

# Espaces grossiers adaptatifs pour les méthodes de décomposition de domaines à deux niveaux

**Frédéric Nataf**

Laboratory J.L. Lions (LJLL), CNRS, Alpines et Univ. Paris VI

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joint work with

**Victorita Dolean** (Univ. Nice Sophia-Antipolis)

**Patrice Hauret** (Michelin, Clermont-Ferrand)

**Frédéric Hecht** (LJLL)

**Pierre Jolivet** (LJLL)

**Clemens Pechstein** (Johannes Kepler Univ., Linz)

**Robert Scheichl** (Univ. Bath)

**Nicole Spillane** (LJLL)

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CEA Saclay 2013

- 1 Introduction
- 2 An abstract 2-level Schwarz: the GenEO algorithm
- 3 Conclusion

- 1 Introduction
  - Classical coarse space method
- 2 An abstract 2-level Schwarz: the GenEO algorithm
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Large discretized system of PDEs  
strongly heterogeneous coefficients  
(high contrast, nonlinear, multiscale)

E.g. Darcy pressure equation,  
 $P^1$ -finite elements:

$$AU = F$$

$$\text{cond}(A) \sim \frac{\alpha_{\max}}{\alpha_{\min}} h^{-2}$$

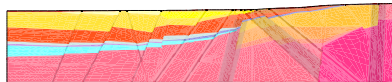
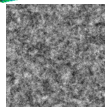
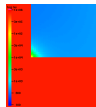
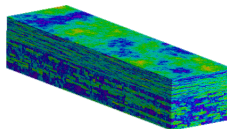
**Goal:**

iterative solvers

robust in size and heterogeneities

**Applications:**

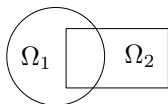
flow in heterogeneous /  
stochastic / layered media  
structural mechanics  
electromagnetics  
etc.



Direct	DDM	Iterative
Cons: Memory Difficult to    Pros: Robustness	Pro: Flexible Naturally	Pros: Memory Easy to    Cons: Robustness
solve(MAT,RHS,SOL)	Few black box routines Few implementations of efficient DDM	solve(MAT,RHS,SOL)

**Multigrid methods:** very efficient but may lack robustness, not always applicable (Helmholtz type problems, complex systems) and difficult to parallelize.

## The original Schwarz Method (H.A. Schwarz, 1870)



$$\begin{aligned} -\Delta(u) &= f \quad \text{in } \Omega \\ u &= 0 \quad \text{on } \partial\Omega. \end{aligned}$$

Schwarz Method :  $(u_1^n, u_2^n) \rightarrow (u_1^{n+1}, u_2^{n+1})$  with

$$\begin{aligned} -\Delta(u_1^{n+1}) &= f \quad \text{in } \Omega_1 & -\Delta(u_2^{n+1}) &= f \quad \text{in } \Omega_2 \\ u_1^{n+1} &= 0 \quad \text{on } \partial\Omega_1 \cap \partial\Omega & u_2^{n+1} &= 0 \quad \text{on } \partial\Omega_2 \cap \partial\Omega \\ u_1^{n+1} &= u_2^n \quad \text{on } \partial\Omega_1 \cap \overline{\Omega_2}. & u_2^{n+1} &= u_1^{n+1} \quad \text{on } \partial\Omega_2 \cap \overline{\Omega_1}. \end{aligned}$$

Parallel algorithm, converges but very slowly, overlapping subdomains only.

The parallel version is called **Jacobi Schwarz method (JSM)**.

# Strong and Weak scalability

How to evaluate the efficiency of a domain decomposition?

## Strong scalability (Amdahl)

"How the solution time varies with the number of processors for a fixed *total* problem size"

## Weak scalability (Gustafson)

"How the solution time varies with the number of processors for a fixed problem size *per processor*."

## Not achieved with the one level method

Number of subdomains	8	16	32	64
ASM	18	35	66	128

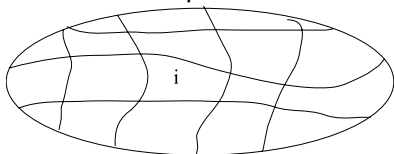
The iteration number increases linearly with the number of subdomains in one direction.

