



Projet DEDALES

Décomposition de domaines algébriques et géométriques pour les écoulements souterrains

Outline

Introduction

- Project goals and organization

- Physical models

Development in physical models

- One-phase models : integration of MaPHyS in Traces – algebraic view

- Two-phase models : global in time domain decomposition – geometric view

Development of new solvers

- Algebraic coarse space for MaPHyS

- Pastix over a runtime system : solving in the subdomains

- Efficient programming of finite element for vector languages

Conclusion

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Overall objectives

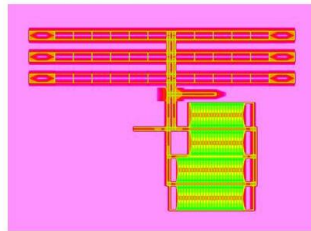
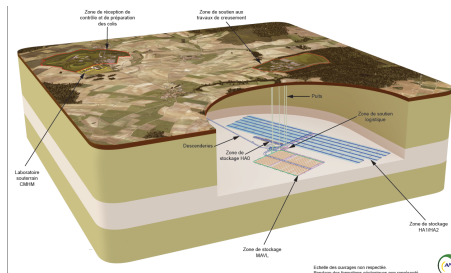
Develop high performance code for
the simulation of complex flow in the subsurface

Application challenge

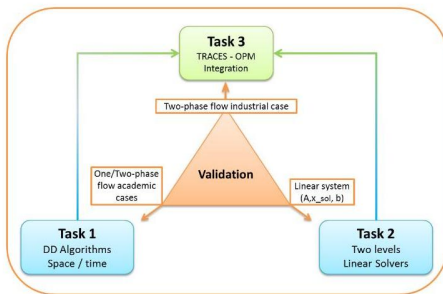
High performance simulation around a
nuclear waste disposal site

Scientific challenge

Bridge the gap between hierarchical
physical models and hierarchical
computer architectures



Organization – objectives



- ▶ Demonstrate the potential of domain decomposition methods for exploiting the upcoming hierarchical and heterogeneous architectures
- ▶ Formulate space-time DD methods for two-phase flows (non-linearity, discontinuous capillary pressure)
- ▶ Develop hybrid (MPI + OpenMP) solver over a runtime system

Participants

- ▶ Serena (ex-Pomdapi), Inria Paris
- ▶ LAGA, Université Paris Nord, CNRS
- ▶ HiePACS, Inria Bordeaux Sud-Ouest
- ▶ Andra
- ▶ Maison de la Simulation (CEA, CNRS, Inria, UVSQP, UPS)

Skills in analyzing DD methods, porous media flows, parallel linear algebra, high performance computing, storage simulation



MAISON DE LA SIMULATION



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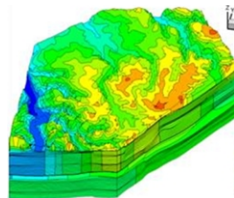
One phase liquid phase

Flow equations

$$\mathbf{q} = -\frac{K}{\mu} (\nabla p - \rho \mathbf{g}) \quad \text{Darcy's law}$$

$$\nabla \cdot \mathbf{q} = 0 \quad \text{mass conservation}$$

- ▶ p pressure [kg/m/s²]
- ▶ K permeability tensor [m²]
(heterogeneous, anisotropic)
- ▶ ρ density [kg/m³]



- ▶ \mathbf{q} Darcy velocity [m/s]
- ▶ μ dynamic viscosity [kg/m/s]
- ▶ \mathbf{g} gravity [m/s²]

Advection–diffusion equation

$$\omega \partial_t c - \underbrace{\text{div}(\mathbf{D} \text{grad } c)}_{\text{dispersion}} + \underbrace{\text{div}(\mathbf{q}c)}_{\text{advection}} = f$$

