

# Solving the Load Flow and Helmholtz Equations using PETSc

Domenico Lahaye and helping friends

DIAM - TU Delft

PETSc-20, June 15th-18th, 2015

# Helping Friends

- Reijer Idema (graduated November 2012)
- Abdul Sheikh Hannan (graduated November 2013)
- Romain Thomas (PhD started October 2012)
- Martijn de Jong (PhD started October 2012)
- Prof. Kees Vuik
- ...

# Outline

- 1 **Newton-Krylov Solver for the Load Flow Equations**
- 2 **Accelerating the Complex Shifted Laplacian using Deflation**
- 3 **Conclusions**

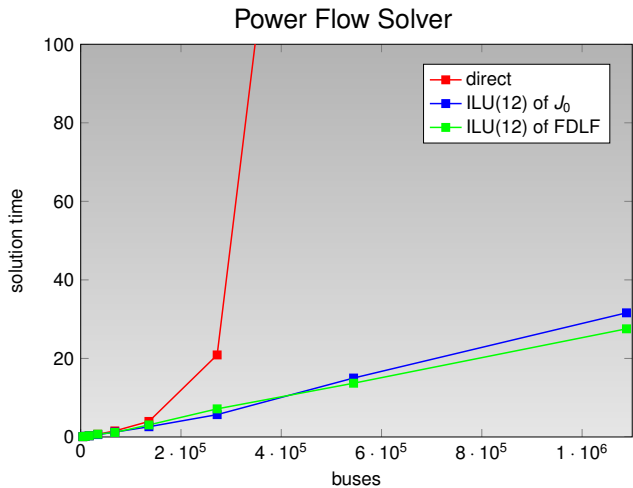
# Future Power Systems = Power Webs

- **large**: European study (UCTE) model with 10,000+ nodes
- **bi-directional**: market mechanisms
- **uncertainty**: time-variable production by renewables
- **operated closer to limits**: electrical vehicle charging

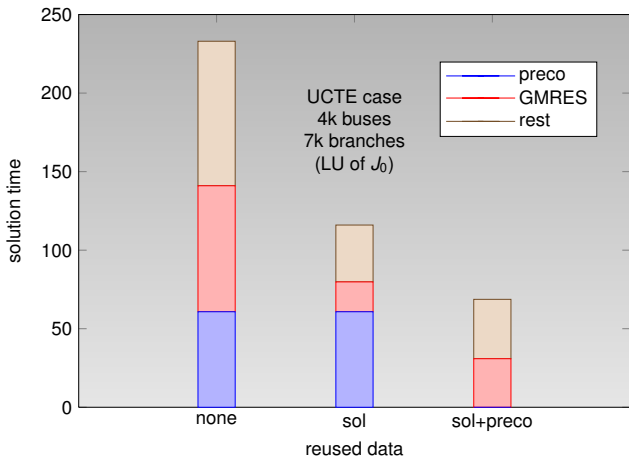


# Load Flow Equations

- $x$ : voltage amplitude and phase at each node in network
- $F(x) = 0$ : non-linear system matching generation with demand
- $J_i x_i = F_i$ : linear system at  $i$ -th Newton iteration
- in the past solved by direct methods
- currently solved approximately by ILU/GMRES
- implemented in PETSc



## Contingency Analysis Solver







Atlantis Studies in Scientific Computing in Electromagnetics  
*Series Editor: Wil Schilders*

Reijer Idema  
Domenico J. P. Lahaye

# Computational Methods in Power System Analysis

# Outline

- 1 **Newton-Krylov Solver for the Load Flow Equations**
- 2 **Accelerating the Complex Shifted Laplacian using Deflation**
- 3 **Conclusions**

# Helmholtz Equation

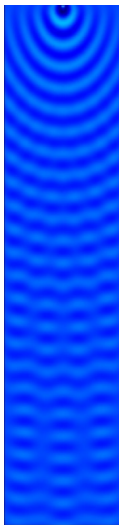
$$-\Delta \mathbf{u}(x, y) - k^2 \mathbf{u}(x, y) = \mathbf{g}(x, y) \text{ on } \Omega$$