# How to achieve scalability

Stagnation corresponds to a few very low eigenvalues in the spectrum of the preconditioned problem. They are due to the lack of a global exchange of information in the preconditioner.

$$-\Delta u = f \text{ in } \Omega$$

$$u = 0 \text{ on } \partial\Omega$$



The mean value of the solution in domain  $i$  depends on the value of  $f$  on all subdomains.

A classical remedy consists in the introduction of a **coarse problem** that couples all subdomains. This is closely related to **deflation technique** classical in linear algebra (see Nabben and Vuik's papers in SIAM J. Sci. Comp, 200X).



# 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,  $V_H = \text{span } Z$ , 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:

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

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

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

# Theoretical convergence result

## Theorem (Widlund, Dryija)

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

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

where  $\delta$  is the size of the overlap between the subdomains and  $H$  the subdomain size.

This does indeed work very well

Number of subdomains	8	16	32	64
ASM	18	35	66	128
ASM + Nicolaides	20	27	28	27

# Failure for Darcy equation with heterogeneities

$$\begin{aligned} -\nabla \cdot (\alpha(x, y) \nabla u) &= 0 \quad \text{in } \Omega \subset \mathbb{R}^2, \\ u &= 0 \quad \text{on } \partial\Omega_D, \\ \frac{\partial u}{\partial n} &= 0 \quad \text{on } \partial\Omega_N. \end{aligned}$$



Decomposition



$\alpha(x, y)$

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  $Z$ .

- 1 Introduction
- 2 An abstract 2-level Schwarz: the GenEO algorithm
  - Choice of the coarse space
  - First Numerical results
  - Parallel implementation
- 3 Conclusion

## Strategy

Define an appropriate coarse space  $V_{H_2} = \text{span}(Z_2)$  and use the framework previously introduced, writing  $R_0 = Z_2^T$  the two level preconditioner is:

$$P_{ASM_2}^{-1} := R_0^T (R_0 A R_0^T)^{-1} R_0 + \sum_{i=1}^N R_i^T A_i^{-1} R_i.$$

## The 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  $\lambda_{j,k} \geq 0$ :

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

$$A_j p_{j,k} = \lambda_{j,k} X_j A_j^o X_j p_{j,k} \quad (X_j \dots \text{diagonal})$$

$a_D \dots$  restriction of  $a$  to  $D$

---

**In the two-level ASM:**

Choose first  $m_j$  eigenvectors per subdomain:

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

This automatically includes Zero Energy Modes.

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**Galvis & Efendiev (SIAM 2010):**

$$\int_{\Omega_j} \kappa \nabla p_{j,k} \cdot \nabla v \, dx = \lambda_{j,k} \int_{\Omega_j} \kappa p_{j,k} v \, dx \quad \forall v \in V_{h|\Omega_j}$$

**Efendiev, Galvis, Lazarov & Willems (submitted):**

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

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

**Our gen.EVP:**

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

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



Two technical assumptions.

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

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

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

Possible criterion for picking  $m_j$ :

(used in our Numerics)

$$\lambda_{j,m_{j+1}} < \frac{\delta_j}{H_j}$$

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

# Numerical results via a Domain Specific Language

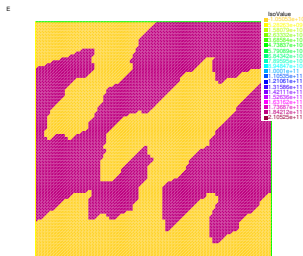
FreeFem++ (<http://www.freefem.org/ff++>), with:

- 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

Why use a DS(E)L instead of C/C++/Fortran/... ?

- performances close to low-level language implementation,
- hard to beat something as simple as:

```
varf a(u, v) = int3d(mesh)([dx(u), dy(u), dz(u)]' * [dx(v), dy(v), dz(v)])  
+ int3d(mesh)(f * v) + on(boundary_mesh)(u = 0)
```



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

$$\nu_1 = 0.3$$

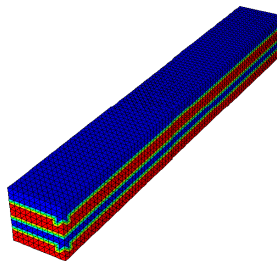
$$E_2 = 2 \cdot 10^7$$

$$\nu_2 = 0.45$$

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)

## Iterations (CG) vs. number of subdomains



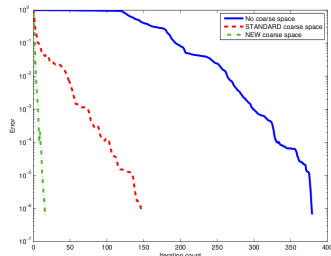
$$E_1 = 2 \cdot 10^{11}$$

$$\nu_1 = 0.3$$

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

$$\nu_2 = 0.45$$

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):  $m_j = 6$



Layers of **hard** and **soft** elastic materials

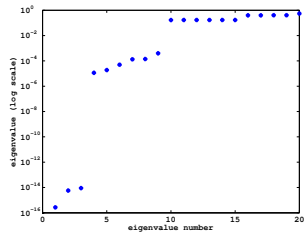
$m_i$  is given automatically by the strategy.