- ▶ c : concentration [mol/m³]
- ▶ ω : porosity [-]
- ▶ \mathbf{D} diffusion – dispersion tensor [m²/s]
(can be anisotropic)
- ▶ \mathbf{q} Darcy velocity [m/s]

Two-phase immiscible flow

$$\partial_t (\omega \rho_\alpha S_\alpha) + \operatorname{div} (\rho_\alpha \mathbf{u}_\alpha) = q_\alpha$$

$$\mathbf{u}_\alpha = - \frac{k_{r\alpha}(S_\alpha)}{\mu_\alpha} K (\nabla p_\alpha - \rho_\alpha \mathbf{g})$$

$$S_n + S_w = 1$$

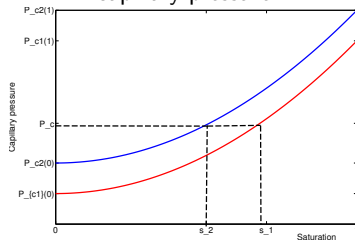
$$p_n - p_w = P_c(S_w)$$

Phase $\alpha = w$ water, n gas.

$P_c(S_w)$ increasing function on $[0, 1]$

- ▶ ω porosity [-]
- ▶ S_α phase saturation [-]
- ▶ \mathbf{u}_α phase velocity [m/s]
- ▶ $k_{r\alpha}$ relative permeability [-]

Specific difficulty : discontinuous capillary pressure



- ▶ K permeability [m^2]
- ▶ p_α : phase pressure [$\text{kg}/\text{m}/\text{s}^2$]
- ▶ ρ_α phase density [kg/m^3]
- ▶ μ_α viscosity [$\text{kg}/\text{m}/\text{s}$]

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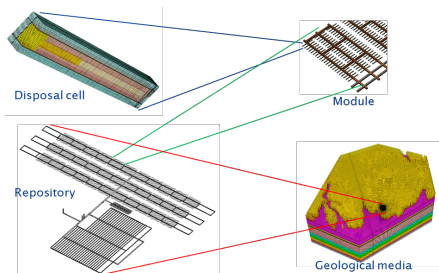
Widely varying scales

- ▶ From meter (canister) to (10s of) kilometers (geologic basin)
- ▶ Half lives : From years (Tritium 12 years) to millions of years (Iodine 16 000 000 years)
- ▶ Permeability varies over 7 orders of magnitude
- ▶ Peclet varies from 0.01 (diffusion dominated) to 1000 (advection dominated)

Traces software

Transport RéActif de
Contaminant dans les Eaux
Souterraines

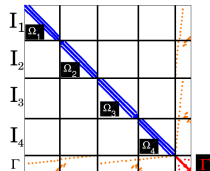
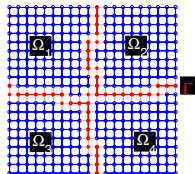
- ▶ Saturated and unsaturated transport, reactive transport module
- ▶ Mixed-hybrid finite element, discontinuous Galerkin
- ▶ Linear solvers : NSPCG, Hypre, MaPHyS



MaPHyS : a hybrid linear solver

Robust scalable parallel hybrid direct/iterative linear solvers

- ▶ Developed by Hiepac teams, Inria Bordeaux
- ▶ Exploit the efficiency and robustness of the sparse direct solvers
- ▶ Take advantage of the natural scalable parallel implementation of iterative solvers
- ▶ Extend domain decomposition ideas to algebraic setting
- ▶ Partition the problem into subdomains, subgraphs
- ▶ Use a direct solver on the subdomains
- ▶ Robust preconditioned iterative solver



Algebraic view

$$\text{Decomposition } \mathcal{A} = \begin{pmatrix} \mathcal{A}_{II} & \mathcal{A}_{I\Gamma} \\ \mathcal{A}_{\Gamma I} & \mathcal{A}_{\Gamma\Gamma} \end{pmatrix}$$

