# On Preconditioning Symmetric Indefinite Linear Systems 

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## Based on joint work with

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## Outline

1. Basic problem
2. Indefinite solvers - an overview
3. Preprocessing techniques
4. Preconditioning strategies
5. Numerical experiments
6. Conclusions

## 1. Basic problem

$$
A x=b
$$

- $A$ is $n \times n$, symmetric and indefinite
- $A$ is large and sparse


## Arises in many applications, often in specialized forms

- saddle-point problems (CFD, mixed FEM, optimization, optimal control, ...)
- "shift-and-invert", Jacobi-Davidson algorithms


## 2. Indefinite solvers - an overview

Saddle-point problems: specialized solvers

$$
\left(\begin{array}{cc}
A & B \\
B^{T} & -C
\end{array}\right)
$$

- Reduction to a definite system
- Schur complement approach
- dual variable (null-space) approach
- Solving original indefinite system
- direct solvers
- preconditioned iterative solvers
(block DIAG, block TR, constraint preconditioners, inner block reductions)
- Split and solve approaches (HSS iterations, HSS preconditioners)


## Our focus: general indefinite systems

- Sparse direct methods (MA27, MA47, MA57; Duff et al.)
- very powerful; inherent limits of direct methods
- Preconditioned iterative methods
- Block SSOR and symmetric ILUT preconditioners (Freund, 1997)
- Diagonal pivoting and inverse diagonal pivoting preconditioners; symmetric Krylov methods (Benzi, T., 2002); often useful for weakly indefinite systems
- Approximate diagonal pivoting decompositions (right-looking, based on linkedlists) for smoothing (Qu, Fish, 2001)
- Diagonal pivoting preconditioners with diagonal
and Bunch-Kaufmann pivoting (left-looking); nonsymmetric Krylov methods (Li, Saad, 2004).
- the problem is difficult: implementations/algorithms typically very fragile


# 3. Preprocessing techniques 

## Powerful matrix preorderings: nonsymmetric case

- permutation to get a nonzero diagonal a classical technique for nonsymmetric matrices (Duff, 1977)



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$$
\left(\begin{array}{lllll}
* & & * & & * \\
* & * & & * & 1 \\
* & * & * & & 2
\end{array}\right)
$$

# Powerful matrix preorderings: nonsymmetric case 

- strengthening diagonal/block-diagonal dominance
- e.g. sum/product matching problem maximize
sum/product of modules of transversal entries
- Olschowka, Neumaier, 1999; Duff, Koster, 1997, 2001; Benzi, Haws, T., 1999.
- but: permutations are generally nonsymmetric


## Symmetric case

- Idea of Iain Duff and John Gilbert (2002) split the loops of a nonsymmetric permutation
- our example:



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15

Symmetric case: symmetrized permutation based on the loops


Symmetric case: symmetrized permutation based on the loops

$\Downarrow$

$$
\left(\begin{array}{ccccc}
* & * & & * & \\
* & & & \\
& & & * & * \\
* & & * & & * \\
& & * & * &
\end{array}\right)
$$

Symmetric case: symmetrized permutation based on the loops
$\left(\begin{array}{lllll}* & & * & & * \\ & & * & * & \\ * & * & & * & \\ & * & * & & \\ * & & & & \end{array}\right)$

$\Downarrow$

$$
\left(\right)
$$

# Symmetric case: symmetrized permutation based on the loops 

- summarized idea:
bipartite matching $\rightarrow$ loops $\rightarrow$ general matching
- previous work based on this strategy:
- static preordering for direct methods: Duff, Pralet, 2004; additional criterion: based on sparsity of rows/columns
- preordering for approximate decompositions
for preconditioning : Hagemann, Schenk, 2004


## New idea: general graph matching

- avoids problems with splitting odd loops (not the problems with odd $n$ )
- how to define graph edge weights?



