New parallel features
in the sparse solver
PaStiX
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## What is PaStiX ?

## PaStiX = Parallel Sparse Linear Algebra Solver

- Sparse Linear Algebra Solver
$>$ Solves $A x=b$
$>A$ matrix with a lot of zeros
- Many variants to support multi-core systems
> POSIX Threads:
Single-thread, Multi-thread with static or dynamic scheduling
$>$ Use of external runtime systems:
StarPU, PaRSEC
- Support of distributed architectures with MPI
- Numerical features
$>$ Low / Full rank
$>$ Mixed precision
$>$ Multi-DOF support (constant and variadic)

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## 4 steps:

1. Analyze (ordering, mapping, symbolic fact)
2. Factorization (A permutation, Cholesky, LU)
3. Solve (vectors permutation, solve)
4. Refinement

## Goal: fully support distributed architecture

- Distributed permutation

P6 Multiple Degree Of Freedom
P64 $A$ (Factorization), $b$ and Pb (solve) permutation

- Distributed trsm (solve)

P5 Multi-threaded static and dynamic

## Current work: factorization with StarPU

P6 Tasks level and left / right looking algorithm

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## 01 <br> Distributed support in PaStiX

## New distributed MPI and M-DOF features

## Goal of the distributed work:

$\mathbf{P 6}+$ Matrix permutation (factorization)
$\mathrm{P} 6+$ Vectors permutation (solve)
P(5) Solve with the single-threaded solve implementation
P5 Solve with the multi-threaded schedulers
P6 Support for the constant M-DOF

- Reduce analyze cost
- Better block size for the factorization
- Requested by users


## The Deoree Of Freedom



Single DOF


Multiple Constant
DOF

Multiple Variadic
DOF


DOF

- Ordering faster with compressed $A$
- A permutation faster when compressed

Matrix A：global

|  | 0 | 1 | 2 | 3 | 4 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 0 |  |  |  |  |  |
| 1 |  |  |  |  |  |
| 2 |  |  |  |  |  |
| 3 |  |  |  |  |  |
| 4 |  |  |  |  |  |

numbering of 0 numbering of 1 global numbering

Matrix distribıted Matrix A：processor 0

|  | 0 | 1 | 2 | 3 | 4 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 |  |  |  | 修 |  |
| 1 |  | 絲 |  | 復 |  |
| 2 |  | 絲 |  | 捲 |  |
| 3 |  | 里 |  | 景 |  |
| 4 |  | 楊 |  | 暴 |  |

Matrix A：processor 1

|  | 0 | 1 | 2 | 3 | 4 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | \％ |  | 舜 |  | \％ |
| 1 |  |  | 暽 |  |  |
| 2 | 半 |  | 为 |  |  |
| 3 | 景品 |  | 兄 |  |  |
| 4 | 諮翟 |  | 㣏 |  | 捝 |

Matrix A：processor 0

|  | 0 | 1 | 2 |
| :--- | :--- | :--- | :--- |
| 0 |  |  |  |
| 1 |  |  |  |
| 2 |  |  |  |
| 3 |  |  |  |
| 4 |  |  |  |

Matrix A：processor 1

|  | 0 | 1 |
| :--- | :--- | :--- |
| 0 |  |  |
| 1 |  |  |
| 2 |  |  |
| 3 |  |  |
| 4 |  |  |

Matrix A:
processor 0 processor 1

|  | 0 | 2 | 4 |
| :--- | :--- | :--- | :--- |
| 0 |  |  |  |
| 1 |  |  |  |
| 2 |  |  |  |
| 3 |  |  |  |
| 4 |  |  |  |


|  | 1 | 3 |
| :--- | :--- | :--- |
| 0 |  |  |
| 1 |  |  |
| 2 |  |  |
| 3 |  |  |
| 4 |  |  |

Matrix PAP ${ }^{t}$ block columns

|  | 4 | 1 | 3 | 0 | 2 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 4 |  |  |  |  |  |
| 1 |  |  |  |  |  |
| 3 |  |  |  |  |  |
| 0 |  |  |  |  |  |
| 2 |  |  |  |  |  |
|  | 0 | 1 | 2 | 2 | 2 |


|  | 4 | 1 | 3 | 0 | 2 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 4 |  |  |  |  |  |
| 1 |  |  |  |  |  |
| 3 |  |  |  |  |  |
| 0 |  |  |  |  |  |
| 2 |  |  |  |  |  |
|  | 0 | 1 | 2 | 2 | 2 |


|  | 4 | 1 | 3 | 0 | 2 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| 4 |  |  |  |  |  |
| 1 |  |  |  |  |  |
| 3 |  |  |  |  |  |
| 0 |  |  |  |  |  |
| 2 |  |  |  |  |  |
|  | 0 | 1 | 2 | 2 | 2 |

data local to 0
data local to 1
data sent by 0 to 1
data sent by 1 to 0
column number
block number