Schur complement

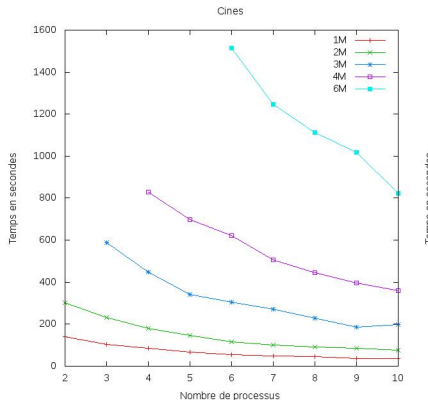
$$\mathcal{S} = \mathcal{A}_{\Gamma\Gamma} - \mathcal{A}_{\Gamma I} \mathcal{A}_{II}^{-1} \mathcal{A}_{I\Gamma}$$

Improvements to Traces due to MaPHYs

- ▶ Consolidation and validation of parallel version of TRACES
- ▶ Work to improve time synchronization between subdomains
- ▶ Validation by comparison with one processor's simulations

- ▶ Test case from 1 to 6 million elements (up to 18M DOFs)
- ▶ Flow test case : 1 subdomain per node
- ▶ Preliminary results promising, extend to larger (30 M cells), more complex test cases, optimize code usage

Stage M2 R. Ziara



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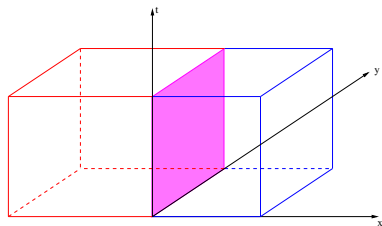
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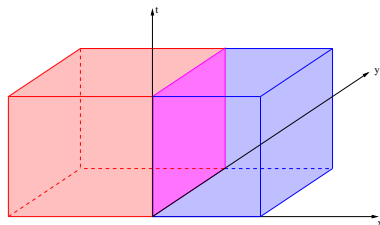
Space-time domain decomposition

Space-time domain decomposition



Space-time domain decomposition

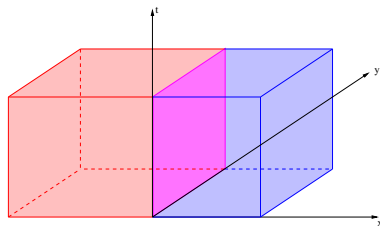
Space-time domain decomposition



- ▶ Solve **time-dependent** problems in the subdomains
- ▶ Exchange information through the **space-time interface**
- ▶ Enable local discretizations both in space and in time
→ **local time stepping**

Space-time domain decomposition

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Simplified non-linear degenerate diffusion model

$$\omega \partial_t S - \Delta \phi(S) = 0 \quad \text{in } \Omega \times [0, T]$$

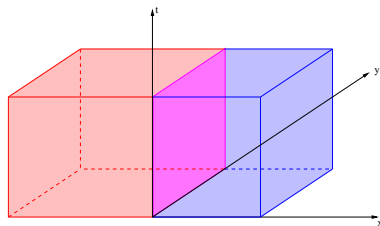
Natural transmission conditions

$$\text{Continuity of capillary pressure } P_{c1}(S_1) = P_{c2}(S_2) \text{ on } \Gamma$$

$$\text{Continuity of the flux } \nabla \phi_1(S_1) \cdot n_1 = -\nabla \phi_2(S_2) \cdot n_2 \text{ on } \Gamma$$

Space-time domain decomposition

Space-time domain decomposition



- ▶ Solve **time-dependent** problems in the subdomains
- ▶ Exchange information through the **space-time interface**
- ▶ Enable local discretizations both in space and in time
→ **local time stepping**

Simplified non-linear degenerate diffusion model

$$\omega \partial_t S - \Delta \phi(S) = 0 \quad \text{in } \Omega \times [0, T]$$

