ Laplacian
- Code is available here
- Finite Element Integration on GPUs, TOMS, 2013
- Finite Element Integration with Quadrature on the GPU, PLC, 2013



ex62: P₂/P₁ Stokes Problem on Unstructured Mesh

Full Schur Complement

-ksp_type fgmres -pc_type fieldsplit -pc_fieldsplit_type schur -pc_fieldsplit_schur_factorization_type full -fieldsplit_velocity_ksp_type gmres -fieldsplit_velocity_pc_type lu -fieldsplit_pressure_ksp_rtol 1e-10 -fieldsplit_pressure_pc_type jacobi

$$\begin{pmatrix} I & 0 \\ B^T A^{-1} & I \end{pmatrix} \begin{pmatrix} \hat{A} & 0 \\ 0 & \hat{S} \end{pmatrix} \begin{pmatrix} I & A^{-1} B \\ 0 & I \end{pmatrix}$$

ex62: P2/P1 Stokes Problem on Unstructured Mesh

SIMPLE

```
-ksp_type fgmres -pc_type fieldsplit -pc_fieldsplit_type schur
-pc_fieldsplit_schur_factorization_type full
-fieldsplit_velocity_ksp_type gmres -fieldsplit_velocity_pc_type lu
-fieldsplit_pressure_ksp_rtol 1e-10 -fieldsplit_pressure_pc_type jacobi
-fieldsplit_pressure_inner_ksp_type preonly
-fieldsplit_pressure_inner_pc_type jacobi
-fieldsplit_pressure_upper_ksp_type preonly
-fieldsplit_pressure_upper_ksp_type jacobi
```

$$\begin{pmatrix} I & 0 \\ B^T D_A^{-1} & I \end{pmatrix} \begin{pmatrix} \hat{A} & 0 \\ 0 & \hat{S} \end{pmatrix} \begin{pmatrix} I & D_A^{-1} B \\ 0 & I \end{pmatrix}$$

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ex31: P_2/P_1 Stokes Problem with Temperature on Unstructured Mesh Additive Schwarz + Full Schur Complement

$$\begin{pmatrix} I & 0 \\ B^{T}A^{-1} & I \end{pmatrix} \begin{pmatrix} A & 0 \\ 0 & S \end{pmatrix} \begin{pmatrix} I & A^{-1}B \\ 0 & I \end{pmatrix} & 0 \\ 0 & & L_{T} \end{pmatrix}$$

ex31: P_2/P_1 Stokes Problem with Temperature on Unstructured Mesh

Least-Squares Commutator + Upper Schur Comp. + Full Schur Comp.

-ksp_type fgmres -pc_type fieldsplit -pc_fieldsplit_0_fields 0,1
-pc_fieldsplit_1_fields 2 -pc_fieldsplit_type schur
-pc_fieldsplit_o_ksp_type fgmres -fieldsplit_0_pc_type fieldsplit
-fieldsplit_0_pc_fieldsplit_type schur
-fieldsplit_0_pc_fieldsplit_schur_factorization_type full
-fieldsplit_0_fieldsplit_velocity_ksp_type preonly
-fieldsplit_0_fieldsplit_velocity_pc_type lu
-fieldsplit_0_fieldsplit_pressure_ksp_rtol le-10
-fieldsplit_0_fieldsplit_pressure_pc_type jacobi
-fieldsplit_temperature_ksp_type gmres
-fieldsplit_temperature_pc_type lsc

$$\begin{pmatrix} \begin{pmatrix} I & 0 \\ B^T A^{-1} & I \end{pmatrix} \begin{pmatrix} \hat{A} & 0 \\ 0 & \hat{S} \end{pmatrix} \begin{pmatrix} I & A^{-1} B \\ 0 & I \end{pmatrix} \begin{pmatrix} \hat{S}_{LSC} \end{pmatrix}$$

- Cannot compare different discretizations
 - Automated FEM Discretizations for the Stokes Equation, BIT, 2008
 - Efficient Assembly of H(div) and H(curl) Conforming Finite Elements, SISC, 2009
- Compare different mesh types
 - A Domain Decomposition Approach to Implementing Fault Slip in Finite-Element Models of Quasi-static and Dynamic Crustal Deformation, JGR, 2013
- Run 1D, 2D, and 3D problems
 - Ibid.
- Enabling an optimal solver without programming
 - Ibid.
 - Composable linear solvers for multiphysics, IPDPS, 2012
 - On the rise of strongly tilted mantle plume tails, PEPI, 2011

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Future Work

Unify FEM and FVM residual evaulation

- Batched integration on accelerators
- Integrate auxiliary fields
- Incorporate cell problems for coefficients

Applications

Outline

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PyLith

PyLith is an open source, parallel simulator for crustal deformation problems developed by myself, Brad Aagaard, and Charles Williams. PvLith employs a finite element discretization on unstructured meshes and is built on the PETSc libraries from ANL.



Brad Aagaard



Charles Williams

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PyLith

Multiple problems

- Dynamic rupture
- Quasi-static relaxation

Multiple models

- Fault constitutive models
- Nonlinear visco-elastic-plastic
- Finite deformation

Multiple Meshes

- 1D, 2D, 3D
- Hex and tet meshes

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PyLith

Multiple problems

• Dynamic rupture

Quasi-static relaxation

Multiple models

- Fault consti
- Nonlinear v
- Finite defori

Multiple Meshe

- 1D, 2D, 3D
 - Hex and tet

