Scientific Computing *Lecture 7* **Delft University of Technology**

Vandana Dwarka and Kees Vuik October 17, 2024

Today

- Chapter 5:
	- Jacobi method
	- Gauss-Seidel (GS) method
	- Convergence
	- Block Jacobi/GS method
	- damped Jacobi/SOR

Recap: Basic Iterative Methods

Notation: u^k is the k-th iteration.

- Error: $e^k = u u^k$
- Residual: $r^k = f Au^k$
- Residual equation: $Ae^{k} = Au Au^{k} = f Au^{k} = r^{k}$

Splitting method: $A = M - N$. $Au = f \Rightarrow Mu^{k+1} = f + Nu^k$ $u^{k+1} = M^{-1}f + M^{-1}Nu^k$

Substituting $N = M - A$ we get:

$$
u^{k+1} = M^{-1}f + M^{-1}(M - A)u^{k}
$$

= $u^{k} + M^{-1}(f - Au^{k})$
= $u^{k} + M^{-1}(r^{k})$

Recap: Convergence

Does this iterative scheme converge? I.e. $u^{k+1} \rightarrow u$ as k goes to infinity?

$$
u^{k+1} = u^k + M^{-1} (f - Au^k)
$$

\n
$$
u - u^{k+1} = u - u^k - M^{-1} (Au - Au^k)
$$

\n
$$
e^{k+1} = e^k - M^{-1} A e^k \Rightarrow e^{k+1} = (I - M^{-1} A) e^k
$$

\nWe define the iteration matrix $B = I - M^{-1} A$ such that

ine the iteration matrix $B = I - M^{-1}A$ such that:

$$
e^{k+1} = B^k e^0
$$

For convergence: $\left\|\mathsf{m}_{k\rightarrow\infty}\right\| \left\|\mathsf{B}^{k}\right\|_{2}=0$, which using theorem 2.7.2 is equivalent to:

$$
\lim_{k\to\infty}\left\|B^k\right\|_2=0 \Leftrightarrow \rho(B)<1
$$

§ 5.3: Prototypes

Different notation:

$$
A=D-E-F\in\mathbb{R}^{n\times n}
$$

where *D*, −*E* and −*F* denote the diagonal, the strictly lower and the strictly upper triangular part of A.

§ 5.3: Prototypes

Different notation:

$$
A=D-E-F\in\mathbb{R}^{n\times n}
$$

where *D*, −*E* and −*F* denote the diagonal, the strictly lower and the strictly upper triangular part of A.

Using this, we can write:

$$
\hat{E} = D^{-1}E \text{ and } \hat{F} = D^{-1}F.
$$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

This is equivalent to:

$$
2u_1 - u_2 = 1
$$

-u₁ + 2u₂ - u₃ = 1
-u₂ + 2u₃ = 1

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

This is equivalent to:

But also to:

 $2u_1 - u_2 = 1$ $-u_1 + 2u_2 - u_3 = 1$ $-u_2 + 2u_3 = 1$

$$
2u_1 = 1 + u_2
$$

\n
$$
2u_2 = 1 + u_1 + u_3
$$

\n
$$
2u_3 = 1 + u_2
$$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

This is equivalent to:

But also to:

 $2u_1 - u_2 = 1$ $-u_1 + 2u_2 - u_3 = 1$ $-u_2 + 2u_3 = 1$ $2u_1 = 1 + u_2$ $2u_2 = 1 + u_1 + u_3$ $2u_3 = 1 + u_2$

In an iterative scheme we can update using previous information!

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

$$
2u_1 = 1 + u_2
$$

\n
$$
2u_2 = 1 + u_1 + u_3
$$

\n
$$
2u_3 = 1 + u_2
$$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Using iteration k :

$$
2u_1 = 1 + u_2
$$

\n
$$
2u_2 = 1 + u_1 + u_3
$$

\n
$$
2u_3 = 1 + u_2
$$

$$
2u1k+1 = 1 + u2k
$$

$$
2u2k+1 = 1 + u1k + u3k
$$

$$
2u3k+1 = 1 + u2k
$$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Using iteration k :

 $2u_1{}^{k+1} = 1 + u_2{}^k$ $2u_2^{k+1} = 1 + u_1^k + u_3^k$ $2u_3{}^{k+1}=1+u_2{}^k$

Example with 1D Poisson (BC eliminated)

 $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Using iteration k:
$$
Splitting notation:\n $2u_1^{k+1} = 1 + u_2^k$
\n $2u_2^{k+1} = 1 + u_1^k + u_3^k$
\n $2u_3^{k+1} = 1 + u_2^k$
\n $M = \frac{1}{h^2} \begin{pmatrix} 2 & 0 & 0 \\ 0 & 2 & 0 \\ 0 & 0 & 2 \end{pmatrix}, N = \frac{1}{h^2} \begin{pmatrix} 0 & 1 & 0 \\ 1 & 0 & 1 \\ 0 & 1 & 0 \end{pmatrix}$
$$