Equivalent transmission conditions

- ▶ $\nabla \phi_1(S_1) \cdot n_1 + \beta_1 P_{c1}(S_1) = -\nabla \phi_2(S_2) \cdot n_2 + \beta_1 P_{c2}(S_2)$
- ▶ $\nabla \phi_2(S_2) \cdot n_2 + \beta_2 P_{c2}(S_2) = -\nabla \phi_1(S_1) \cdot n_1 + \beta_2 P_{c1}(S_1)$

Non-linear Schwarz algorithm

Schwarz algorithm

Given S_i^0 , iterate for $k = 0, \dots$

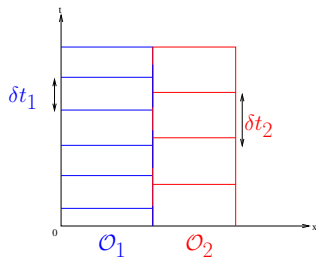
Solve for S_i^{k+1} , $i = 1, 2, j = 3 - i$

$$\omega \partial_t S_i^{k+1} - \Delta \phi_i(S_i^{k+1}) = 0 \quad \text{in } \Omega_i \times [0, T]$$

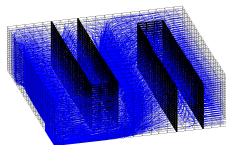
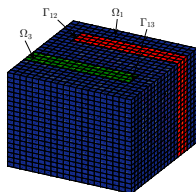
$$\nabla \phi_i(S_i^{k+1}) \cdot n_i + \beta_i P_{ci}(S_i^{k+1}) = -\nabla \phi_j(S_j^k) \cdot n_j + \beta_j P_{cj}(S_j^k) \quad \text{on } \Gamma \times [0, T],$$

(β_1, β_2) are **free parameters** chosen to accelerate convergence

- ▶ Basic ingredient : subdomain solver **with Robin bc.**
- ▶ Discretization : extension to Robin bc of cell centered FV scheme by Enchéry, Eymard, Michel (2006).
- ▶ Different time steps in the subdomains
- ▶ Implemented with Matlab Reservoir Simulation Toolbox (Lie et al. (14))
E. Ahmed, C. Japhet, M. Kern (in preparation)

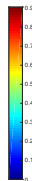
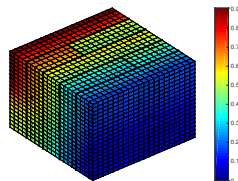
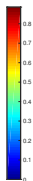
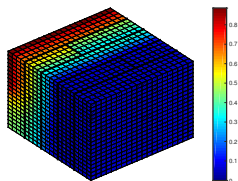


Example : a model with three rock type



Geometry

Streamlines



Saturation $t=5000$, $t=2000$

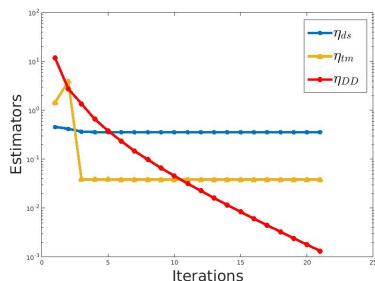
Stopping criteria through a posteriori error estimates (Cemracs 2016)

Goal

Stop DD iterations as soon as discretization error is reached

Develop **fully computable** error estimator with **guaranteed bound** (no implicit constant), based on potential and flux reconstruction.

Allows **separation** of space, time, and iteration errors (S. Ali Hassan's PhD, M. Vohralík, C. Japhet)



Example : lens with 2 rock types

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Motivation : Coarse Correction for MaPHYs

Need for Coarse Correction

- ▶ Good scalability of the direct part ☺
- ▶ The size and condition number of the iterative problem increases with the number of subdomains ☹

A proved robust coarse space for a larger class of methods

- ▶ Generalized Abstract Schwarz (GAS) methods
 - ▶ Neumann-Neumann, Additive Schwarz, Additive Schwarz on the Schur (MAPHYs), ...
- ▶ Only works in the SPD case, with distributed input