Dirichlet and/or Sommerfeld on  $\partial\Omega$

finite differences or elements

$Au = f$  sparse complex symmetric

all standard solvers fail



# Complex Shifted Laplace Preconditioner

preconditioning by **damping**

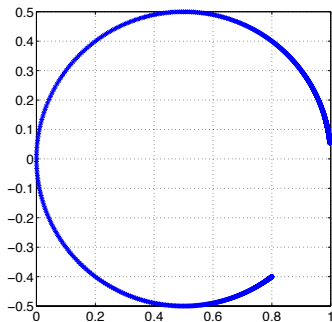
$$M : -\Delta \mathbf{u} - (1 + \beta_2 i) k^2 \mathbf{u}$$

$M$ -solve using multigrid

$M^{-1}A$  favorable spectrum

standard in many applications

Erlangga e.a. 2006



# Complex Shifted Laplace Preconditioner

Number of outer Krylov iterations

| Grid      | Wavenumber |           |           |           |           |           |
|-----------|------------|-----------|-----------|-----------|-----------|-----------|
|           | $k = 10$   | $k = 20$  | $k = 30$  | $k = 40$  | $k = 50$  | $k = 100$ |
| $n = 32$  | <b>10</b>  | 17        | 28        | 44        | 70        | 13        |
| $n = 64$  | 10         | <b>17</b> | 28        | 36        | 45        | 173       |
| $n = 96$  | 10         | 17        | <b>27</b> | 35        | 43        | 36        |
| $n = 128$ | 10         | 17        | 27        | <b>35</b> | 43        | 36        |
| $n = 160$ | 10         | 17        | 27        | 35        | <b>43</b> | 25        |
| $n = 320$ | 10         | 17        | 27        | 35        | 42        | <b>80</b> |

# Complex Shifted Laplace Preconditioner

## Good News

- SLP preconditioner renders spectrum favorable to Krylov

## However ...

- eigenvalues rush to zero as  $k$  increases
- outer Krylov convergence limited by near-null space

Can deflation improve?

# Deflation using Multigrid Vectors

## Deflation perspective

- replace preconditioned system  $M^{-1} A = M^{-1} b$
- by deflated preconditioned system  $P^T M^{-1} A = P^T M^{-1} b$
- deflation vectors  $Z$  and Galerkin coarse grid matrix  $E = Z^T A Z$
- deflation operator  $P = I - A Q$  where  $Q = Z E^{-1} Z^T$
- $P$ : projection (later modified to shift to 1)
- $Z$ : columns of the coarse to fine grid interpolation  
good approx to near-null space for  $k h$  fixed

# Deflation using Multigrid Vectors

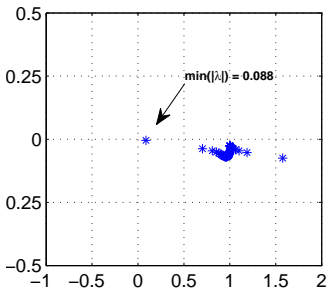
## Multigrid perspective

- replace smoother  $I - M^{-1} A$   
( $M$  complex shifted-Laplacian,  $M^{-1}$  as before)
- by smoother + coarse grid solve  $(I - QA) (I - M^{-1} A)$   
( $Q = Z E^{-1} Z^T$  coarse grid solve,  $E^{-1}$  new element)
- Fourier two-grid analysis for
  - 1D problem with Dirichlet bc
  - uniform coarsening
  - $E$  and  $M$  inverted exactly

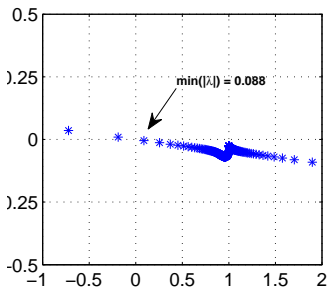


# Spectrum Deflated Preconditioned Operator

$k = 100$



$k = 1000$



tighter clusters at low frequency

spread due to  $E^{-1}$  at high frequency

# Avoiding Eigenvalue Spread at High Wavenumber

- deflate friend of  $A$  instead of  $A$  (unsuccessful)
- choose other deflation vectors (under investigation)