Jacobi method is taking $M = diag(A) = D$

Jacobi method is taking $M = diag(A) = D$

Using iteration k :

$$
2u1k+1 = 1 + u2k
$$

$$
2u2k+1 = 1 + u1k + u3k
$$

$$
2u3k+1 = 1 + u2k
$$

Jacobi method is taking $M = diag(A) = D$

Using iteration k :

$$
2u1k+1 = 1 + u2k
$$

$$
2u2k+1 = 1 + u1k + u3k
$$

$$
2u3k+1 = 1 + u2k
$$

Or equivalently: $M = D$ and $N = E + F$, in $M u^{k+1} = f + N u^k$

$$
M = \frac{1}{h^2} \begin{pmatrix} 2 & 0 & 0 \\ 0 & 2 & 0 \\ 0 & 0 & 2 \end{pmatrix}, N = \frac{1}{h^2} \begin{pmatrix} 0 & 1 & 0 \\ 1 & 0 & 1 \\ 0 & 1 & 0 \end{pmatrix}
$$

Example with 1D Poisson (BC eliminated) $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Example with 1D Poisson (BC eliminated) $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Jacobi:

$$
2u1k+1 = 1 + u2k
$$

\n
$$
2u2k+1 = 1 + u1k + u3k
$$

\n
$$
2u3k+1 = 1 + u2k
$$

Example with 1D Poisson (BC eliminated) $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Jacobi:

$$
2u1k+1 = 1 + u2k
$$

$$
2u2k+1 = 1 + u1k + u3k
$$

$$
2u3k+1 = 1 + u2k
$$

Gauss-Seidel:

$$
2u1k+1 = 1 + u2k
$$

$$
-u1k+1 + 2u2k+1 = 1 + u3k
$$

$$
-u2k+1 + 2u3k+1 = 1
$$

Example with 1D Poisson (BC eliminated) $A \in \mathbb{R}^{3 \times 3}$ with

$$
A = \frac{1}{h^2} \begin{pmatrix} 2 & -1 & 0 \\ -1 & 2 & -1 \\ 0 & -1 & 2 \end{pmatrix}, \quad f = \begin{pmatrix} 1 \\ 1 \\ 1 \end{pmatrix}, \quad u = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

such that $Au = f$

Jacobi:

$$
2u1k+1 = 1 + u2k
$$

$$
2u2k+1 = 1 + u1k + u3k
$$

$$
2u3k+1 = 1 + u2k
$$

Gauss-Seidel:

$$
2u1k+1 = 1 + u2k
$$

$$
-u1k+1 + 2u2k+1 = 1 + u3k
$$

$$
-u2k+1 + 2u3k+1 = 1
$$

Or equivalently: $M = D - E$ and $N = F$, in $Mu^{k+1} = f + Nu^k$

$$
M = \frac{1}{h^2} \begin{pmatrix} 2 & 0 & 0 \\ -1 & 2 & 0 \\ 0 & -1 & 2 \end{pmatrix}, N = \frac{1}{h^2} \begin{pmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{pmatrix}
$$

§ 5.3.1: Jacobi and GS

Jacobi:

$$
\mathsf{GS} \colon
$$

$$
u^{k+1} = D^{-1}\left[(E+F)u^k + f \right]
$$

Component wise update:

Component wise update:

 $u^{k+1} = \hat{E} u^{k+1} + \hat{F} u^k + D^{-1}t$

$$
u_i^{k+1} = \left[f_i - \sum_{j=1, j\neq i}^n a_{ij} u_j^k \right] / a_{ii} \quad u_i^{k+1} = \left[f_i - \sum_{j=1}^{i-1} a_{ij} u_j^{k+1} - \sum_{j=i+1}^n a_{ij} u_j^k \right] / a_{ii}
$$

Recall: x-line lexicographic ordering (2D)

Recall: x-line lexicographic ordering (2D)

Update in blocks or 'aggregates' of u to accelerate convergence!

