

# Sparse Gaussian Elimination Modulo $p$ : an Update

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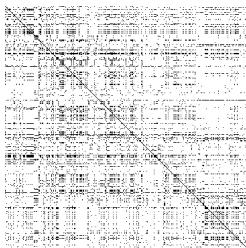
- 1 PLUQ Factorization
- 2 A new hybrid algorithm
- 3 Results
- 4 Conclusion

# Background

## Sparse Linear Algebra Modulo $p$ (coefficients : int)

### Operations

- Rank
- Linear systems
- Kernel
- etc...



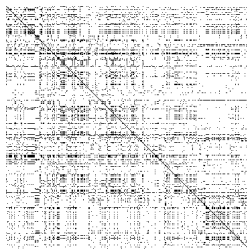
# Background

## Sparse Linear Algebra

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### Two families of Algorithms

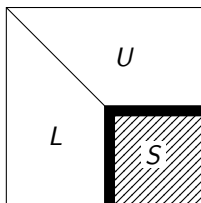
- **Direct methods** (Gaussian Elimination, LU, ...): Numerical World
- **Iterative methods** (Wiedmann, ...): Linear Algebra

# PLUQ

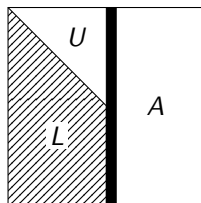
The diagram illustrates the PLUQ factorization equation:  $L \times U = P \times A \times Q^{-1}$ . On the left, matrix  $L$  is shown as a blue lower triangular matrix. Next to it is matrix  $U$ , shown as a green upper triangular matrix. An equals sign follows, then matrix  $P$  (a permutation matrix, not explicitly drawn), then matrix  $A$ , shown as a gray rectangular matrix. Finally, there is a multiplication sign and  $Q^{-1}$ .

- $A$  can be rectangular.
- $A$  can be rank deficient
- $L$  has unit diagonal.
- $U$  has non zero diagonal

Usual right-looking Algorithm:



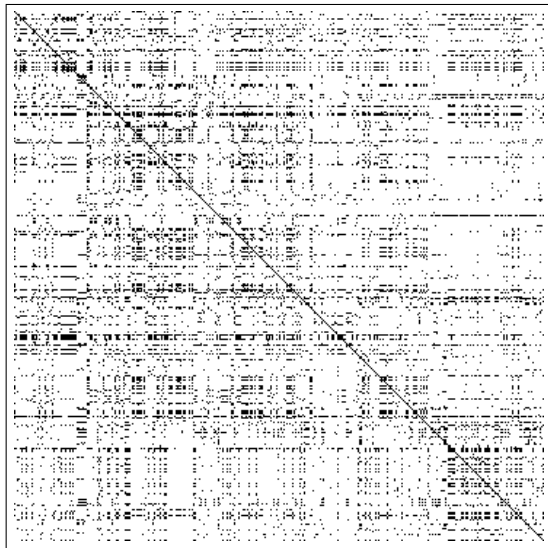
Left looking GPLU Algorithm:



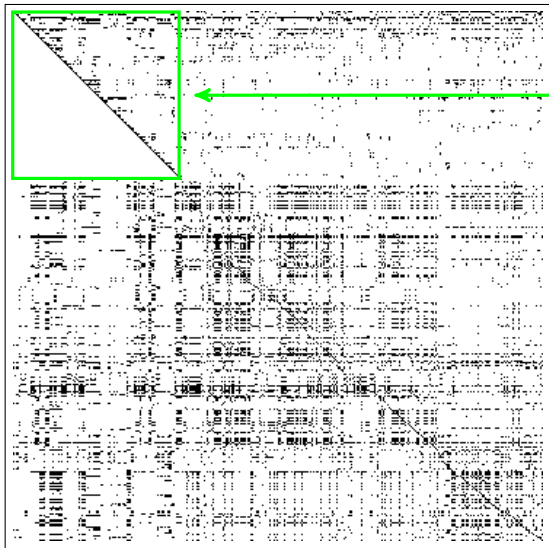
# A new hybrid algorithm

## Description

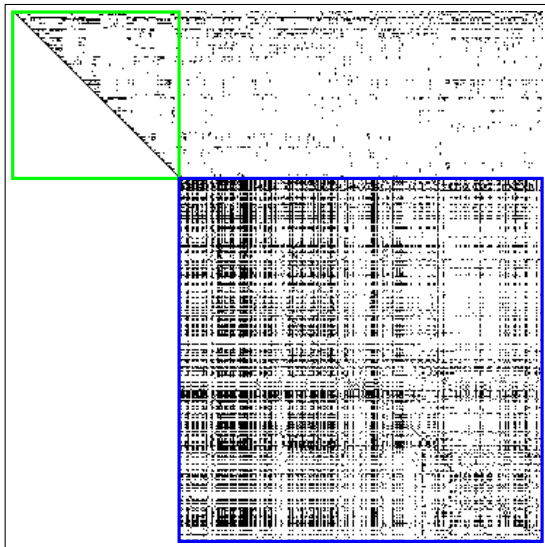
- Find pivots without performing any arithmetical operations ("free" pivots).
- Compute the Schur complement using a left-looking algorithm.
- Recurse.



