Scalable Domain Decomposition Preconditioners in FreeFem++ F. Hecht, F. Nataf, P. Jolivet Laboratoire Jacques-Louis Lions Université Pierre et Marie Curie Projet Alpines, INRIA Rocquercourt.

http://www.freefem.org/ff++

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Main characteristics I/II

- Wide range of finite elements : continuous P1,P2 elements, discontinuous P0, P1, RT0,RT1,BDM1, elements ,Edge element, vectorial element, mini-element, ...
- Automatic interpolation of data from a mesh to an other one (with matrix construction if need), so a finite element function is view as a function of (x, y, z) or as an array.
- LU, Cholesky, Crout, CG, GMRES, UMFPack, SuperLU, MUMPS, HIPS, SUPERLU_DIST, PASTIX. ... sparse linear solver; eigenvalue and eigenvector computation with ARPACK.

Main characteristics

• Automatic mesh generator, based on the Delaunay-Voronoï algorithm. (2d,3d (tetgen))

II/II (2D)(3D)

- Mesh adaptation based on metric, possibly anisotropic (only in 2d), with optional automatic computation of the metric from the Hessian of a solution. (2d,3d).
- Dynamic linking to add plugin.
- Full MPI interface
- Nonlinear Optimisation tools : CG, Ipopt, NLOpt, stochastic
- Wide range of examples : Navier-Stokes 3d, elasticity 3d, fluid structure, eigenvalue problem, Schwarz' domain decomposition algorithm, residual error indicator ...

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Poisson equation, weak form

Let a domain Ω with a partition of $\partial \Omega$ in Γ_2, Γ_e . Find u a solution in such that :

$$-\Delta u = 1 \text{ in } \Omega, \quad u = 2 \text{ on } \Gamma_2, \quad \frac{\partial u}{\partial \vec{n}} = 0 \text{ on } \Gamma_e$$
 (1)

Denote $V_g = \{v \in H^1(\Omega)/v_{|\Gamma_2} = g\}$. The Basic variational formulation with is : find $u \in V_2(\Omega)$, such that

$$\int_{\Omega} \nabla u \cdot \nabla v = \int_{\Omega} 1v + \int_{\Gamma} \frac{\partial u}{\partial n} v, \quad \forall v \in V_0(\Omega)$$
(2)

The finite element method is just : replace V_g with a finite element space, and the FreeFem++ code :

Poission equation in FreeFem++

The finite element method is just : replace V_g with a finite element space, and the FreeFem++ code :

```
mesh3 Th("fish3d.msh"); // read a mesh 3d
fespace Vh(Th,P1); // define the P1 EF space
```

Vh u,v; // set test and unknow FE function in Vh. macro Grad(u) [dx(u),dy(u),dz(u)] // EOM Grad def solve laplace(u,v,solver=CG) = int3d(Th)(Grad(u)'*Grad(v)) - int3d(Th) (1*v) + on(2,u=2); // int on γ_2 plot(u,fill=1,wait=1,value=0,wait=1);

Run:fish.edp Run:fish3d.edp

Bose Einstein Condensate

Just a direct use of Ipopt interface (2day of works) The problem is find a complex field u on domain D such that :

$$u = \operatorname*{argmin}_{||u||=1} \int_{\mathcal{D}} \frac{1}{2} |\nabla u|^2 + V_{trap} |u|^2 + \frac{g}{2} |u|^4 - \Omega i \overline{u} \left(\begin{pmatrix} -y \\ x \end{pmatrix} \cdot \nabla \right) u$$

to code that in FreeFem++

use

- lpopt interface (https://projects.coin-or.org/Ipopt)
- Adaptation de maillage
- Analyse of the result

Run:BEC.edp

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A first way to break complexity

Idea :

$$a(u,v) = \int_{\Omega} \nabla u. \nabla v$$

take an equi-partition of Ω in Ω_i for i=0 to N_p-1 the number of processor.