$$
\hat{U}_1 = \begin{pmatrix} u_1 \\ u_2 \\ u_3 \end{pmatrix}
$$

 u_o

 $u₆$

 u_3

 u_3

$$
\hat{U}_2 = \begin{pmatrix} u_4 \\ u_5 \\ u_6 \end{pmatrix}
$$

 $\overline{ }$

 u_2 u_3

 $\Big\}$

 $\hat{U}_1 =$

Then $Au = f$ can be written as:

$$
\begin{pmatrix} A_{11} & A_{12} & A_{13} \ A_{21} & A_{22} & A_{23} \ A_{31} & A_{32} & A_{33} \end{pmatrix} \begin{pmatrix} \hat{U}_1 \\ \hat{U}_2 \\ \hat{U}_3 \end{pmatrix} = \begin{pmatrix} \hat{F}_1 \\ \hat{F}_2 \\ \hat{F}_3 \end{pmatrix}.
$$

Then $Au = f$ can be written as:

$$
\begin{pmatrix} A_{11} & A_{12} & A_{13} \ A_{21} & A_{22} & A_{23} \ A_{31} & A_{32} & A_{33} \end{pmatrix} \begin{pmatrix} \hat{U}_1 \\ \hat{U}_2 \\ \hat{U}_3 \end{pmatrix} = \begin{pmatrix} \hat{F}_1 \\ \hat{F}_2 \\ \hat{F}_3 \end{pmatrix}.
$$

For the 2D poisson problem with elim. (lecture 3, slide 7), we get:

$$
A_{11} = A_{22} = A_{33} = \frac{1}{h^2} \begin{pmatrix} 4 & -1 & 0 \\ -1 & 4 & -1 \\ 0 & -1 & 4 \end{pmatrix}
$$

\n
$$
A_{12} = A_{21} = A_{23} = A_{32} = \frac{1}{h^2} \begin{pmatrix} -1 & 0 & 0 \\ 0 & -1 & 0 \\ 0 & 0 & -1 \end{pmatrix}^T
$$

\n
$$
A_{13} = A_{31} = \begin{pmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix}
$$

§ 5.3.1: Faster Convergence (Block-Jacobi)

Block-Jacobi: $M = [A_{11}, A_{22}, A_{33}]$ (block-diagonal of A). At iteration k :

$$
A_{11}\hat{U}_{1}^{k+1} = \hat{F}_{1} - A_{12}\hat{U}_{2}^{k}
$$

\n
$$
A_{22}\hat{U}_{2}^{k+1} = \hat{F}_{2} - A_{21}\hat{U}_{1}^{k} - A_{23}\hat{U}_{3}^{k}
$$

\n
$$
A_{33}\hat{U}_{3}^{k+1} = \hat{F}_{3} - A_{32}\hat{U}_{2}^{k}
$$

§ 5.3.1: Faster Convergence (Block-Jacobi)

Block-Jacobi: $M = [A_{11}, A_{22}, A_{33}]$ (block-diagonal of A). At iteration k :

$$
A_{11}\hat{U}_{1}^{k+1} = \hat{F}_{1} - A_{12}\hat{U}_{2}^{k}
$$

\n
$$
A_{22}\hat{U}_{2}^{k+1} = \hat{F}_{2} - A_{21}\hat{U}_{1}^{k} - A_{23}\hat{U}_{3}^{k}
$$

\n
$$
A_{33}\hat{U}_{3}^{k+1} = \hat{F}_{3} - A_{32}\hat{U}_{2}^{k}
$$

Block wise update:

$$
\hat{U}_{i}^{k+1} = A_{i,i}^{-1} \left[F_i - \sum_{j=1, j \neq i}^{q} A_{i,j} \hat{U}_{j}^{k} \right] \quad \forall i = 1, \ldots, q
$$

§ 5.3.1: Error Propagation

For the iteration matrices $B_{JAC} = I - M_{JAC}^{-1}A$ and $B_{GS} = I - M_{GS}^{-1}A$, we get¹

$$
B_{JAC} = I - D^{-1}(D - E - F)
$$

= I - I + D^{-1}E + D^{-1}F
= \hat{E} + \hat{F},

$$
B_{GS} = I - (D - E)^{-1}(D - E - F)
$$

= I - I + (D - E)^{-1}F
= (D - E)^{-1}DD^{-1}F
= (I - E)^{-1}\hat{F}

§ 5.4.1: Convergence (General)

Theorem 5.4.1

$$
\rho(B)=\rho\left(I-M^{-1}A\right)<1\Leftrightarrow \left\{\mathbf{u}^{k}\right\}_{k=1}^{\infty}\textrm{ converges}.
$$

§ 5.4.1: Convergence (General)

Theorem 5.4.1

$$
\rho(B) = \rho \left(I - M^{-1}A\right) < 1 \Leftrightarrow \left\{ \mathbf{u}^k \right\}_{k=1}^{\infty} \text{ converges.}
$$

