

# Improving the linear solver used in the interactive wave model of a real-time simulator

MSc graduation presentation

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# Introduction

- MSc Applied Mathematics graduation project at TU Delft
- Maritime Research Institute Netherlands



# Outline

- Wave model of a ship simulator
- Computational model
- Linear solvers
- Conclusions

# Ship simulator

Realistic ship motions in a wave field

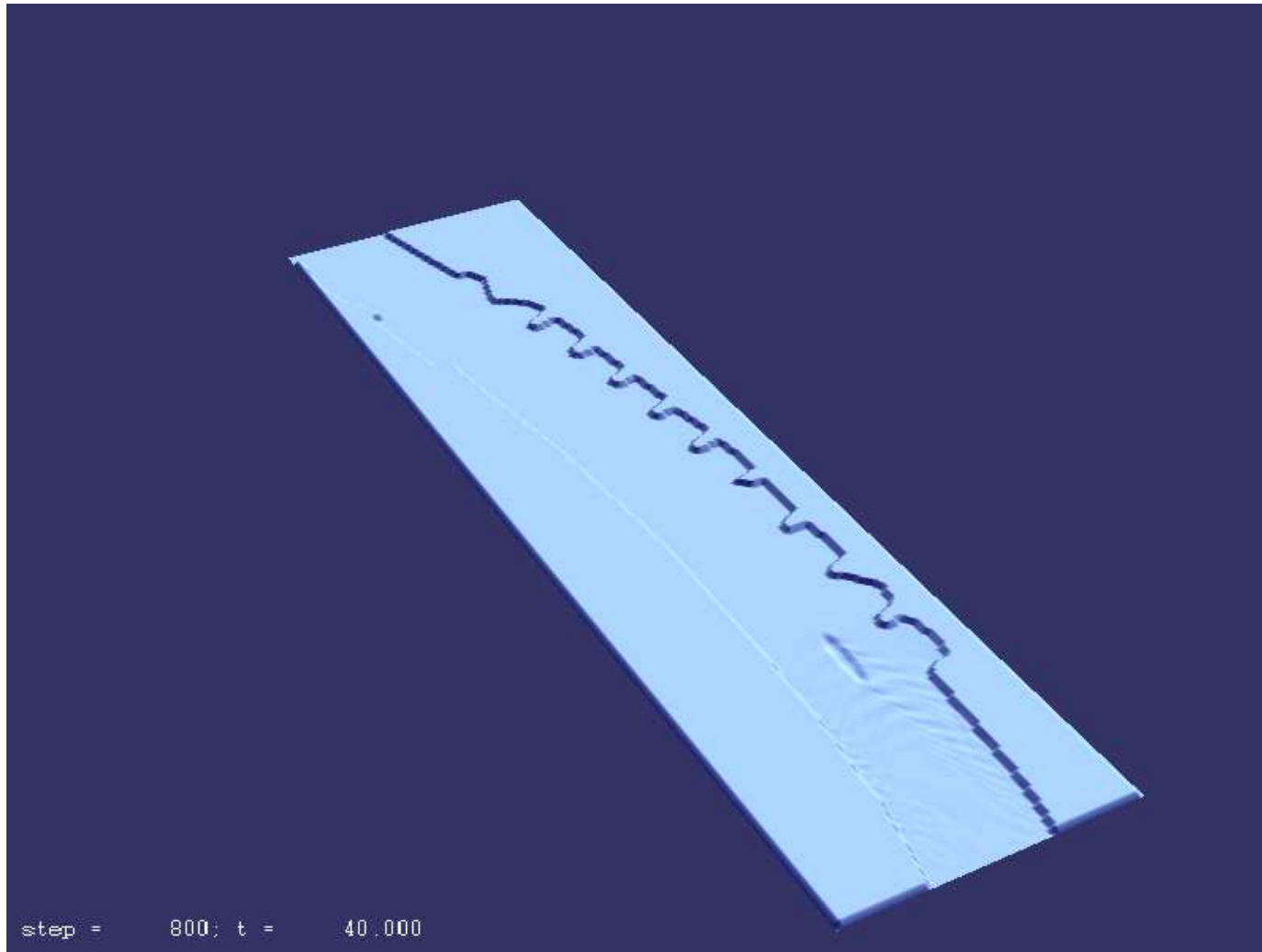
- Current wave model
  - Predefined wave spectrum