# Deflation using Multigrid Vectors

## Multilevel Extension

- composite two-level preconditioner  $P^T M^{-1} A = P^T M^{-1} b$
- deflation operator  $P = I - A Q$  where  $Q = Z E^{-1} Z^T$
- coarse grid Helmholtz operator  $E = Z^T A Z$
- apply idea recursively to apply  $P$
- multilevel Krylov method (Erlangga-Nabben 2009)

# Convergence Outer Krylov Acceleration

Number of outer Krylov iterations with/without deflation

| Grid      | $k = 10$    | $k = 20$    | $k = 30$    | $k = 40$    | $k = 50$    | $k = 100$    |
|-----------|-------------|-------------|-------------|-------------|-------------|--------------|
| $n = 32$  | <b>5/10</b> | 8/17        | 14/28       | 26/44       | 42/70       | 13/14        |
| $n = 64$  | 4/10        | <b>6/17</b> | 8/28        | 12/36       | 18/45       | 173/163      |
| $n = 96$  | 3/10        | 5/17        | <b>7/27</b> | 9/35        | 12/43       | 36/97        |
| $n = 128$ | 3/10        | 4/17        | 6/27        | <b>7/35</b> | 9/43        | 36/85        |
| $n = 160$ | 3/10        | 4/17        | 5/27        | 6/35        | <b>8/43</b> | 25/82        |
| $n = 320$ | 3/10        | 4/17        | 4/27        | 5/35        | 5/42        | <b>10/80</b> |

Less iterations and therefore speedup

(Abdul Sheikh Hannan, D.L. and Kees Vuik, NLA, 2013).

# Numerical Results

3D problem with wedge-like contrast in wavenumber  
using 20 grid points per wavelength

| Wave number $k$ | Solve Time |          | Iterations |          |
|-----------------|------------|----------|------------|----------|
|                 | PREC       | DEF+PREC | PREC       | DEF+PREC |
| 5               | 0.09       | 0.24     | 9          | 11       |
| 10              | 1.07       | 1.94     | 15         | 12       |
| 20              | 16.70      | 18.89    | 32         | 16       |
| 30              | 73.82      | 78.04    | 43         | 21       |
| 40              | 1304.2     | 214.7    | 331        | 24       |
| 60              | xx         | 989.5    | xx         | 34       |

speedup in CPU of by a factor 6

(Abdul Sheikh Hannan, D.L. and Kees Vuik, submitted to JCP).

# Numerical Results

2D Marmousi Problem  
using 20 grid points per wavelength

| Frequency $f$ | Solve Time |          | Iterations |          |
|---------------|------------|----------|------------|----------|
|               | PREC       | DEF+PREC | PREC       | DEF+PREC |
| 1             | 1.23       | 5.08     | 13         | 7        |
| 10            | 40.01      | 21.83    | 106        | 8        |
| 20            | 280.08     | 131.30   | 177        | 12       |
| 40            | 20232.6    | 3997.7   | 340        | 21       |

speedup in CPU of by a factor 5

# Conclusions

## Newton-Krylov Load Flow Solver

- **scalable** much faster for large problems
- **flexible** reuse of data in contingency analysis

## Deflated Shifted-Laplacian Helmholtz Solver

- **less** iterations than shifted-Laplacian
- **faster** than shifted-Laplacian solver for sufficiently large problems

# Conclusions

## Newton-Krylov Load Flow Solver

- **scalable** much faster for large problems
- **flexible** reuse of data in contingency analysis

## Deflated Shifted-Laplacian Helmholtz Solver

- **less** iterations than shifted-Laplacian
- **faster** than shifted-Laplacian solver for sufficiently large problems

Happy 20th Birthday PETSc!