## Benchmark

- The matrices:
$>$ Taken from the SuiteSparse Matrix Collection
$>$ Size: from 160 million to 7 billion non zero elements
$>$ Reals and symmetrics
- The machines:
$>$ Inria HPC plateform Plafrim
$>$ Bora: 2 CPU with 18 cores Intel CascadeLake
$>1 \mathrm{MPI}$ process per node and 1 thread per MPI process
- The tools version:
$>$ gcc 11.2
$>$ hwloc 2.7.0
$>$ openmpi 4.0.3
$>$ scotch 6.1.1


## MPI matrix permutation



## Distributed substask solve

## P6 Single threaded

- With MPI on distributed architecture
- Multiple RHS


## P5 Multi threaded

- With MPI on distributed architecture
- Posix multi-thread internal
- Multiple RHS
- Static:
$>$ Each thread has a list of column blocks
$>$ Each thread executes operations on its blocks
- Dynamic:
$>$ Same as static with work stealing


## MPI Single-thread solve



## Benchmark

- The matrices:
$>$ Taken from the SuiteSparse Matrix Collection
$>$ Size: from 160 million to 7 billion non zero elements
$>$ Reals and symmetrics
- The machines:
$>$ Inria HPC plateform Plafrim
$>$ Bora: 2 CPU with 18 cores Intel CascadeLake
$>2 \mathrm{MPI}$ process per node and $\mathbf{1 7}$ threads per MPI process
- The tools version:
$>$ gcc 11.2
$>$ hwloc 2.7.0
$>$ openmpi 4.0.3
$>$ scotch 6.1.1


## MPI Dynamic Multi-thread solve



## MPI Dynamic Multi-thread solve



- Thanks to blas3: not 100 times slower with 100 rhs
- 14 times faster than single threaded solve


## Conclusion

## Contributions:

P6 Constant M-DOF added in PaStiX 6
$\mathbf{P 6}+$ Matrix and vector permutations
P6 MPI single-thread solve reintroduced from PaStiX 5
P5 MPI Multi-threads Static and Dynamic Solve reintroduced from PaStiX 5

Future work:
P6 Add Variadic M-DOF support for every step

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## 02

## Current work: StarPU Factorization

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## StarPU Factorization

## The goal:

P6 Use of hierarchical tasks (bubbles) with StarPU, developped by Gwenolé Lucas in his PhD

## The state of PaStiX 6:

P6 Right and Left looking algorithm of Cholesky and LU factorization
P6 1D + and 2D tasks levels


- Tasks submission instead of executing the operations right away
- The $2 D$ algorithm submit:
$>1 D+$ tasks if the block size is smaller than $2 d$ _block_size
$>2 D$ tasks if the block size is greater than 2d_block_size
- Hierarchical tasks: mixte of $1 D+$ and $2 D$ with $2 D$ tasks submission chosen dynamically


## Right looking potrf



- More parallelism
- Early update
- Submit ready tasks (no overload)
- Less fit for the hierarchical tasks

Left looking potrf


- Less parallelism
- Late update
- Submit not ready tasks
- More fit for the hierarchical tasks


## Benchmark

- The matrices:
$>$ Taken from the SuiteSparse Matrix Collection
$>$ Size: from 160 million to 7 billion non zero elements
$>$ Reals, symmetrics and Positives definites
- The machines:
$>$ Inria HPC plateform Plafrim
$>$ Bora: 2 CPU with 18 cores Intel CascadeLake
$>1$ node and 36 threads StarPU
- The tools version:
$>$ gcc 11.2
$>$ hwloc 2.9.0
$>$ scotch 6.1.1
$>$ starpu 1.4.1

- $2 D$ slowest
- $1 D+$ and $2 D$ mixed better than just $1 D+$
- Left looking slightly better than right looking


## Conclusion

## The goal:

P(6) Use of hierarchical tasks (bubbles) with StarPU, developped by Gwenolé Lucas in his PhD

## Contributions:

P6 Left looking algorithm of Cholesky and LU decomposition added for the StarPU scheduler with $1 D+$ and 2D tasks level

## Future study:

- Impact of the blocks size on the tasks levels and left / right looking algorithms
- Impact of left / right looking algorithm on GPU

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## The end

## Thank you for your attention!

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