Two implementations

- ▶ Python prototype, providing a framework for distributed GAS methods
- ▶ (partially) integrated in MAPHYs 0.9.4

Two level preconditioner : aS Step by step

Step 1 : Domain Decomposition

- ▶ $\mathcal{A} = \sum_{i=1}^N \mathbf{R}_i^T \mathcal{A}_i \mathbf{R}_i$

Step 2 : Factorization

- ▶ Computation of $\mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1}$ and $\mathcal{S}_i = \mathcal{A}_{\Gamma_i, \Gamma_i} - \mathcal{A}_{\Gamma_i, \mathcal{I}_i} \mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1} \mathcal{A}_{\mathcal{I}_i, \Gamma_i}$

Step 3 : Preconditioner Setup

- ▶ $\mathcal{M}_{aS} = \sum_{i=1}^N \mathbf{R}_{\Gamma_i}^T \left(\mathbf{R}_{\Gamma_i} \mathcal{S} \mathbf{R}_{\Gamma_i}^T \right)^{-1} \mathbf{R}_{\Gamma_i}$

Step 4 : Solve

- ▶ on Γ : *Krylov method* $\mathcal{S} x_{\Gamma} = f$ preconditioned with \mathcal{M}_{aS}
- ▶ on \mathcal{I} : *Direct method* $x_{\mathcal{I}_i} = \mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1} (b_{\mathcal{I}_i} - \mathcal{A}_{\mathcal{I}_i, \Gamma_i} x_{\Gamma_i})$

Two level preconditioner : aS,2 Step by step

Step 1 : Domain Decomposition (Application level)

$$\blacktriangleright \mathcal{A} = \sum_{i=1}^N \mathbf{R}_i^T \mathcal{A}_i \mathbf{R}_i$$

Step 2 : Factorization

$$\blacktriangleright \text{Computation of } \mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1} \text{ and } \mathcal{S}_i = \mathcal{A}_{\Gamma_i, \Gamma_i} - \mathcal{A}_{\Gamma_i, \mathcal{I}_i} \mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1} \mathcal{A}_{\mathcal{I}_i, \Gamma_i}$$

Step 3 : Preconditioner Setup

$$\blacktriangleright \mathcal{M}_{aS,2} = \mathcal{M}_0 + \sum_{i=1}^N \mathbf{R}_{\Gamma_i}^T \left(\mathbf{R}_{\Gamma_i} \mathcal{S} \mathbf{R}_{\Gamma_i}^T \right)^{-1} \mathbf{R}_{\Gamma_i}$$

Step 4 : Solve

- \blacktriangleright on Γ : *Krylov method* $\mathcal{S} x_{\Gamma} = f$ preconditioned with $\mathcal{M}_{aS,2}$
- \blacktriangleright on \mathcal{I} : *Direct method* $x_{\mathcal{I}_i} = \mathcal{A}_{\mathcal{I}_i, \mathcal{I}_i}^{-1} (b_{\mathcal{I}_i} - \mathcal{A}_{\mathcal{I}_i, \Gamma_i} x_{\Gamma_i})$

Coarse space for GAS

2-level method needed to keep the number of iterations **independent** of # cores.

Two-level abstract Schwarz

Coarse space V_0

Coarse solve $\mathcal{M}_0 = V_0(V_0^T \mathcal{S} V_0)^\dagger V_0^T$

Proj. onto coarse space $\mathcal{P}_0 = \mathcal{M}_0 \mathcal{S}$

Two-level AS : $\mathcal{M}_D = \mathcal{M}_0 + (I - \mathcal{P}_0) \mathcal{M}_1 (I - \mathcal{P}_0)$, \mathcal{M}_1 1 level preconditioner

Generalized AS : replace \mathcal{S} by approximation $\hat{\mathcal{S}}$.