then

$$a(u,v) = \sum_{i=0}^{N_p-1} \int_{\Omega_i} \nabla u . \nabla v$$

A first way to break complexity

Build matrix in parallel by assembling par region, remark the change function you modify the region numbering, to defined Ω_i.
 real c = mpisize/real(Th.nt);
 Th=change(Th,fregion= min(mpisize-1,int(nuTriangle*c)));

Solve the linear using a good parallel solver (MUMPS)
load "MUMPS"
set(A,solver=sparsesolver,master=-1); // Distributed A.
uh[] = A^-1*b; // resolution

Run:Heat3d.edp

Run:NSCaraCyl-100-mpi2.edp

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To solve the following Poisson problem on domain Ω with boundary Γ in $L^2(\Omega)$:

 $-\Delta u = f$, in Ω , and u = g on Γ ,

where $f \in L^2(\Omega)$ and $g \in H^{\frac{1}{2}}(\Gamma)$ are two given functions. Let introduce $(\pi_i)_{i=1,..,N_p}$ a positive regular partition of the unity of Ω , q-e-d :

$$\pi_i \in \mathcal{C}^0(\Omega): \quad \pi_i \ge 0 \text{ and } \sum_{i=1}^{N_p} \pi_i = 1.$$

Denote Ω_i the sub domain which is the support of π_i function and also denote Γ_i the boundary of Ω_i , and $\Omega_i^\circ = \{x/0 < \pi_i < 1\}$ The parallel Schwarz method is Let $\ell = 0$ the iterator and a initial guest u^0 respecting the boundary condition (i.e. $u_{\Gamma}^0 = g$).

$$\forall i = 1.., N_p: \quad -\Delta u_i^{\ell} = f, \text{ in } \Omega_i, \quad \text{ and } u_i^{\ell} = u^{\ell} \text{ on } \Gamma_i$$

$$u^{\ell+1} = \sum_{i=1}^{N_p} \pi_i u_i^{\ell}$$

$$(4)$$

Some Remark

We never use finite element space associated to the full domain Ω because it to expensive.

We have to defined to operator to build the previous algorithm : We denote $u_{h|i}^{\ell}$ the restriction of u_{h}^{ℓ} on V_{hi} , so the discrete problem on Ω_{i} of problem (3) is find $u_{hi}^{\ell} \in V_{hi}$ such that :

$$\forall v_{h_i} \in V_{0i} : \int_{\Omega_i} \nabla v_{h_i} \cdot \nabla u_{h_i}^\ell = \int_{\Omega_i} f v_{h_i},$$

 $\forall k \in \mathcal{N}_{hi}^{\Gamma_i} : \sigma_i^k(u_{hi}^\ell) = \sigma_i^k(u_{h|i}^\ell)$

where g_i^k is the value of g associated to the degree of freedom $k \in \mathcal{N}_{hi}^{\Gamma_i}$.

Transfer Part

To compute $v_i = \pi_i u_i + \sum_{j \in J_i} \pi_j u_j$ and can be write the freefem++ function Update with asynchronous send/recv.

```
func bool Update(real[int] &ui, real[int] &vi)
{ int n= jpart.n;
  for(int j=0;j<njpart;++j) Usend[j][]=sMj[j]*ui;</pre>
  mpiRequest[int] rq(n*2);
  for (int j=0;j<n;++j)</pre>
         Irecv(processor(jpart[j],comm,rq[j ]), Ri[j][]);
  for (int j=0; j<n;++j)</pre>
         Isend(processor(jpart[j],comm,rq[j+n]), Si[j][]);
  for (int j=0; j<n*2;++j) int k= mpiWaitAny(rq);</pre>
  vi = Pii*ui:
                                             // set to \pi_i u_i
  // apply the unity local partition .
   for(int j=0;j<njpart;++j)</pre>
     vi += rMj[j]*Vrecv[j][];
                                                // add \pi_i u_i
 return true; }
```

parallel GMRES

Finally you can easily accelerate the fixe point algorithm by using a parallel GMRES algorithm after the introduction the following affine S_i operator sub domain Ω_i .