# Ship simulator

Realistic ship motions in a wave field

- Current wave model
  - Predefined wave spectrum
- New wave model
  - ‘Variational Boussinesq model’
  - Realistic wave patterns at changing water depth
  - Interacts with objects, like ships and breakwaters

# IJssel



# Variational Boussinesq model

Variational:

- Minimizing the total pressure in the fluid

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Linearization around the current

# Model equations

$$\frac{\partial \zeta}{\partial t} + \nabla \cdot (\zeta \mathbf{U} + h \nabla \varphi - h \mathcal{D} \nabla \psi) = 0$$

$$\frac{\partial \varphi}{\partial t} + \mathbf{U} \cdot \nabla \varphi + g \zeta = P_s$$

$$\mathcal{M} \psi + \nabla \cdot (h \mathcal{D} \nabla \varphi - \mathcal{N} \nabla \psi) = 0$$

$\zeta$  water height

$\varphi$  surface velocity potential

$\psi$  vertical shape variable

$g$  gravitation

$h$  water depth

$\mathbf{U}$  current

$P_s$  pressure pulse ship

$\mathcal{D}, \mathcal{M}, \mathcal{N}$  model parameters

# Numerical discretization

- Finite volume method
  - Rectangular grid
  - Central differences
  - Five-point stencil
- Leapfrog method

# Elliptic equation

Third model equation:

$$-\nabla \cdot (\mathcal{N} \nabla \psi) + \mathcal{M} \psi = \nabla \cdot (h \mathcal{D} \nabla \varphi)$$

The positive parameters  $\mathcal{N}$ ,  $\mathcal{M}$  and  $\mathcal{D}$  depend on water depth  $h$

After discretization

$$S\vec{\psi} = \mathbf{b}$$

# Goal of project

Solve

$$S\vec{\psi} = \mathbf{b}$$

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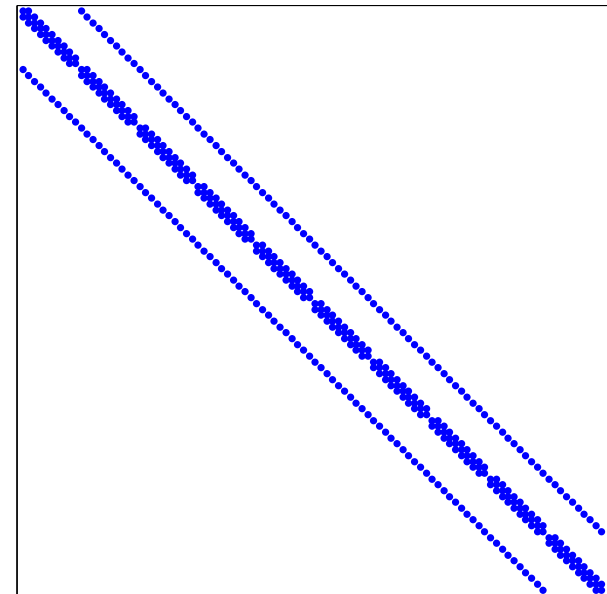
Solve

$$S\vec{\psi} = \mathbf{b}$$

- Currently, domain of  $1 \times 1 \text{ km}$  with cells of  $5 \times 5 \text{ m}$ , so 40 000 linear equations
- In  $0.05 \text{ s}$  time
- Larger domains in the future:  $10 \times 10 \text{ km}$

# Matrix properties

- Pentadiagonal
- Strictly diagonally dominant
- Symmetric
- Positive definite
  - $\lambda_{\min} = \mathcal{O}(h^2)$
  - $\lambda_{\max} = \mathcal{O}(1 + h^2)$



