# Simulation in Materials Engineering 

T1: Fundamentals of programming

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## Outline

(1) Programming languages
(2) Real numbers
(3) MATLAB and OCTAVE frameworks

## Programming

Computer Programming is a fundamental tool in Engineering and Science

## But, what's programming and what's it used for?

Programming is the act of entering instructions for the computer to perform. An ordered set of instructions to perform a task is a program. All programs use basic instructions as building blocks, as example

- Do this; then do that.
- If this condition is true, perform this action; otherwise, do that action.
- Do this action that number of times.
- Keep doing that until this condition is true.

These building blocks are combined and organized to form a program

## Programming languages

Classically, programming is done using compiled languages, in the case of technical \& scientific programming. FORTRAN, C, C++.


## Scripting languages and MATLAB

- Alternative: scripting languages, do not requiere compilation and may integrate many of the tools in the same envirnoment.
- MATLAB (MATrix LABoratory) is an integrated environment for programming and visualization in scientific computing.


## Advantages

- High level, Simple
- Many functions, algorithms, methods already implemented


## Disadvantages

- Commercial (and expensive) framework
- Interpreted language: "Not" possible to generate executables to be run without MATLAB


## OCTAVE

Alternative: GNU OCTAVE. A free implementation of a framework almost equal to MATLAB www.gnu.org/software/octave/ Current version (2018) is 4.4, and includes a Graphical User Interface very similar to MATLAB. Builts exist for several platforms:

- Mac OS-X,
http://wiki.octave.org/Octave_for_MacOS_X
- A binary built of Octave 4.03 can be installed for IOSX $>10.9 .1$, see previous web page
- Install current Octave version using a Virtual Machine through Vagram, see instructions in http://deepneural.blogspot.fr/p/instructions-1_10.html
- Compile original source files, only recommended for experts http://wiki.octave.org/Octave_for_Mac
- Windows: An official windows installer is available for version 4.0 https://ftp.gnu.org/gnu/octave/windows/ octave-4.0.0_0-installer.exe
- Linux: Octave is included in repositories of most common Linux distributions. For more information and latest version http:
//www.gnu.org/software/octave/download.html


## Working with numbers

The different sets of numbers defined in maths have to be represented in the computer, but this representation cannot be exact.

- The infinite Set $\mathbb{Z}$ includes the integer numbers. Countable magnitudes can be represented with $\mathbb{Z}$. Integers are "discrete" and can be exactly represented in a computer using bits. The only limit is the maximum number to be represented. int 8 , int 16 , int 32 are the three type of integers in matlab,
- The Set $\mathbb{R}$ of real numbers, of infinite size, is used to express physical magnitudes in general.
- Computers cannot use the set $\mathbb{R}$ and use the finite dimension subset $\mathbb{F}$ instead
- The numbers of the set $\mathbb{F}$ are called floating point numbers
- A computer substitutes each real $x$ by its corresponding floating point $f(x)$ by truncation. In matlab, floating points have double precision by default and are called double.


## Representation of floating points

## OCTAVE/MATLAB exercise

Lets consider a rational number, i.e. $x=1 / 7$ which corresponds to 0.142857
>>1/7
ans $=0.14286$
Try different representations of the number
>>format long gives 0.142857142857143
>>format long e gives $0.142857142857143 \mathrm{E}-001$
>>format short e gives $0.14286 \mathrm{E}-001$ See in the "variable explorer" that in all the cases, the type of variable is double

## Representation of floating points

- As seen in the example real numbers $(x)$ are truncated and the format indicates the computer the precision of the truncation
- The actual floating point number $(f l(x))$ stored by the computer can be written as
$f I(x)=(-1)^{s} \cdot\left(0 . a_{1} a_{2} a_{3} \ldots a_{t}\right) \cdot \beta^{e}=(-1)^{s} \cdot m \cdot \beta^{e-t}, a_{1} \neq 0$
- $s=0$ or 1 , to define the sign
- $\beta \geq 2$ is a natural number called base
- $m$ is an integer called mantissa of length $t$
- $e$ is an integer called exponent
- The precision of the floating point is given by $t$, and depends on the machine and/or program