Extend GENE0 (Spillane at al.) to GAS

1. Solve locally generalized eigenvalue problems for λ and η above **threshold** α and β

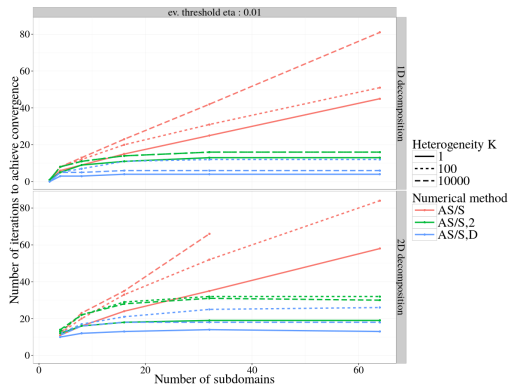
$$\hat{\mathcal{S}}_i \mathbf{p} = \lambda \tilde{\mathcal{S}}_i^{\text{NN}} \mathbf{p} \quad \text{and} \quad \tilde{\mathcal{S}}_i^{\text{AS}} \mathbf{p} = \eta \hat{\mathcal{S}}_i \mathbf{p}$$

2. Assemble resulting coarse space : $V_0 = \sum_{i=1}^N \mathcal{R}_i^T V_i^0$

Condition number bounded **independently** of N and coefficients

3D Test problem : heterogeneous diffusion

- ▶ Alternating conductivity layers of 3 elements (ratio K between layers)
- ▶ Python / MPI implementation



Ph D Thesis L. Poirel, in progress

E. Agullo, L. Giraud, L. Poirel *Robust coarse spaces for Abstract Schwarz preconditioners via generalized eigenproblems*, hal-01399203, Nov. 2016

The number of iterations is stabilized independently of K and N

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Sparse direct solvers

Problem : solve $Ax = b$

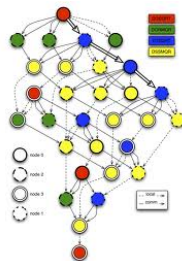
- ▶ Cholesky : factorize $A = LL^T$ (symmetric pattern $(A + A^T)$ for LU)
- ▶ Solve $Ly = b$, and $L^T x = y$

Sparse Direct Solvers : PaStiX approach

- ▶ Inria HiePACS team
- ▶ Supernodal method, no pivoting
- ▶ Order unknowns to minimize the fill-in
- ▶ Compute a symbolic factorization to build L structure
- ▶ Factorize the matrix in place on L structure
- ▶ Solve the system with forward and backward triangular solves

Advantages of using a task-based runtime system

- ▶ Several computing kernels can be associated with the task (C, OPENCL, NVIDIA CUDA)
- ▶ Execute the task graph on the available resources
- ▶ Address the whole computing units and the whole potential parallelisms
- ▶ Insulate the algorithm from the architecture and data distribution
- ▶ Automatic handling of data transfers
- ▶ Finer parallelism handling

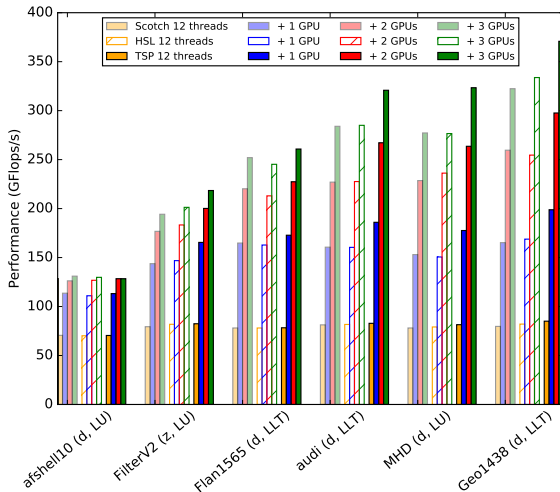


Tasks in Parsec

PARSEC

- ▶ ICL – University of Tennessee, Knoxville
- ▶ **Parameterized Task Graph**
- ▶ Multiple kernels on the accelerators
- ▶ Scheduling strategy based on static performance model
- ▶ GPU multi-stream enabled

