



Lab 1

Implementing a solver for systems of linear equations

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Bachelor's Degree in Video Game Design
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It wouldn't be too difficult to implement a naive solver using the Gauss method.

We will need 2 functions:

- 1 Triangulate a given matrix
- 2 Backtracking of a triangular matrix

However in practice there are some problems associated with this way of proceed related with:

- 1 Avoid handling with large numbers
- 2 Proceed efficiently
- 3 Identify critical cases (Indeterminate or incompatible system)



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Naïve Pseudocode I

Class assignment

Simple MatLab code for triangulate a matrix:

```
1 function [At, bt]= ownTriangulation(A,b)
2
3 % TO DO
4 % Aa = concatenation of A and B
5
6 % TO DO
7 % L = number of unknowns
8
9 % TO DO
10 % for loop c = from 1 until # columns -1
11     % for loop r = from c+1 until #rows
12         %row_r = pivot*row_r - subpivot* row_p
13
14 % TO DO
15 % At = part of Aa
16 % bt = part of Aa
```

Test:

$$\mathbf{A} = \begin{pmatrix} 5 & 4 & 2 \\ 2 & 1 & 1 \\ 1 & 2 & -3 \end{pmatrix} \quad \mathbf{b} = \begin{pmatrix} 5 \\ 1 \\ 0 \end{pmatrix} \rightarrow \mathbf{A}_T = \begin{pmatrix} 5 & 4 & 2 \\ 0 & -3 & 1 \\ 0 & 0 & 45 \end{pmatrix} \quad \mathbf{b}_T = \begin{pmatrix} 5 \\ -5 \\ 45 \end{pmatrix}$$



Naïve Pseudocode II

Class assignment

Simple MatLab code for backtracking:

```
1 function [x] = backSubs(A,b)
2
3     % TO DO
4     % L = length of b
5     % preallocate the vector x in memory initialize x at 0
6
7     % solve for the last element
8
9     % loop for q = L-1 until 1
10    % solve for x
11    %x_r = 1/diagonalTerm_r * (RHS_r - offdiagonalTerms_{r+1:end} * ...
        x_{r+1 to end})
```

Test:

$$\mathbf{A}_T = \begin{pmatrix} 5 & 4 & 2 \\ 0 & -0.6 & 0.2 \\ 0 & 0 & -3 \end{pmatrix} \quad \mathbf{b}_T = \begin{pmatrix} 5 \\ -1 \\ -3 \end{pmatrix} \rightarrow \mathbf{x} = \begin{pmatrix} -1 \\ 2 \\ 1 \end{pmatrix}$$



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Handling large numbers

Problems

Computer does not like large numbers ¹. Try:

```
1 a = 1E99;  
2 b = 1E99 + 1;  
3 c = a-b
```

- Which value do you expect for c?
- What is the value of c that MatLab throws?

When triangulating, the operation

$$r_j = r_j Aa(p, p) - r_p Aa(j, p)$$

Tends to increase the value of the entries in A.

¹In case you're interested, there are special ways of dealing with those numbers, however it will be complex and computational expensive



Handling large numbers II

Problems

Things we can do:

- 1 Since we can multiply and divide every row by a non-zero number

$$r_j = r_j - r_p Aa(j, p) / Aa(p, p)$$

However we must ensure that $A(p, p)$ is far enough from 0.

- 2 Since we can choose any row for triangulate. Select the row with the biggest (absolut value) possible pivot.

$$r_j = r_j - r_p Aa(j, p) / Aa(p, c)$$

or even better, calculate $s_j = \max_i |A(j, i)|$ once for every row and choose the pivots such that:

$$p = \operatorname{argmax}_j \frac{|Aa(j, c)|}{s_j}$$

That is called scaled partial pivoting



Exchange rows means wasting time

We can do that without actually make a real exchange of rows. For this purpose:

- Maintain a list of the visited rows (in order)
 - initialise as an empty vector `vr = []`
 - Whenever you visit a row `vr = [vr p]`
- Maintain a list of the unvisited rows
- initialise as an empty vector `uvr = [1:L]`
- Whenever you visit a row extract the visited row from the vector.
Use `uvr = setdiff(uvr,p)`



Note: that, after make the Gaussian elimination $Aa(vr,:)$ is a triangular matrix with 0's under the diagonal. It means that the backsubstitution algorithm must be adapted.

But is easy. Whenever you access an element of a row you must do it by using the pointer.

E.g. the last component of x was calculated before as

$$x_L = b(L)/x(L, L)$$

Now that must be substituted by;

$$x_L = b(rv(L))/x(rv(L), L)$$



Identify critical cases

Problems

Indeterminate or Incompatible systems of equations?

By maintaining the strategy of selecting the row with the biggest pivot, we can check when the pivot ≈ 0 , we are going to be in one of those critical cases.

Set a threshold value (something small $\approx 1E-8$) and compare the pivot value. If exceeded, return $x = \text{'NaN'}$ and a flag to the non-solved value.



- Try to use matrix multiplications
- Try to avoid loops
- Do not waste time putting 0's that later you are not going to use



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Modified MatLab code for triangulate a matrix:

```
1 function [At ,bt, vr, flag] = ownTriangulation_mod(A,b)
2
3 % flag = -1 -> indeterminate or incompatible
4 % flag = 0 -> solvable
5
6 % TODO: initialise Th
7
8 % TODO: Aa = concatenation of A and b
9
10 % TODO: L = number of unknowns
11
12 % TODO: Initialize vr and uvr vectors
13
14 % TODO: create the sj vector
15
16 % TO DO: for loop c = from 1 until # columns -1
17
18     % TO DO: implement a function that Given Aa, sj and uvr returns
19         % the abs value of the pivot and the row of the pivot
20
21     % TO DO: Check if the returned value is under the threshold
```

continues on the next slide



Modified MatLab code for (virtually) triangulate a matrix:

```
21      % TO DO: Check if the returned value is under the threshold
22
23      % TO DO: Update the lists to remember the row pivot as visited
24
25      % TO DO: for loop rs in uvr, modify the uvr
26
27      % TO DO: Update the lists to remember the row pivot as visited
28
29      % TO DO: for loop rs in uvr, modify the uvr
30
31      % TO DO: check if the last unvisited row has a unvalid pivot nad introduce
32      % the last row in the lists as visited
33
34      % TO DO: At as part of Aa
35      % TO DO: bt as part of Aa
```



Modified MatLab code for backward substitution:

```
1 function [x] = backSubs_mod(At,bt,vr)
2 % TO DO L = length of b
3
4 % preallocate the vector x in memory initialize x at 0
5
6 % solve for the last element taking into account the pointer
7
8 % loop for q = L-1 until 1
9
10     %solve x
```

Principal function that calls the other two:

```
1 function [x, flag] = ownGauss_mod(A,b)
2 % flag = -1 -> indeterminate or incompatible
3 % flag = 0 -> solvable
4
5 [At ,bt, vr, flag] = ownTriangulation_mod(A,b)
6
7 %TO DO: check the flag and return x = NaN if not solvable
8
9 [x] = backSubs_mod(At,bt,vr)
```



We give you an additional `tests.m` file with several calls to your main function. Use it to verify that your functions is properly implemented.