## Representation of floating points

- The set $\mathbb{F}$ is characterized by $\beta, t$ and the range of $e, L \leq e \leq U$, $\mathbb{F}=\mathbb{F}(\beta, t, L, U)$
- In MATLAB $\mathbb{F}=\mathbb{F}(2,53,-1021,1024)$, corresponding to $t=15$ in decimal base
- The relative rounding error of using a floating point instead of the real number corresponds to

$$
\begin{equation*}
\frac{|x-f|(x) \mid}{|x|} \leq \frac{1}{2} \epsilon_{m}=\frac{1}{2} \beta^{1-t} \tag{1}
\end{equation*}
$$

and in MATLAB $\epsilon_{m}$ can be obtained by >>eps being $\epsilon_{m}=2^{-52} \approx 2.22 \cdot 10^{-16}$ (double precision)

- The maximum and minimum positive floating point values are $x_{\text {min }}=\beta^{L-1}$ and $x_{\max }=\beta^{U}\left(1-\beta^{-t}\right)$, obtained using realmin ${ }^{1}$ and realmax

[^0]
## Operations with floating numbers

- The zero does not exists in $\mathbb{F}$ but if an operation gives a number smaller than $x_{\text {min }}$ is treated as zero (underflow)
- If an operation gives a number bigger than $x_{\max }$ MATLAB provides Inf (Overflow)
- Associative property is lost when they involve under and overflow, or number with similar absolute values and contrary sign
- Indetermination as $0 / 0$ or $\infty / \infty$ gives NaN


## OCTAVE/MATLAB exercise

Let $x$ be a small number, i.e. $1 \cdot 10^{-15}$, make $((1+x)-1) / x$ and calculate relative error with the real result.
Make the same with $x=1 \cdot 10^{-14}$

## MATLAB and OCTAVE frameworks

- MATLAB has a graphical environment with menus, windows and toolboxes. OCTAVE originally works in a text terminal. In last versions ( $>3.6$ ) a graphical environment similar to MATLAB is provided (default from version 4.0)
- Variable treatment, basic programming, functions, etc have the same syntax in both programs and the examples and exercises will be compatible with both.
- Operations, programs, are written after the prompt (>>)


## Use of the terminal

Matlab and Octave graphical environments include several elements

- Editor. Is a text editor to write a script before executing it. Any editor (notepad, gedit...) can be used for this purpose but the built-in editors provide enhancements to recognize functions, mark typing errors, etc
- Terminal. Is the engine, this is really the important part of the code. You type instructions there and you get the result. Instructions can be operations, call to functions...
- Utility windows: Variable explorer, menus, file manager.

Instructions to the terminal are typed after the prompt, usually >> The first "Code" in matlab, equivalent to typical first C code is to ask the computer to write a message. This is done by
>>disp("Hello")
"Hello"
The first use if matlab is normally using the terminal as a calculator

## Variables

- Variable type has not to be declared (double, integer, character), MATLAB declares it automatically and dynamically when initialized
- A variable is initialized by the operator $=$, examples:
>>a='simulation'
ans $=$ simulation
$\gg a=3 E-2$
ans $=0.003$
$\gg a=3$
ans=3
- Variables cannot start with a number, bracket, point and cannot contain operator signs (i.e.,$+ \&$ )
- Variables are case sensitive! $a \neq A$


## Algebraical operations and functions

- Addition, subtraction, multiplication, division and exponentiation of variables are done by standard symbols +,-,*, ^
- Operations can be joined using (), order of operations are (), ^, *, /, +, -
- Typical functions are implemented in MATLAB, $\sin (x), \cos (x), \tan (x), \operatorname{atan}(x), \exp (x), \log (x)$, $\log 10(x), \sinh (x), \cosh (x), \tanh (x), a b s(x)$


## OCTAVE/MATLAB exercise

Define $x$ to be an integer, operate $x * 2$
Make the same being $x$ a real and a character string. Define $x$ to be an integer, calculate $\frac{x+e^{x}}{x}$
Make the same being $x$ a real and a character string.

## Matrices and vectors

- A matrix $\mathbf{A}$ is a set of elements $a_{i j}$ distributed in $m$ rows and $n$ columns

$$
\mathbf{A}=\left[\begin{array}{cccc}
a_{11} & a_{12} & \cdots & a_{1 n} \\
a_{21} & a_{22} & \cdots & a_{2 n} \\
\vdots & \vdots & & \vdots \\
a_{m 1} & a_{m 2} & \cdots & a_{m n}
\end{array}\right]
$$

- A matrix in MATLAB is delimited by [ and ],the elements of a row are separated by spaces and rows by ; example,the matrix $\mathbf{A}$ of entire numbers

$$
A=\left[\begin{array}{lll}
2 & 3 & 5 \\
4 & 1 & 0
\end{array}\right]
$$

is declared using

$$
\begin{aligned}
& \text { >> } A=[235 ; 410] \\
& \mathrm{A}=
\end{aligned}
$$