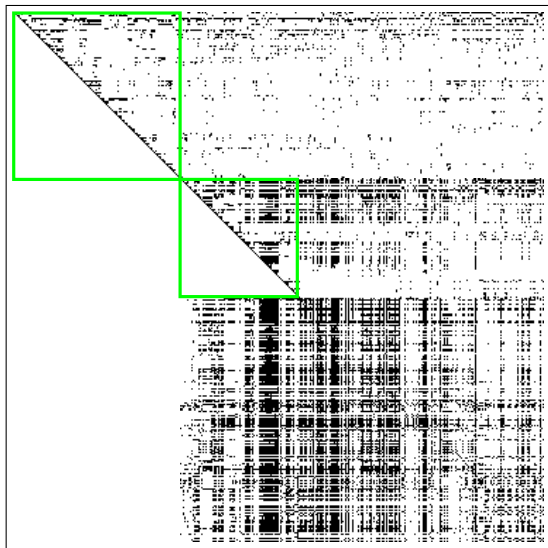


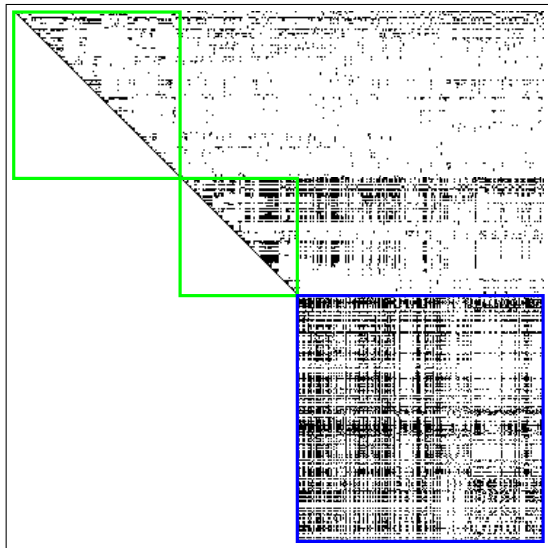


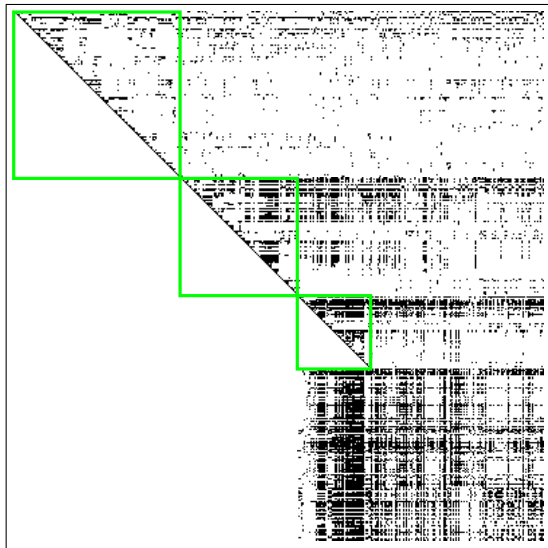
"free" pivots

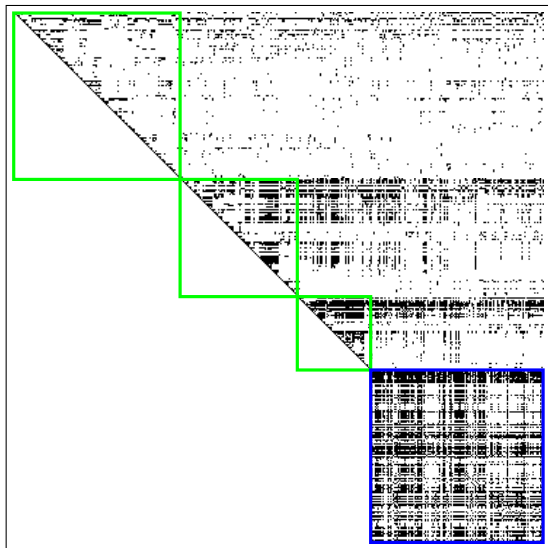


← Schur Complement









← Parallelizable

# Pivots Selection (Faugère and Lachartre (2010))

$$\begin{array}{l}
 0 \\
 1 \\
 2 \\
 3 \\
 4 \\
 5 \\
 6 \\
 7
 \end{array}
 \begin{pmatrix}
 \bullet & & & & \bullet & \bullet & & \\
 & & \bullet & \bullet & & \bullet & & \\
 & \bullet & \bullet & & & & & \\
 & & & \bullet & & & & \\
 \bullet & & & & \bullet & \bullet & & \\
 & & & & \bullet & \bullet & & \\
 & \bullet & \bullet & & & & \bullet & \\
 & \bullet & \bullet & \bullet & & & & \bullet
 \end{pmatrix}$$

$$\begin{array}{l}
 4 \\
 2 \\
 1 \\
 3 \\
 5 \\
 0 \\
 6 \\
 7
 \end{array}
 \begin{pmatrix}
 \bullet & & & & \bullet & \bullet & & \\
 & \bullet & \bullet & & & & & \\
 & & \bullet & & \bullet & \bullet & & \\
 & & & \bullet & & & & \\
 & & & & \bullet & & & \\
 \bullet & & & & & \bullet & \bullet & \\
 & \bullet & \bullet & & & & \bullet & \\
 & \bullet & \bullet & \bullet & & & & \bullet
 \end{pmatrix}$$

## Description

- Each rows is mapped to the column of its leftmost coefficient.
- When several rows have the same leftmost coefficient, select the sparsest.
- Move the selected rows before the others and sort them by increasing position of the leftmost coefficient.

# Schur Complement Computation

$P$  denotes the permutation that pushes the "free" pivots in the top of  $A$ .  
Ignoring permutation over the columns of  $A$ :

$$PA = \begin{pmatrix} U_{00} & U_{01} \\ A_{10} & A_{11} \end{pmatrix} = \begin{pmatrix} Id & \\ L_{10} & L_{11} \end{pmatrix} \cdot \begin{pmatrix} U_{00} & U_{01} \\ & U_{11} \end{pmatrix}$$



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The **Schur Complement**  $S$  of  $PA$  with respect to  $U_{00}$  is given by :

$$S = A_{11} - A_{10}U_{00}^{-1}U_{01}$$

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$$(\mathbf{x}_0 \ \mathbf{x}_1) \cdot \begin{pmatrix} U_{00} & U_{01} \\ & Id \end{pmatrix} = (\mathbf{a}_{i0} \ \mathbf{a}_{i1})$$

We obtain  $\mathbf{x}_1 = \mathbf{a}_{i1} - \mathbf{a}_{i0}U_{00}^{-1}U_{01}$ .

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# Results

We used J.-G. Dumas Sparse Integer Matrix Collection as benchmark matrices.

## Hybrid versus Right-looking and GPLU

| Matrix                 | Right-looking | GPLU | Hybrid |
|------------------------|---------------|------|--------|
| GL7d/GL7d24            | 34            | 276  | 11.6   |
| Margulies/cat_ears_4_4 | 3             | 184  | 0.1    |
| Homology/ch7-8.b4      | 173           | 0.2  | 0.2    |
| Homology/ch7-8.b5      | 611           | 45   | 10.7   |

## Hybrid versus Wiedmann

| Matrix  | Wiedmann | Hybrid |
|---------|----------|--------|
| M0,6-D7 | 20397    | 0.8    |
| relat8  | 244      | 2      |
| relat9  | 176694   | 2024   |

# Conclusion

- Will be presented at the CASC conference.
- Implemented in C in the SpaSM(SPArse System Modulo  $p$ ) library and publicly available at:

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What's next ?

- Improve the research of pivots in the Faugère-Lacharte Heuristic.
- Benchmark on specific matrices collections (GBLA, Cado-NFS).

Thank you for your time !