#Z per subd.	one level	ZEM	GenEO
$\max(m_i - 1, 3)$			2600 (93)
$m_i$	5.1 e5 (184)	1.4 e4 (208)	53 (35)
$m_i + 1$			45 (25)

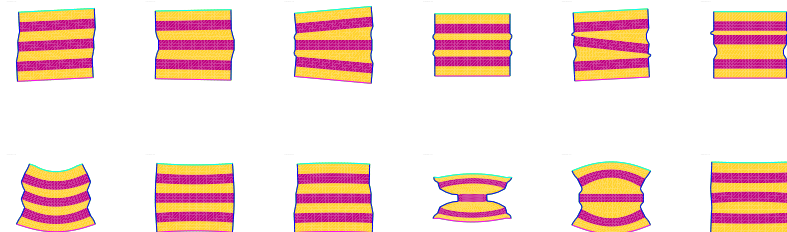
condition number (iteration count) for one and two level ASMs

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

# Eigenvalues and eigenvectors



Logarithmic scale



# Darcy pressure equation

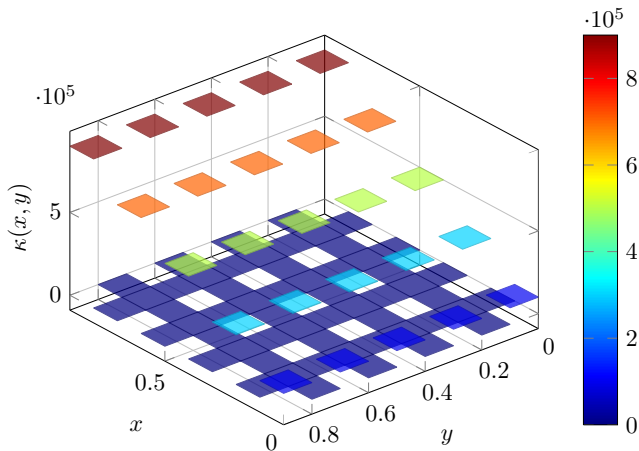
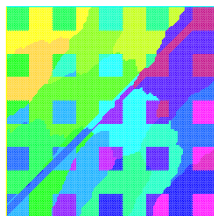
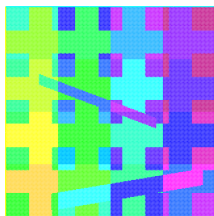
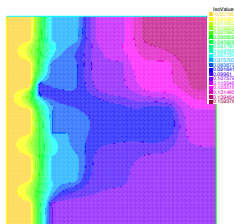
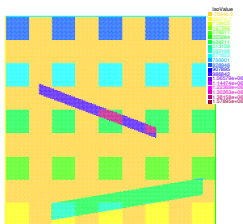


Figure : Two dimensional diffusivity  $\kappa$

# Channels and inclusion



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



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
<code>hpc1@LJLL</code>	160@2.00 Ghz	640 Go	~ 10 TFLOP/s
<code>titane@CEA</code>	12192@2.93 Ghz	37 To	140 TFLOP/s
<code>babel@IDRIS</code>	40960@850 Mhz	20 To	139 TFLOP/s
<code>curie@CEA</code>	92000@2.93 Ghz	315 To	1.6 PFLOP/s

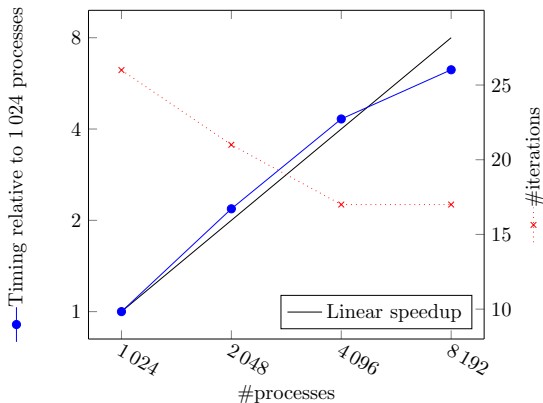
<http://www-hpc.cea.fr>, Bruyères-le-Châtel, France.