# Iterative linear solver

- Solve  $S\psi = \mathbf{b}$
- Choose start vector  $\psi^0$
- Perform iteration

$$\psi^0 \rightarrow \psi^1 \rightarrow \psi^2 \rightarrow \dots \rightarrow \psi^k$$

- Stop when  $\|\mathbf{b} - S\psi^k\|$  small



# Preconditioned Conjugate Gradient

- The CG-method is applied to  $S\psi = \mathbf{b}$ , since  $S$  is spd
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Preconditioned system

$$M^{-1}S\psi = M^{-1}\mathbf{b}$$

- $M^{-1}S$  more favorable eigenvalues
- $M\mathbf{x} = \mathbf{b}$  easy to solve

# Implemented linear solvers

## Preconditioned Conjugate Gradient

- Diagonal scaling
- Modified Incomplete Cholesky
- Repeated Red-Black

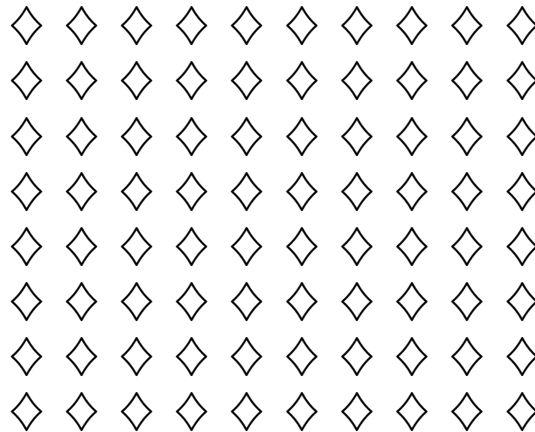
# Implemented linear solvers

## Preconditioned Conjugate Gradient

- Diagonal scaling
- **Relaxed** Incomplete Cholesky
- Repeated Red-Black -  $k$

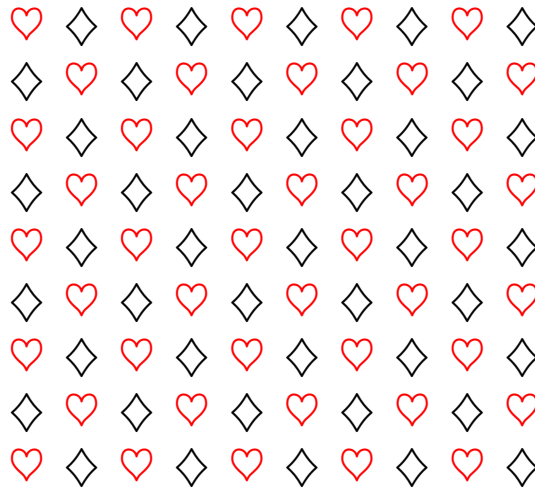