## Operations with matrices

- Addition. If $\mathbf{A}_{m \times n}=\left[a_{i j}\right]$ and $\mathbf{B}_{m \times n}=\left[b_{i j}\right]$, the addition of $\mathbf{A}$ and $\mathbf{B}$ is a new matrix $\mathbf{A}+\mathbf{B}_{m \times n}=\left[a_{i j}+b_{i j}\right]$ In MATLAB >>A+B
- The product of matrix $\mathbf{A}$ by a real number $\lambda$ is a new matrix $\lambda \mathbf{A}=\left[\lambda a_{i j}\right]$
In MATLAB >> $a * A$
- Let $\mathbf{A}_{m \times p}$ and $\mathbf{B}_{p \times n}$ then the product of $\mathbf{A}$ and $\mathbf{B}$ is a new matrix $\mathbf{A B}=\mathbf{C}_{m \times n}$, being

$$
c_{i j}=\sum_{p}^{k=1} a_{i k} b_{k j}
$$

In MATLAB >>A*B

- If $\mathbf{A}_{m \times n}=\left[a_{i j}\right]$, then the transpose of $\mathbf{A}$ is $\mathbf{A}_{n \times m}^{T}=\left[a_{j i}\right]$. Property:
$(\mathbf{A B})^{T}=\mathbf{B}^{T} \mathbf{A}^{T}$. In MATLAB, the operation is done by

[^1]
## Ranges and submatrix extraction

A range is a sequence of numbers that can be generated using the range operator, namely, colon(:) and very useful to create and manipulate matrices and vectors

- To create a vector $m$ containing a list of integers from $i$ to $j$ >m=i:j
- To create a vector $m$ containing a list of integers from ito $j$ by increment k>m=i:k:j
In MATLAB/Octave is very easy to add/delete/extract rows or columns from a given matrix using range operator (:). Let $\mathbf{A}_{m \times n}$ be a matrix, then
- To extract the row $i \gg A(i,:)$
- To extract the column $j \gg A(:, j)$
- To extract a submatrix >>A $(m, n)$, being $m$ and $n$ vectors of integers, i.e $m=\left[\begin{array}{ll}1 & 3\end{array}\right]$ and $n=1$


## Generation of special matrices

- Unit square matrix of size $n \times n \gg e y e(n)$
- 0 matrix of size $n \times m \gg z \operatorname{zeros}(\mathrm{n}, \mathrm{m})$
- Matrix with random coefficientes $[0,1]$ of size $n \times m$ >>rand ( $\mathrm{n}, \mathrm{m}$ )


## OCTAVE/MATLAB exercise

- Create a random matrix A with elements $[0,5$.] of size $10 \times 10$
- Create a vector $\mathbf{m}$ containing the odd numers between 0 and 5
- Extract the row and the column 3 of $\mathbf{A}$
- Create a new matrix containing only odd rows and columns. Use m
- Add the corresponding unit matrix to the last one


## Determinant of square matrices

- Determinant of a matrix $\mathbf{A}_{n \times n}=\left[A_{i j}\right]$, defined by Laplace rule (recursive)

$$
\operatorname{det}(\mathbf{A})=\left\{\begin{array}{cc}
a_{11} & \text { if } n=1 \\
\sum_{j=1}^{n} \Delta_{i j} a_{i j}, \text { for any } \mathrm{i}, 1 \leq \mathrm{i} \leq \mathrm{n} & \text { if } n>1
\end{array}\right.
$$

being $\Delta_{i j}$ a minor, defined as $\Delta_{i j}=(-1)^{i+j} \operatorname{det}\left(\mathbf{A}_{i j}\right)$ and $\mathbf{A}_{i j}$ is the square matrix of $(n-1) \times(n-1)$ dimensions, obtained by eliminating $i$-th row and the $j$-th column to the matrix $\mathbf{A}$

- The rule involves for a general matrix a number of $2 n$ ! operations.
- Example, for $n=2, \operatorname{det}(A)=a_{11} a_{22}-a_{12} a_{21}$
- For $n=3, \operatorname{det}(A)=a_{11} a_{22} a_{33}+a_{31} a_{12} a_{23}+a_{21} a_{13} a_{32}-$ $a_{11} a_{23} a_{32}+a_{21} a_{12} a_{33}+a_{31} a_{13} a_{22}$