Where the parallel MPIGMRES or MPICG algorithm is to solve $A_i x_i = b_i, i = 1, .., N_p$ by just changing the dot product by reduce the local dot product of all process with the following MPI code :

A simple coarse grid is we solve the problem on the coarse grid :

```
{
    if(AC.n==0 && mpiRank(comm)==0) // first time build
    AC = vPbC(VhC,VhC,solver=sparsesolver);
    real[int] Uc(Rci.n),Bc(Uc.n);
    Uc= Rci*U; // Fine to Coarse
    mpiReduce(Uc,Bc,processor(0,comm),mpiSUM);
    if(mpiRank(comm)==0)
        Uc = AC^-1*Bc; // solve of proc 0
        broadcast(processor(0,comm),Uc);
    V = Pci*Uc; // Coarse to Fine
}
```

Limitation : if the initial problem, data have oscillation, you must an other on coarse problem : The GENO algorithm for example form the Nataf and co., See section 5.

So we finally we get 4 algorithms

- **()** The basic schwarz algorithm $u^{\ell+1} = S(u^{\ell})$, where S is one iteration of schwarz process.
- 2 Use the GMRES to find u solution of the linear system Su u = 0.
- 3 Use the GMRES to solve parallel problem $A_i u_i = b_i$, $i = 1, ..., N_p$, with RAS precondicionneur
- Use the method with two level precondicionneur RAS and Coarse.

On the SGI UV 100 of the lab :



A Parallel Numerical experiment on laptop

We consider first example in an academic situation to solve Poisson Problem on the cube $\Omega=]0,1[^3$

 $-\Delta u = 1, \text{ in } \Omega; \qquad u = 0, \text{ on } \partial \Omega.$ (5)

With a cartesian meshes \mathcal{T}_{hn} of Ω with $6n^3$ tetrahedron, the coarse mesh is \mathcal{T}_{hm}^* , and m is a divisor of n. We do the validation of the algorithm on a Laptop Intel Core i7 with 4 core at 1.8 Ghz with 4Go of RAM DDR3 at 1067 Mhz,

Run:DDM-Schwarz-Lap-2dd.edp Run:DDM-Schwarz-Lame-2d.edp Run:DDM-Schwarz-Lame-3d.edp

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Motivation

Large discretized system of PDEs strongly heterogeneous coefficients (high contrast, nonlinear, multiscale)

E.g. Darcy pressure equation, P_1 -finite elements :

$$A\mathbf{U}=\mathbf{F}$$

 $\operatorname{cond}(A) \sim rac{lpha_{\max}}{lpha_{\min}} h^{-2}$

Goal : iterative solvers robust in size and heterogeneities Applications : flow in heterogeneous / stochastic / layered media structural mechanics electromagnetics etc





Adding a coarse space

We add a coarse space correction (*aka* second level) Let V_H be the coarse space and Z be a basis, $V_H = \operatorname{span} Z$, writing $R_0 = Z^T$ we define the two level preconditioner as :

$$M_{ASM,2}^{-1} := R_0^T (R_0 A R_0^T)^{-1} R_0 + \sum_{i=1}^N R_i^T A_i^{-1} R_i.$$

The Nicolaides approach is to use the kernel of the operator as a coarse space, this is the constant vectors, in local form this writes :

$$Z := (R_i^T D_i R_i \mathbf{1})_{1 \le i \le N}$$

where D_i are chosen so that we have a partition of unity :

$$\sum_{i=1}^{N} R_i^T D_i R_i = Id.$$

Theorem (Widlund, Dryija)

Let $M_{ASM,2}^{-1}$ be the two-level additive Schwarz method :

$$\kappa(M_{ASM,2}^{-1}A) \le C\left(1 + \frac{H}{\delta}\right)$$

where δ is the size of the overlap between the subdomains and H the subdomain size.

Number of subdomains 8 16 32 64 ASM 18 35 66 128	This does indeed work very well						
ASM 18 35 66 128		Number of subdomains	8	16	32	64	
		ASM	18	35	66	128	
ASIVI + INICOIAIDES 20 21 28 21		ASM + Nicolaides	20	27	28	27	

Failure for Darcy equation with heterogeneities



Jump	1	10	10^{2}	10^{3}	10^{4}
ASM	39	45	60	72	73
ASM + Nicolaides	30	36	50	61	65

Our approach

Fix the problem by an optimal and proven choice of a coarse space Z.