## Deflation

# Repeated Red-Black



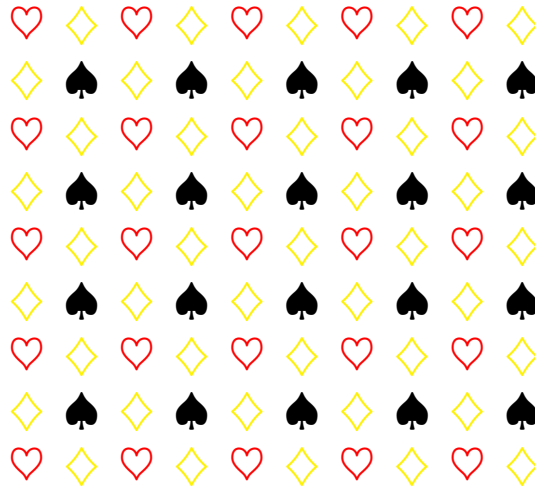
5-point stencils

# Repeated Red-Black

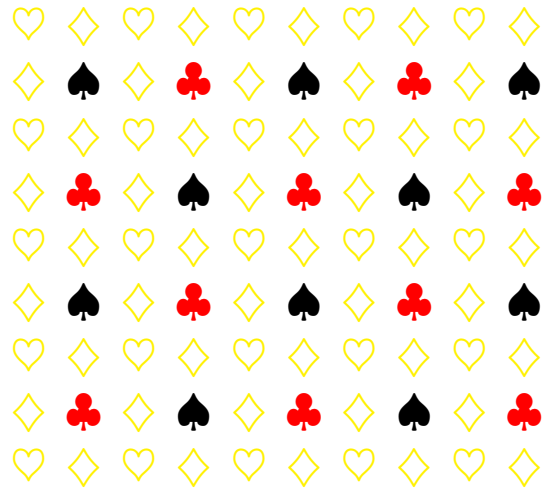


- Gaussian elimination of black points
- 9-point stencils on red points
- lump the four outer elements towards center element  
⇒ 5-point stencil

# Repeated Red-Black

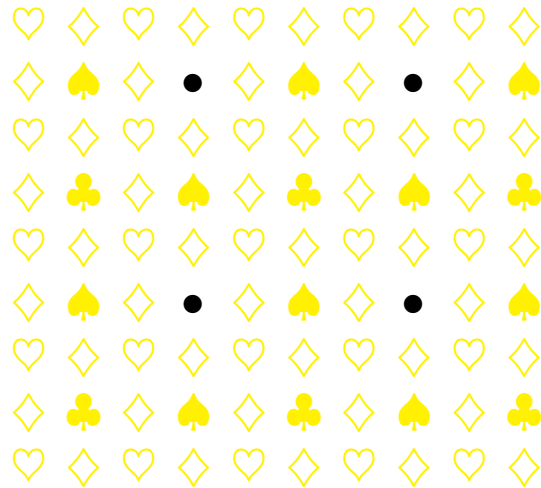


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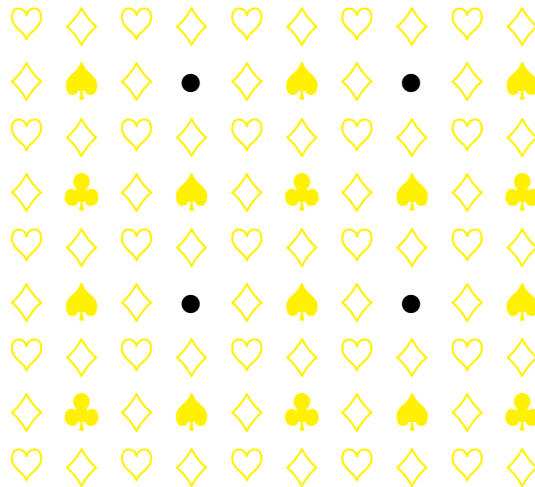




# Repeated Red-Black



# Repeated Red-Black



- Depending on test problem 5 – 25 % reduction of CPU-time
- Theoretical result of a smaller order of convergence: less than  $\mathcal{O}(h^{-\frac{1}{2}})$  iterations

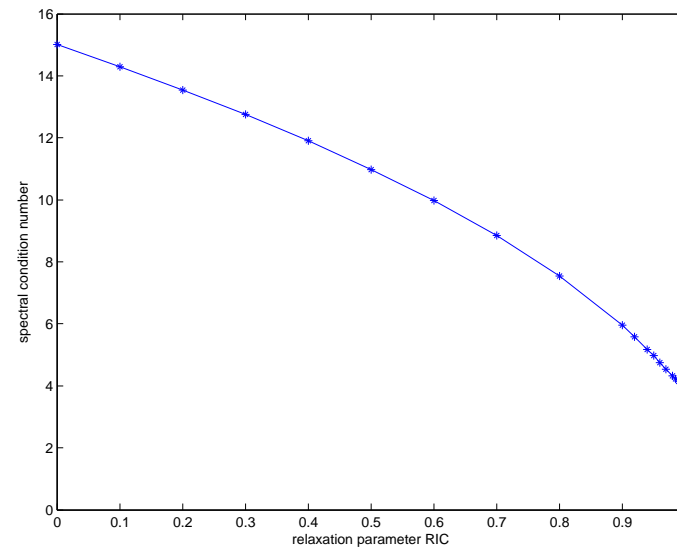
# Relaxed Incomplete Cholesky

- Incomplete Cholesky decomposition:  $S \approx LL^T$
- Fill-in discarded  $\rightarrow$  IC
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- Combination of IC and MIC  $\rightarrow$  RIC

