# CEMRACS Project ElastoΦ

Boundary integral methods for elasticity around a crack network

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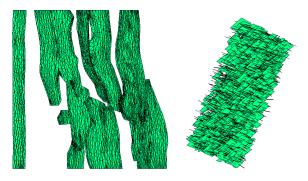






### The ElastoΦ project: the IFPEN problem

Elastostatic problem in crack networks of 2 types: geological *fault* network and discrete *fracture* network



Boundary integral equation posed at the surface of cracks  $\Rightarrow$  dense matrix  $A \in \mathbb{R}^{n \times n} \Rightarrow \mathcal{O}(n^2)$  for matrix-vector product.

IFPEN heuristic approach to sparsify A gives large error (16%–40%)

## The ElastoΦ project

Many refined *complexity reduction* techniques in current literature on boundary integral equation.

Two ingredients in the approach we considered:

- Adaptative Cross Approximation (ACA),
- Hierarchical Matrices (HM).

Challenge: strongly irregular geometry!

[M. Bebendorf. Hierarchical matrices: A Means to Efficiently Solve Elliptic Boundary Value Problems, Lecture Notes in Computational Science and Engineering, 2008]

[S. Rjasanow, O. Steinbach. The fast solution of boundary integral equations. *Mathematical and Analytical Techniques with Applications to Engineering*, 2007]

[W. Hackbusch. Hierarchical Matrices: Algorithms and Analysis, Springer Series in Computational Mathematics, 2016]

# Adaptative Cross Approximation (ACA)

The idea of the Singular Value Decomposition (SVD)

Suppose that  $A \in \mathbb{R}^{n \times n}$  is of low rank, i.e.

$$A = \sum_{j=1}^{k} \mathbf{u}_j \cdot \mathbf{v}_j^T$$
 with  $k \leq n/2$ .

 $\Rightarrow$  2kn operations for matrix-vector product.

SVD actually gives the following decomposition:

$$A = \sum_{j=1}^{n} \sigma_j \mathbf{u}_j \cdot \mathbf{v}_j^T \quad \text{ where } \{\sigma_j^2\}_{j=1...n} \text{ are the eigenvalues of } A^T A.$$

If the  $\sigma_j$  decrease fast, truncated SVD is a good approximation of A! But it costs  $\mathcal{O}(n^3)$  ...

# Adaptative Cross approximation (ACA)

An approximation of the Singular Value Decomposition (SVD)

### Algorithm 1 Partially Pivoted ACA

```
Initialize j_* r = 0
while(stopping criterion not satisfied){
      \mathbf{w} = A(j_*, :)^T - \sum_{\ell=1}^r \mathbf{u}_{\ell}(j_*) \mathbf{v}_{\ell}
      k_* = \operatorname{argmax}_{k-1} |\mathbf{w}(k)|
      w_* = \mathbf{w}(k_*)
      if(w_* \neq 0){
             \mathbf{v}_{r+1} = \mathbf{w}
             \mathbf{w} = \mathbf{A}(:, k_*) - \sum_{\ell=1}^r \mathbf{v}_{\ell}(k_*) \mathbf{u}_{\ell}
             \mathbf{u}_{r+1} = w_*^{-1} \mathbf{w}
            j_* = \operatorname{argmax}_{i=1...n} |\mathbf{w}(j)|
             r = r + 1
      else{terminate algorithm}
```

#### Advantages:

- No need to assemble the entire matrix
- Cost and storage in  $O(n \log n)$

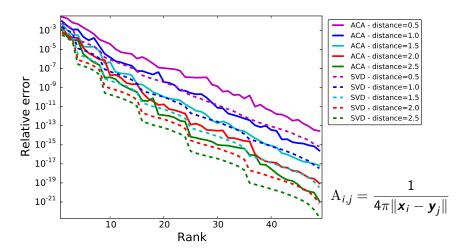
#### Remark:

 Function computing the coefficients on the fly necessary to be more efficient in practice

# Adaptative Cross Approximation (ACA)

Comparaison between SVD and ACA

Compression of the interaction matrix between *two clusters*  $\{ {m x}_i \}$  and  $\{ {m y}_j \}$ 



# Adaptative Cross Approximation (ACA)

In practice in our application

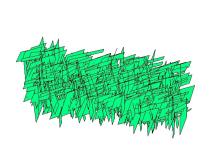
The matrix comes from the discretization of a boundary integral equation

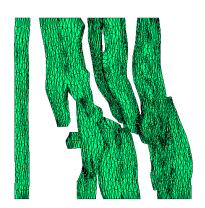
$$A_{j,k} := \int_{\tau \times \tau'} \mathscr{G}(\mathbf{x} - \mathbf{y}) \psi_j(\mathbf{x}) \psi_k(\mathbf{y}) d\sigma(\mathbf{x}) d\sigma(\mathbf{y}), \quad j, k = 1 \dots n.$$

- *Y* is an *integral kernel* with these properties:
  - it is singular for  $\mathbf{x} = \mathbf{y}$ , i.e. if  $\tau \cap \tau' \neq \emptyset$ ,
  - it is *regularizing* if  $\tau$  and  $\tau'$  are distant from each other.
- $\Rightarrow$  ACA is applicable to admissible blocks of A
- ⇒ Hierarchical Matrices (HM)

An example of cluster tree

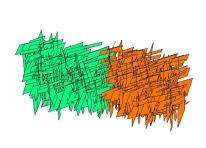
1. First step to build the blocks of the hierarchical matrix: building a *tree* of clusters of points.

