

## 7. LINEAR SYSTEMS OF EQUATIONS

$$f_i(x_j) = 0 \quad i=1, \dots, m \quad j=1, \dots, n$$

IF  $f_i$  ARE NON-LINEAR: NO GENERAL METHOD TO SOLVE, METHOD VARIES FROM CASE TO CASE.

HERE:  $f_i(x_j) = \sum_j a_{ij} x_j - b_i \quad a_{ij}, b_i \in \mathbb{R} \text{ OR } \mathbb{C}$   
 LINEAR SYSTEM OF EQUATIONS

$m=n$  AND  $\det(A) \neq 0$  ( $A = (a_{ij})$ )  $\Rightarrow$  UNIQUE SOLUTION.

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## 7.1 NAIVE GAUSS-ELIMINATION

MATRIX NOTATION  $Ax = b \quad A = \begin{pmatrix} a_{11} & \dots & a_{1n} \\ \vdots & & \vdots \\ a_{m1} & \dots & a_{mn} \end{pmatrix} \quad x = \begin{pmatrix} x_1 \\ \vdots \\ x_n \end{pmatrix} \quad b = \begin{pmatrix} b_1 \\ \vdots \\ b_n \end{pmatrix}$

IDEA OF GAUSS-ELIMINATION: FORM LINEAR COMBINATIONS OF EQUATIONS.

$$\begin{aligned} f_2(x) = b_2 \\ f_2(x) = b_2 \end{aligned} \Rightarrow f_2(x) + c \cdot f_1(x) = b_2 + c \cdot b_1 \quad \text{FOR } c \in \mathbb{R} \text{ OR } \mathbb{C}$$

EXAMPLE:

AFTER GAUSS-ELIMINATION, THERE ARE ZEROS BELOW THE DIAGONAL:

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$$\begin{aligned} -3x_4 = -3 &\Rightarrow x_4 = 1 \\ 2x_3 = -9 + 5x_4 &\Rightarrow x_3 = -2 \\ -4x_2 = -6 - 2x_3 - 2x_4 &\Rightarrow x_2 = 1 \\ 6x_1 = 16 + 2x_2 - 2x_3 - 4x_4 &\Rightarrow x_1 = 3 \end{aligned}$$

BACK SUBSTITUTION

MATLAB: `>> x = A \ b` ("slash")

FORMULA FOR BACKSUBSTITUTION:

$$x_k = \frac{b_k - \sum_{j=k+1}^n B_{kj} x_j}{B_{kk}} \quad k = n, n-1, \dots, 1$$

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REMARKS:

1) PROGRAM `gaussel.m` WORKS FOR SEVERAL RIGHT-HAND SIDES ( $N \geq n+1$ ): FOR EXAMPLE  $b = I_{n \times n}$  ( $n \times n$  IDENTITY MATRIX)

$$Ax = b = I_{n \times n} \Rightarrow x = A^{-1} \text{ (MATRIX INVERSE OF } A) !$$

2) NUMERICAL ACCURACY?

$$A = \text{rand}(n, n) \quad x = \text{rand}(n, 1) \quad \rightarrow \text{COMPUTE } b = A \cdot x$$

$$\text{SOLVE } A \cdot y = b \text{ NUMERICALLY FOR } y \leftarrow \begin{matrix} \text{gaussel}(A, b) \\ A \setminus b \text{ MATLAB} \end{matrix}$$

$$\delta = \max |x_i - y_i|$$

$\rightarrow$  MATLAB ERRORS ARE SMALLER (FACTOR 10-100)

$\rightarrow$  GAUSS-ELIMINATION WITH PIVOTING

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## 7.2 PIVOTING

SO FAR:

\*  $n$  EQUATIONS CAN BE WRITTEN IN ARBITRARY ORDER

\*  $a_{ii} = 0$  IS POSSIBLE IN NON-SINGULAR PROBLEMS  $Ax = b$  (BUT OUR PROGRAM WOULD CRASH "4/0")

$\Rightarrow$  PIVOTING:

- PARTIAL PIVOTING: EXCHANGE THE EQUATIONS (THE ROWS)

- FULL PIVOTING: ALSO EXCHANGE THE COLUMNS ( $\Rightarrow$  ORDERING OF THE  $x_i$ 'S CHANGES!)

PARTIAL PIVOTING

START WITH THE ROW (BECOMES FIRST ROW) WITH  $|a_{i1}|$  MAXIMAL  
 $\rightarrow$  PIVOT ELEMENT OR PIVOT (IF  $|a_{i1}| = 0 \forall i \Rightarrow A$  SINGULAR;  $\det(A) = 0$ )

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THEN TAKE THE ROW WHERE  $|a_{i2}|$  MAXIMAL ETC.

EXCHANGE OF ROWS:

IN PRACTICE: DO NOT SWAP ROWS IN MEMORY, BUT MAKE INSTEAD A BOOKKEEPING OF THE ROW EXCHANGES = PERMUTATIONS.

$$\text{VECTOR } p = [1 \ 2 \ \dots \ n]$$

EXCHANGE THE COMPONENTS OF  $p!$   $\rightarrow$  GENERATES A PERMUTATION

$$[p^{(1)} \ p^{(2)} \ \dots \ p^{(n)}]$$

TO ADDRESS ROW  $i$  USE  $B(p(i), :)$

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### 7.3 ITERATIVE IMPROVEMENT OF SOLUTION

$Ax = b \rightarrow$  SOLUTION  $x^{(0)}$

ROUND OFF ERROR : NUMERICALLY  $Ax^{(0)} = \tilde{b} \neq b$

LET  $Ax^* = b$  BE THE EXACT SOLUTION,  $\delta x = x^{(0)} - x^*$  :

$$A \cdot \delta x = A(x^{(0)} - x^*) = Ax^{(0)} - Ax^* = \tilde{b} - b =: \delta b$$

$\rightarrow$  SOLVE  $A \cdot \delta x = \delta b$  FOR  $\delta x$

$\rightarrow$  CORRECT (IMPROVE) SOLUTION  $x^{(1)} = x^{(0)} - \delta x$

THIS CAN BE ITERATED : COMPUTE  $\tilde{b} = A \cdot x^{(1)}$  ETC.

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