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Objectives

Strategy

Define an appropriate coarse space $V_{H2} = \text{span}(Z_2)$ and use the framework previously introduced, writing $R_0 = Z_2^T$ the two level preconditioner is :

$$P_{ASM2}^{-1} := R_0^T (R_0 A R_0^T)^{-1} R_0 + \sum_{i=1}^N R_i^T A_i^{-1} R_i.$$

The coarse space must be

- Local (calculated on each subdomain) \rightarrow parallel
- Adaptive (calculated automatically)
- Easy and cheap to compute
- Robust (must lead to an algorithm whose convergence is proven not to depend on the partition nor the jumps in coefficients)

Abstract eigenvalue problem

Gen.EVP per subdomain :

Find $p_{j,k} \in V_{h|\Omega_j}$ and $\lambda_{j,k} \ge 0$: $a_{\Omega_j}(p_{j,k}, v) = \lambda_{j,k} a_{\Omega_j^{\circ}}(\Xi_j p_{j,k}, \Xi_j v) \quad \forall v \in V_{h|\Omega_j}$ $A_j \mathbf{p}_{j,k} = \lambda_{j,k} \mathbf{X}_j A_j^{\circ} \mathbf{X}_j \mathbf{p}_{j,k} \quad (\mathbf{X}_j \dots \text{diagonal})$

 Ξ_j is the partition unity

 $a_D \dots$ restriction of a to D

In the two-level ASM :

Choose first m_j eigenvectors per subdomain :

$$V_0 = \text{span} \{ \Xi_j p_{j,k} \}_{k=1,...,m_j}^{j=1,...,N}$$

This automatically includes Zero Energy Modes.

Galvis & Efendiev (SIAM 2010) :

$$\int_{\Omega_j} \mathbf{\kappa} \, \nabla p_{j,k} \cdot \nabla v \, dx \; = \; \lambda_{j,k} \, \int_{\Omega_j} \mathbf{\kappa} \, p_{j,k} \, v \, dx \qquad \forall v \in V_{h \mid \Omega_j}$$

Efendiev, Galvis, Lazarov & Willems (submitted) :

$$a_{\Omega_j}(p_{j,k}, v) = \lambda_{j,k} \sum_{i \in \mathsf{neighb}(j)} a_{\Omega_j}(\xi_j \, \xi_i \, p_{j,k}, \, \xi_j \, \xi_i \, v) \qquad \forall v \in V_{|\Omega_j|}$$

 $\xi_j \dots$ partition of unity, calculated adaptively (MS)

Our gen.EVP :

$$a_{\Omega_j}(p_{j,k}, v) = \lambda_{j,k} a_{\Omega_j^{\circ}}(\Xi_j p_{j,k}, \Xi_j v) \qquad \forall v \in V_{h|\Omega_j}$$

both matrices typically singular $\implies \lambda_{j,k} \in [0, \infty]$

Theory

Two technical assumptions.

Theorem (Spillane, Dolean, Hauret, N., Pechstein, Scheichl)

If for all
$$j$$
 : $0 < \lambda_{j,m_{j+1}} < \infty$:

$$\kappa(M_{ASM,2}^{-1}A) \leq (1+k_0) \Big[2 + k_0 \left(2k_0 + 1 \right) \max_{j=1}^N \left(1 + \frac{1}{\lambda_{j,m_j+1}} \right) \Big]$$

Possible criterion for picking m_j :

(used in our Numerics)

$$\lambda_{j,m_j+1} < rac{\delta_j}{H_j}$$

 $H_j \ldots$ subdomain diameter, $\delta_j \ldots$ overlap

Numerical results via a Domain Specific Language

FreeFem++ (http://www.freefem.org/ff++), with :

- Metis Karypis and Kumar 1998
- SCOTCH Chevalier and Pellegrini 2008
- UMFPACK Davis 2004
- ARPACK Lehoucq et al. 1998
- MPI Snir et al. 1995