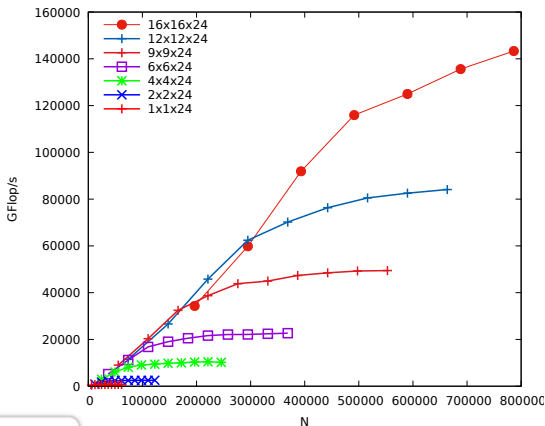
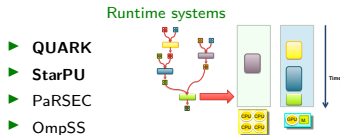
Performance on Fermi GPU architecture, various test matrices



▶ ≈ 100 GFlops speedup per GPU

Runs on Curie/Occigen with the Chameleon library

Sequential Task Flow (STF) design of *dense linear algebra* tiles algorithms (derived from PLASMA) on top of runtime systems



DPOTRF performance
on Occigen (up to
6 000 cores)

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Vectorizing the assembly in finite element computations

Use of the sparse function of the vector language (triplet)

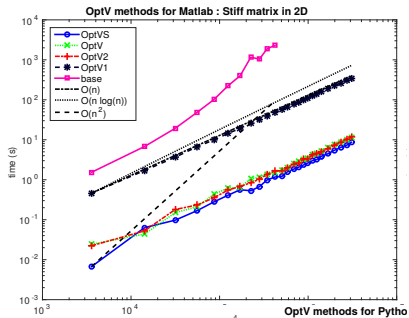
```
M <-- sparse(Ig, Jg, Kg, n, nq)
```

OptFEMP1

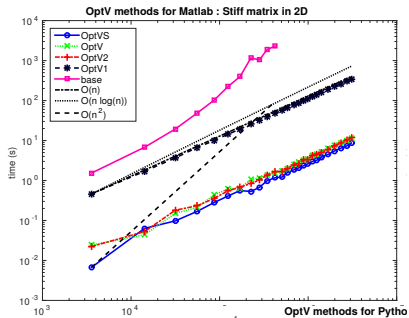
- ▶ Optimized assembly of given matrices in vector languages with a P 1-Lagrange finite element method
- ▶ Works for interpreted/vector languages (Matlab/Octave and Python)
- ▶ Multidimensional (2D, 3D, ...) codes.
- ▶ Used in python version of MaPHyS prototype, 2-level DD solver (in progress)

F. Cuvelier, C. Japhet, G. Scarella, *An efficient way to assemble finite element matrices in vector languages*, Bit Numer Math (2016) 56 : 833.
doi :10.1007/s10543-015-0587-4.

(usual) assembly : loop over mesh elements



Vectorized assembly : loop over local degrees of freedom



Conclusion – Perspectives

- ▶ Progress in solver integration in production code
- ▶ Space–time **geometric** DD for non-linear model
- ▶ Robust coarse space for **algebraic** DD
- ▶ Direct solver over runtime system, high efficiency
- ▶ Efficient building block for finite element in vector languages

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Perspectives for last year

- ▶ Domain decomposition with 2-level parallelism
 - ▶ Implement (geometric) DD approach with a **parallel** subdomain solver
 - ▶ Code for subdomain solver : Compass (Univ. Nice, BRGM, ANR Charms)
 - ▶ Add python wrapper for outer Schwarz iterations
- ▶ Validate developments on **realistic** test cases