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# General graph matching: how to define graph weights 

- first possibility:

$$
w^{2} i g h t_{i j}=\left|a_{i j}\right|+\alpha\left(\left|a_{i i}\right|+\left|a_{j j}\right|\right)
$$

- $\alpha$ balances influence of diagonals and offdiagonals


# General graph matching: how to define graph weights 

- another approach: weights are entry sizes; derived (doubled) graph



## 4. Preconditioning strategies

- extended set of options with respect to Benzi, T. 2002
- right-looking (submatrix) implementation of incomplete decompositions
- Bunch-Parlett-Kaufmann family of pivoting options
- Bunch-Parlett with various pivotings
- Bunch-Kaufmann variations
- bounded Bunch-Kaufmann (Ashcraft, Grimes, Lewis, 1997)
- Bunch tridiagonal pivoting (Bunch, 1973; Hagemann, Schenk, 2004)
- Bunch-Kaufmann pentadiagonal pivoting
- approximate $L D L^{T}$ decomposition


## Other implemented preconditioners

- sparse $L T L^{T}$ decomposition
- slow (fill-in in exact case given by $\sum_{i=1}^{n} a d j(T[i])$ see Ashcraft, Grimes, Lewis, 1997)
- if incomplete, large growth in the submatrix
- saddle-point reconstruction
$-A=\left(\begin{array}{cc}\hat{A} & \hat{B} \\ \hat{B}^{T} & -\hat{C}\end{array}\right)$
- sometimes useful
- not much improvement for strongly indefinite problems
- block diagonal, block symmetric Gauss-Seidel; blocks based on matchings or TPABLO (O’Neil, Szyld,1990)


## 6. Experimental results

- preconditioned MINRES (implemented as smoothed CG;
similar results for preconditioned symmetric QMR)
- MMD on blocks/vertices, (see Qu, Fish, 2001; cf. Benzi, Szyld, Van Duin, 1999)
- presenting results with approximate diagonal pivoting decomposition; tridiagonal pivoting in most cases; whenever this fails, replaced by Bunch-Kaufmann pivoting
- bipartite matching: MC64 (Duff, Koster, 2001; HSL)
- general matching by greedy heuristics (tested also Blossom 3 (Cook, Rohe, 1998); SMP (Burkard, Derigs, 1980); WMATCH (Rothberg, 1973)).
- in some cases: other preprocessings are better:
e.g., TPABLO (O'Neil, Szyld, 1990)
- stopping criterion: relative residual norm reduction by $10^{-8}$
- a subset of matrices from Li, Saad (2004); Hagemann, Schenk (2004)


## Tested matrices

| Matrix | $n$ | $n z$ |
| :---: | :---: | :---: |
| $\mathrm{C}-41$ | 9769 | 55757 |
| $\mathrm{C}-19$ | 2327 | 12072 |
| $\mathrm{C}-64$ | 51035 | 384438 |
| $\mathrm{C}-70$ | 68924 | 363955 |
| $\mathrm{C}-71$ | 76638 | 468096 |
| traj33 | 20006 | 504090 |
| traj27 | 17148 | 242286 |
| stiff5 | 33410 | 177384 |
| mass05 | 33410 | 241140 |
| heat02 | 10295 | 90129 |

## Results of experiments

| Matrix | symm matching |  | general matching |  | no |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Size_p | its | Size_p | its | Siz |
| C-41 | 118323 | 315 | 117168 | 129 | 100 |
| C-19 | 26411 | 7 | 26805 | 8 | 278 |
| C-64 | 604274 | 63 | 615061 | 55 | 493 |
| C-70 | 1186138 | 12 | 1162256 | 9 | 865 |
| C-71 | 1421761 | 15 | 1421994 | 45 | 138 |
| traj33 | 221223 | 464 | 102629 | 186 | 102 |
| traj27 | 106633 | 471 | 105819 | 140 | 104 |
| stiff5 | 202983 | 80 | 217119 | 72 | 287 |
| mass05 | 41817 | 24 | 41216 | 52 | 568 |
| heat02 | 247912 | 34 | 410773 | 45 | 631 |

## 7. Conclusions

- approximate diagonal pivoting preconditioning is becoming a standard and reasonably reliable strategy
- block preprocessing techniques can improve the behavior; it should be developed further
- all preprocessings: still a gap before getting to be mature
- solving general indefinite systems is very difficult: in many cases only one specialized technique (Schur complement approach) works