## Determinant of square matrices

Some properties of the determinants:

- If any row or column is 0 or a linear combination of others then det $=0$ (singular matrix).
- $\operatorname{det}(\mathbf{A B})=\operatorname{det}(\mathbf{A}) \operatorname{det}(\mathbf{B})$
- $\operatorname{det}\left(\mathbf{A}^{T}\right)=\operatorname{det}(\mathbf{A})$
- If $\mathbf{A}_{n \times n}$ is triangular then $\operatorname{det}(\mathbf{A})=a_{11} a_{22} \cdots a_{n n}$

The command for computing the determinant of a square matrix $\mathbf{A}$ in MATLAB is $\operatorname{det}(A)$. It is not based on Laplace rule and is much more efficient

## OCTAVE/MATLAB exercise

Define a scalar a and two non-singular matrices $\mathbf{A}_{3 \times 3}$ and $\mathbf{B}_{3 \times 3}$, and calculate $\operatorname{det}(\mathbf{A}), \operatorname{det}(\mathbf{B}), \operatorname{det}(\mathbf{A B}), \operatorname{det}(a \mathbf{A})$. What is the relation between $\operatorname{det}(\mathbf{A})$ and $\operatorname{det}(a \mathbf{A})$ ?

## Inverse of a square matrix

A n-by-n matrix $\mathbf{A}$ is called invertible or nonsingular or nondegenerate, if there exists an $n$-by-n matrix $\mathbf{B}$ such that $\mathbf{A B}=\mathbf{B A}=\mathbf{I}_{n}^{*}$. If this is the case, $\mathbf{B}$ is uniquely determined by $\mathbf{A}$ and is called the inverse of $\mathbf{A}$, denoted by $\mathbf{A}^{-1}$

- A square matrix is singular if and only if its determinant is 0
- If $\mathbf{A}_{n \times n}$ and $\mathbf{B}_{n \times n}$ are nonsingular then, $(\mathbf{A B})^{-1}=\mathbf{B}^{-1} \mathbf{A}^{-1}$
- $\operatorname{det}\left(\mathbf{A}^{-1}\right)=\operatorname{det}(\mathbf{A})^{-1}$
* $\mathbf{I}_{n}$ is a unit matrix, that is defined as a diagonal matrix with all its terms equal to 1 .

$$
\mathbf{I}_{n}=\left[\begin{array}{cccc}
1 & 0 & \cdots & 0 \\
0 & 1 & \cdots & 0 \\
\vdots & \vdots & \ddots & 0 \\
0 & 0 & 0 & 1
\end{array}\right]
$$

## Inverse of a square matrix

In MATLAB the inverse of a matrix $\mathbf{A}$ can be obtained using inv (A)

## OCTAVE/MATLAB exercise

- Define a scalar a and two non-singular matrices $\mathbf{A}_{3 \times 3}$ and $\mathbf{B}_{3 \times 3}$, and calculate $\mathbf{A}^{-1}, \mathbf{B}^{-1},(\mathbf{A B})^{-1},(\mathbf{a} \mathbf{A})^{-1}$. What is the relation between $\mathbf{A}^{-1}$ and $(\mathbf{a} \mathbf{A})^{-1}$ ?
- Calculate $\mathbf{A}^{-1} \mathbf{A}$ and $\mathbf{A A}^{-1}$ and check the solution
- Introduce the matrix A,
>>A=[1E30 01 ; -1 1E-9 0 ; 002 2] Obtain the matrix $\mathbf{B}=\mathbf{A}^{-1}$. Finally calculate $\mathbf{B}^{-1}$. Is logical the result?


## Programming using MATLAB

MATLAB and OCTAVE provide an easy method to program interpreted applications using all the commands and functions implemented in MATLAB.

## Relational operators

Let $a$ and $b$ be two variables, the comparison between a and b is a relational operator that returns a logical value of 1 if true and 0 if false

- Equal $a==b$
- Greater $a>b$, greater than $a>=b$
- Lower $\mathrm{a}<\mathrm{b}$, lower than $\mathrm{a}<=\mathrm{b}$
- Different than $\mathrm{a}!=\mathrm{b}$ and also $\mathrm{a} \sim=\mathrm{b}$


## OCTAVE/MATLAB exercise

- Define $a$ and $b$ as 2 different reals. Calculate $a==b ; a>b ; a=>b ; a<b ; a=<b ; a!=b$
- Do the same being $a$ and $b$ as 2 matrices $m \times n$
- Do the same defining $a$ and $b$ as character string.