<http://www.idris.fr>, Orsay, France.

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

# Strong scalability in two dimensions heterogeneous elasticity

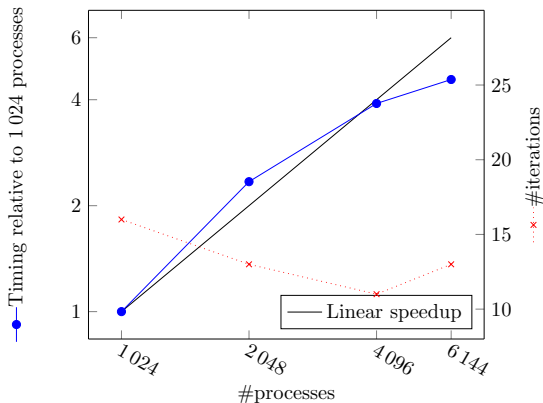
## Elasticity problem with heterogeneous coefficients



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

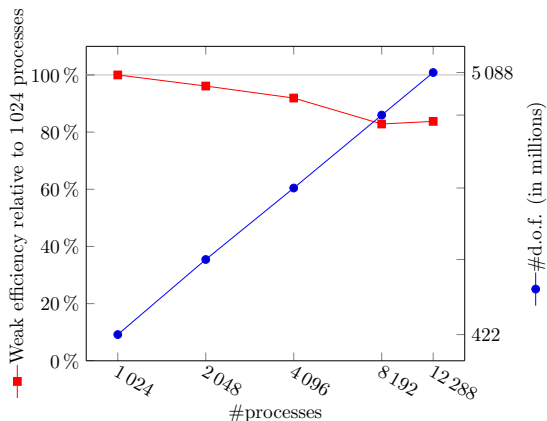
## Elasticity problem with heterogeneous coefficients



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

# Weak scalability in two dimensions

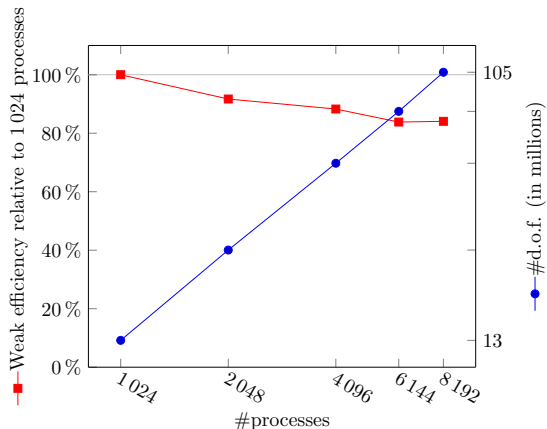
## Darcy problems with heterogeneous coefficients



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

# 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:  $\approx$  200s.

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## GenEO for ASM

- Implementation requires only element stiffness matrices + connectivity
- FreeFem++ MPI implementation

## Not shown here

- GenEO for BNN/FETI methods

## Outlook

- Nonlinear time dependent problem (Reuse of the coarse space)
- Coarse problem satisfies assembling property  
↳ multilevel method — link to  $\sigma$ AMGe ?
- Other discretizations: finite volume, finite difference, ...

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## Preprints available on HAL:

<http://hal.archives-ouvertes.fr/>



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F. Nataf, H. Xiang, V. Dolean, "A two level domain decomposition preconditioner based on local Dirichlet-to-Neumann maps", *C. R. Mathématique*, Vol. 348, No. 21-22, pp. 1163-1167, 2010.



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N. Spillane, V. Dolean, P. Hauret, F. Nataf, C. Pechstein, R. Scheichl, "Abstract Robust Coarse Spaces for Systems of PDEs via Generalized Eigenproblems in the Overlaps", submitted to *Numerische Mathematik*, 2011.

V. Dolean, F. Nataf, P. Jolivet: "*Domain decomposition methods. Theory and parallel implementation with FreeFEM++*", Lecture notes (coming soon).

THANK YOU FOR YOUR ATTENTION!

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