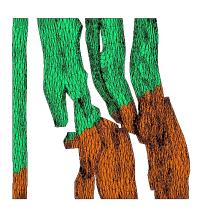




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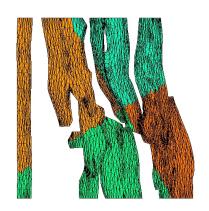




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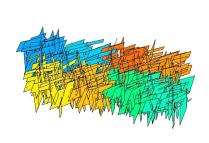
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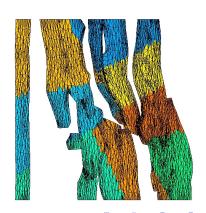




An example of cluster tree

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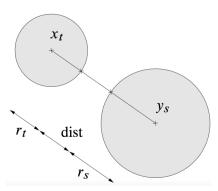


Admissible blocks

Interactions between nodes of the cluster tree  $\Leftrightarrow$  sub-blocks of A.

2. Second step: checking *recursively* the admissibility of the blocks with the following admissibility condition on the associated clusters:

$$\min(\operatorname{diam}(B_t), \operatorname{diam}(B_s))$$
  
 $< \frac{\eta}{2} \operatorname{dist}(B_t, B_s)$ 

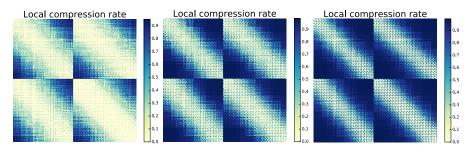


 $\Rightarrow$  apply ACA to the admissible blocks.

C++ implementation, our source code is available on GitHub at:

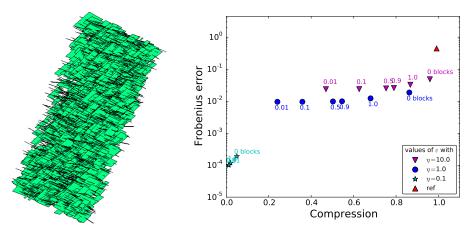
https://github.com/xclaeys/ElastoPhi

Varying the parameters of the algorithm:



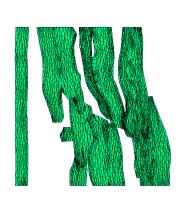
• Remark: a block is not necessarily a connected part of the matrix.

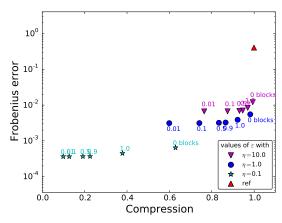
Network of N = 1994 fractures: size  $A = 3N \times 3N$ 



IFPEN sparse matrix: compression rate = 0.99, error = 45% H matrix, zero blocks and  $\eta=1$ : compression rate = 0.86, error = 2% HM-ACA matrix,  $\varepsilon=1$  and  $\eta=1$ : compression rate = 0.68, error = 1%

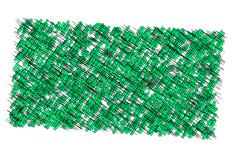
Network of faults with N=5364 mesh triangles: size  $A=3N\times3N$ 

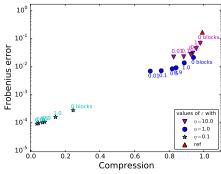




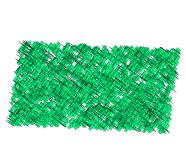
IFPEN sparse matrix: compression rate = 0.999, error = 41% H matrix, zero blocks and  $\eta=1$ : compression rate = 0.98, error = 0.55% HM-ACA matrix,  $\varepsilon=1$  and  $\eta=1$ : compression rate = 0.92, error = 0.38%

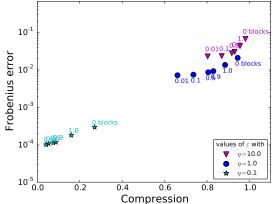
Network of N = 3600 fractures: size  $A = 3N \times 3N$ 



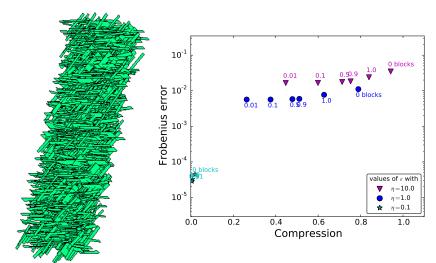


Network of N = 2700 fractures: size  $A = 3N \times 3N$ 





Network of N = 1363 fractures: size  $A = 3N \times 3N$ 



#### Conclusion and outlook

- We obtained approximation errors suited to IFPEN applications with high compression rates,
- to treat large industrial cases, we have to compute only the needed coefficients of the matrix on the fly, in order to really exploit the low complexity of ACA (not possible during CEMRACS for confidentiality reasons),
- design a new admissibility condition to take in account the direction of the fractures,
- parallelization of the code.

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Thank you for your attention!