- Intel MKL
- PARDISO Schenk et al. 2004
- MUMPS Amestoy et al. 1998
- PaStiX Hénon et al. 2005

Numerics – 2D Elasticity

ε



$$E_1 = 2 \cdot 10^{11}$$

 $\nu_1 = 0.3$

$$E_2 = 2 \cdot 10^7$$
$$\nu_2 = 0.45$$

METIS partitions with 2 layers added

subd.	dofs	AS-1	AS-ZEM	(V_H)	GENEO	(V_H)
4	13122	93	134	(12)	42	(42)
16	13122	164	165	(48)	45	(159)
25	13122	211	229	(75)	47	(238)
64	13122	279	167	(192)	45	(519)

Numerics – 3D Elasticity

Iterations (CG) vs. number of subdomains



E_1	=	2	•	10^{11}	

$$\nu_1 = 0.3$$

$$E_2 = 2 \cdot 10^7$$

 $\nu_2 = 0.45$

Relative error vs. iterations 16 regular subdomains



subd.	dofs	AS-1	AS-ZEM	(V_H)	GENEO	(V_H)
4	1452	79	54	(24)	16	(46)
8	29040	177	87	(48)	16	(102)
16	58080	378	145	(96)	16	(214)

AS-ZEM (Rigid body motions) : $m_j = 6$

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Layers of hard and soft elastic materials

 m_i is given automatically by the strategy.

#Z per subd.	one level	ZEM	Ge	enEO
$\max(m_i - 1, 3)$			2600	(93)
m_i	5.1 e5 (184)	1.4 <i>e</i> 4 (208)	53	(35)
$m_i + 1$			45	(25)

condition number (iteration count) for one and two level ASMs

- Taking one fewer eigenvalue has a huge influence on the iteration count
- Taking one more has only a small influence

Eigenvalues and eigenvectors







Darcy pressure equation



Figure : Two dimensional diffusivity κ

Channels and inclusion



Channels and inclusions : $1 \le \alpha \le 1.5 \times 10^6,$ the solution and partitionings (Metis or not)

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PhD of Pierre Jolivet.

Since version 1.16, bundled with the Message Passing Interface. FreeFem++ is working on the following parallel architectures (among others) :

	N° of cores	Memory	Peak perf
hpc1@LJLL	160@2.00 Ghz	640 Go	\sim 10 TFLOP/s
titane@CEA	12192@2.93 Ghz	37 To	140 TFLOP/s
babel@IDRIS	40960@850 Mhz	20 To	139 TFLOP/s
curie@CEA	92000@2.93 Ghz	315 To	1.6 PFLOP/s

http://www-hpc.cea.fr, Bruyères-le-Châtel, France. http://www.idris.fr, Orsay, France.

http://www.prace-project.eu.

Strong scalability in two dimensions heterogeneous elasticity

Elasticity problem with heterogeneous coefficients



Speed-up for a 1.2 billion unknowns 2D problem. Direct solvers in the subdomains. Peak performance wall-clock time : 26s.

Strong scalability in three dimensions heterogeneous elasticity

Elasticity problem with heterogeneous coefficients



Speed-up for a 160 million unknowns 3D problem. Direct solvers in subdomains. Peak performance wall-clock time : 36s.

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Weak scalability in two dimensions

Darcy problems with heterogeneous coefficients



Efficiency for a 2D problem. Direct solvers in the subdomains. Final size : 22 billion unknowns. Wall-clock time : \simeq 200s.

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Weak scalability in three dimensions

Darcy problems with heterogeneous coefficients



Efficiency for a 3D problem. Direct solvers in the subdomains. Final size : 2 billion unknowns. Wall-clock time : \simeq 200s.

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6 Future/Conclusion

Freefem++ v3 is

- very good tool to solve non standard PDE in 2D/3D
- to try new domain decomposition domain algorithm

The the future we try to do :

- Build more graphic with VTK, paraview , ... (in progress)
- Add Finite volume facility for hyperbolic PDE (just begin C.F. FreeVol Projet)
- 3d anisotrope mesh adaptation
- automate the parallel tool

Thank for you attention.

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