Spectral condition number of RIC  
at open sea of  $32 \times 32$  nodes



# Deflation method

- Map some vectors into the null-space
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- Subdomain deflation, piecewise-constant deflation vectors

# Deflated Relaxed Incomplete Cholesky

# subd.	$\omega = 0$ (IC)	$\omega = 0.5$	$\omega = 1$ (MIC)
$0 \times 0$	32.895	28.184	17.144
$10 \times 10$	31.261	27.008	17.141
$40 \times 40$	18.006	16.329	17.072
$160 \times 160$	8.740	8.732	14.225

Number of CG-iterations, at open sea of  $400 \times 400$  nodes

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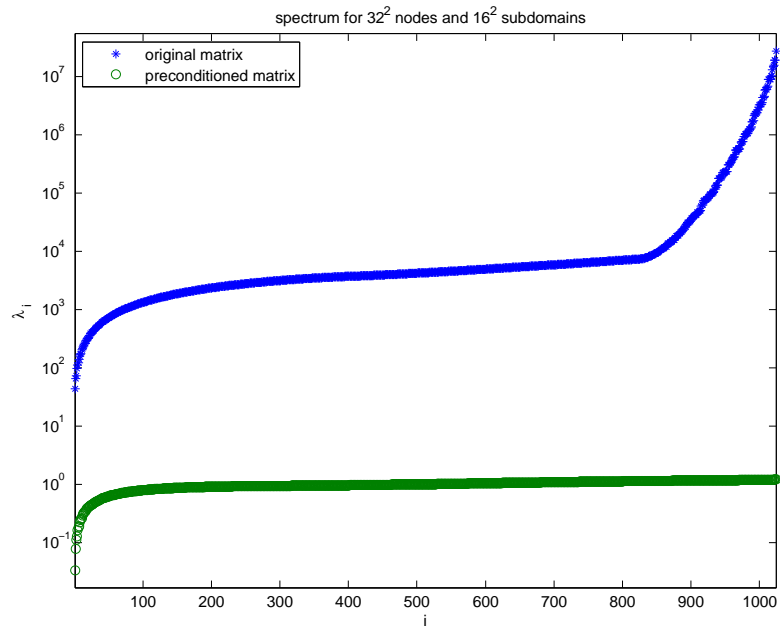
# subd.	$\omega = 0$ (IC)	$\omega = 0.5$	$\omega = 1$ (MIC)
$0 \times 0$	981.0	845.0	525.3
$10 \times 10$	1243.5	1048.6	701.7
$40 \times 40$	743.3	661.2	704.8
$160 \times 160$	996.1	969.8	1500.6