Recall: iteration matrix $B = I - M^{-1}A$ defines error propagation:

$$
e^{k+1} = B^k e^0
$$

For convergence: $\left\|\mathsf{m}_{k\rightarrow\infty}\right\| \left\|\mathsf{B}^{k}\right\|_{2}=0$, which using theorem 2.7.2 is equivalent to:

$$
\lim_{k \to \infty} ||B^k||_2 = 0 \Leftrightarrow \rho(B) < 1
$$

§ 5.4.4: Convergence (Jacobi) Diagonal Dominance

Theorem 5.4.2

Theorem 5.4.2 Assume $A \in \mathbb{R}^{n \times n}$ to be strongly row diagonally dominant. Then the Jacobi and GaussSeidel method applied to A converge, i.e.,

$$
\sum_{j=1, j\neq i}^{n} |a_{ij}| < |a_{ii}| \quad \forall i = 1, \ldots, n \Rightarrow ||B_{GS}||_{\infty} \leq ||B_{JAC}||_{\infty} < 1
$$

§ 5.4.4: Convergence (Jacobi) Diagonal Dominance

Theorem 5.4.2

Theorem 5.4.2 Assume $A \in \mathbb{R}^{n \times n}$ to be strongly row diagonally dominant. Then the Jacobi and GaussSeidel method applied to A converge, i.e.,

$$
\sum_{j=1, j\neq i}^{n} |a_{ij}| < |a_{ii}| \quad \forall i = 1, \ldots, n \Rightarrow ||B_{GS}||_{\infty} \leq ||B_{JAC}||_{\infty} < 1
$$

$$
||B_{JAC}||_{\infty} = ||\hat{E} + \hat{F}||_{\infty} = \max_{1 \leq i \leq n} \sum_{j=1, j \neq i}^{n} \frac{|a_{ij}|}{|a_{ii}|} < 1 \text{ [row sum}
$$
\ncriterion]

§ 5.4.4: Convergence (GS)

Lemma 5.3.1 (Elementwise bound on the Gauss-Seidel)

Assume $A \in \mathbb{R}^{n \times n}$ and assume B_{GS} to be the Gauss-Seidel iteration matrix defined by (5.19). Then

$$
|B_{GS}| \leq (I - |\hat{E}|)^{-1} |\hat{F}|
$$

§ 5.3.2: Richardson and damped Jacobi

- Richardson: $M_{RICH} = I$ or $M = \tau I$
- Damped Jacobi: $M_{JAC(\omega)} = \frac{1}{\omega}D$

One can show equivalence of the methods with $\tau=\omega^{-1}$ applied to $D^{-1}Au = D^{-1}f$

§ 5.3.3: Successive overrelaxation (SOR)

• SOR:
$$
M_{SOR} = \frac{1}{\omega}D - E
$$

§ 5.3.3: Successive overrelaxation (SOR)

• SOR:
$$
M_{SOR} = \frac{1}{\omega}D - E
$$

Note that this is GS with damping!

STEP1

Lecture 1-3 (step 1,2): elliptic problems, from PDE to $Au = f$ (discretization) and properties of the continuous/discrete problem

STEP 1

- Lecture 1-3 (step 1,2): elliptic problems, from PDE to $Au = f$ (discretization) and properties of the continuous/discrete problem
- Lecture 4 (step 6): metrics to perform validation steps (rounding errors, floating points, conditioning)

STEP₁

- Lecture 1-3 (step 1,2): elliptic problems, from PDE to $Au = f$ (discretization) and properties of the continuous/discrete problem
- Lecture 4 (step 6): metrics to perform validation steps (rounding errors, floating points, conditioning)
- Lecture 5-7 (step 2): design of algorithms to solve $Au = f$

STEP

- Lecture 1-3 (step 1,2): elliptic problems, from PDE to $Au = f$ (discretization) and properties of the continuous/discrete problem
- Lecture 4 (step 6): metrics to perform validation steps (rounding errors, floating points, conditioning)
- Lecture 5-7 (step 2): design of algorithms to solve $Au = f$
	- Direct solvers (LU decomposition)
	- Basic iterative solvers (Jacobi, GS, Richardson)

- Multigrid
- Krylov methods
- Power methods

- Multigrid
- Krylov methods
- Power methods

MSc. projects in our group (Figraduation)

- Multigrid
- Krylov methods
- Power methods
- MSc. projects in our group (*graduation*)
	- Machine learning, computational finance, discretization methods and iterative solvers.

- • Multigrid
- Krylov methods
- Power methods
- MSc. projects in our group $($ [\(graduation\)](https://diamhomes.ewi.tudelft.nl/~kvuik/afstudeer_eng.html)
	- Machine learning, computational finance, discretization methods and iterative solvers.
	- Projects with me: computational and sustainable finance, plasma fusion simulation, electromagnetics simulation