CPU-time

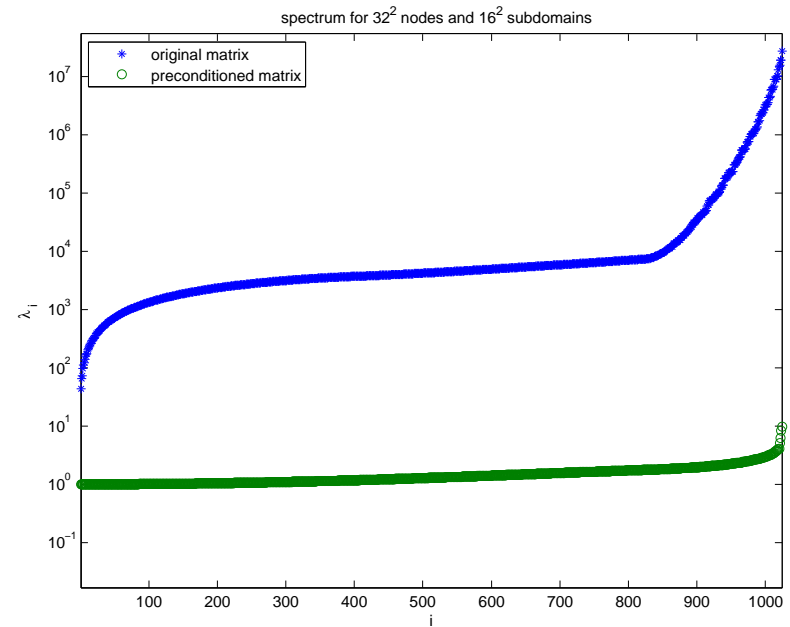


# Spectrum DRICCG

IC

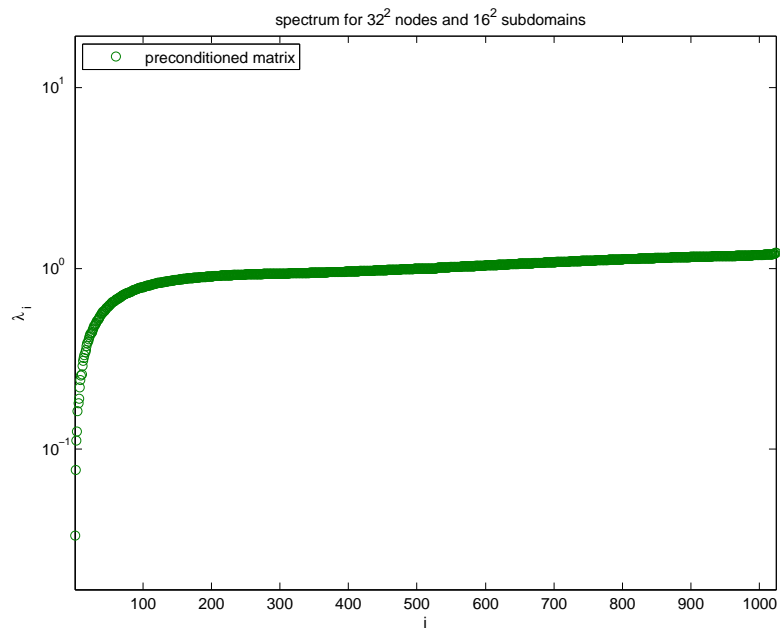


MIC

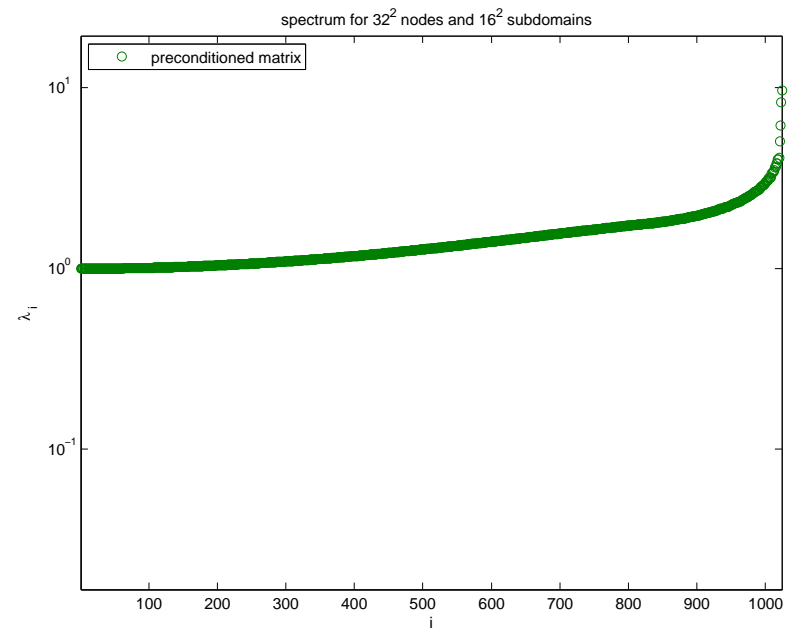


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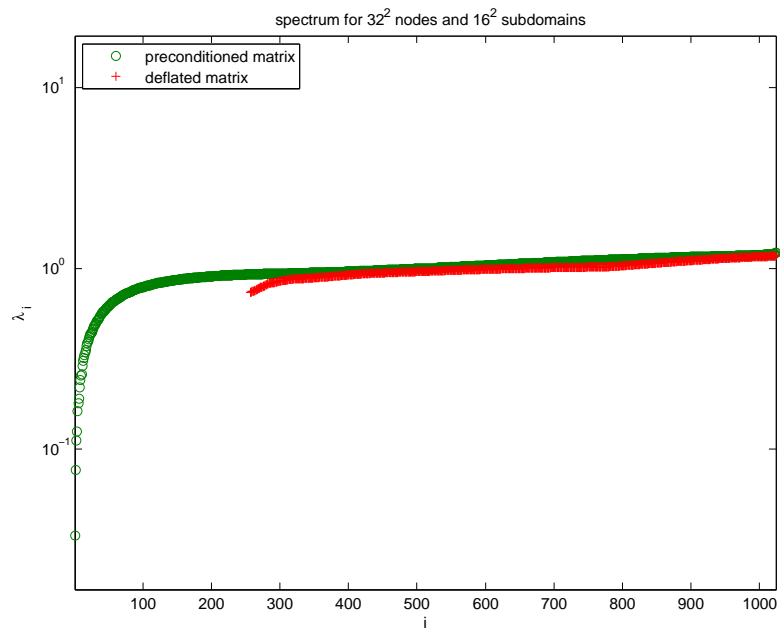


MIC

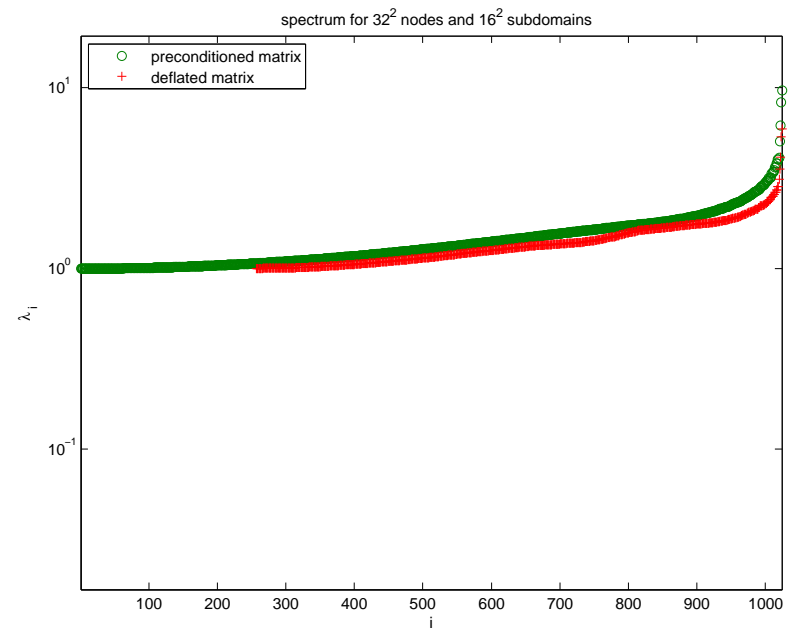


# Spectrum DRICCG

IC



MIC



# Comparison of methods

Order of spectral condition number

Dgs	IC	MIC	RRB	RRB- $k$
$\mathcal{O}(h^{-2})$	$\mathcal{O}(h^{-2})$	$\mathcal{O}(h^{-1})$	$\mathcal{O}(h^{-1})$	$\leq \mathcal{O}(h^{-1})$

Deflation can reduce the order

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Deflation can reduce the order

CPU-time, at open sea of  $200 \times 200$  nodes

Dgs	IC	MIC	RRB	RRB- $k$
0.0624	0.0535	0.0395	0.0561	0.0496

# Conclusions

- Full description of wave model given
- Improved RRB
- Deflation can improve RICCG
- Block DRICCG: parallelizable