## Programming using MATLAB

## Terminal Input/output

Display a text MATLAB/OCTAVE displays a text or value of a variable by using the command disp ()

- Let a be an initialized variable, disp(a) returns its value
- disp('THIS IS A TEXT') returns the string between ' '
- Formatted output can be done using fprintf:

```
age = 21;student=' Juan';
fprintf ('Student %s is %d years old.\n',
    student,pct);
```

- The arguments within printf are printed in specific formats:
- \%d for entire decimal number
- \%s for string of characters
- $\% \mathrm{f}$ and $\%$ e are used for floating numbers in standard fixed point notation or engineering notation respectively
- $\backslash \mathrm{n}$ indicates new line


## Programming using MATLAB

## Terminal Input/output

Read a value from the terminal The command var=input (' TEXT') displays the TEXT and waits until the entry of a value through the keyboard. Value is saved on variable var
Example: age=input ('How old are you')
OCTAVE/MATLAB exercise

- Use input to get an integer number saved in variable a
- Generate a random number in a varibale $b$
- Define a variable $c$ containing the product $a \times b$
- Write using print $f$ the three numbers in its corresponding format within a sentence like given value is a, random number is $b$ and product is $c$


## Programming using MATLAB

## File Input/output

In many cases, inputs for a program are stored in an ascii file, i.e.
points of a stress strain curve. In addition, many times is necesary to output program results to an external file.
The process to open, manipulate and close a file

```
filename = 'myfile.txt';
fid = fopen (filename, 'mode');
# Do the actual I/O here...
fclose (fid);
```

where mode is substituted by write wor read $r$

- for writting in a file fprintf(fid, ...) is used with same conventions as printf
- for reading from a file fscanf (fid, template) is used, where template indicates the format to be read


## Programming using MATLAB

## Logical operators

Logical operators The symbols \& , । and ~ are the logical operators AND, OR, and NOT. These operators are used in conditional statements. Logical operations return a logical variable 1 (true) or 0 (false), as appropriate. Let cond1 and cond2 be two conditions, i.e. cond $1=a==b$, and cond $2=c>=2$ then the logical operators relate both conditions to give a new condition.

## OCTAVE/MATLAB exercise

- Define $a$ and $b$ to be 0 or 1 (4 cases) and check $a \& b, a \mid b$ in all the cases
- Define three reals $a, b, c$, and two relational conditions, i.e. cond1 $=a>=b$
- Check the result of expr1 AND expr2


## Programming using MATLAB

## Conditions

In programming is very useful that as a result of a given condition different expressions are run. This is done using the conditional if - elseif - else statements

```
if condl
    statement1
else if cond2
    statement2
else
    statementN
end
```


## Programming using MATLAB

## Conditions

## OCTAVE/MATLAB exercise

- Let $a x^{2}+b x+c=0$ be a second order equation in $x$ with real coefficients $a, b, c$. Define a procedure to obtain the values of $x$ for any possible number of real roots ( 2,1, or 0 )
- Use the sequence to solve different cases: $2 x^{2}+x-1=0$, $2 x^{2}+x-1=0,3 x^{2}+x-1=0$
- Define the polynomial function as a vector of the coefficients using $p=\left[\begin{array}{l}\text { a } \\ \text { c }\end{array}\right.$
- Solve the equation using the MATLAB/OCTAVE command roots ( p ) and compare with the programmed sequence


## Programming using MATLAB

- A loop is a sequence of statements which is specified once but which may be carried out several times in succession.
- The code "inside" (XXX) the loop is obeyed a specified number of times, or once for each of a collection of items, or until some condition is met, or indefinitely.
for loop
for var=vall:val2
XXX
end
for var=MATRIX
XXX
end


## Programming using MATLAB

## Loops

```
while loop
while (condition)
    XXX
end
do/until loop
do
    XXX
until (condition)
```


## Programming using MATLAB

## Loops

## OCTAVE/MATLAB exercise

The e number is a real constant that appears many times in mathematic and physics. Its value is $e \approx 2,718281828459045235360287471352 \ldots$... It can be defined as the value of an infinite series

$$
\begin{equation*}
e=\sum_{n=0}^{\infty} \frac{1}{n!} \tag{2}
\end{equation*}
$$

- Write a procedure using a "for loop" to obtain an approach of e with $2,10,100$ and 1000 terms of the series
- Write a procedure using a "while" or "do" loop to obtain a "good" approach to $e$


## Programming using MATLAB

## Scripts and programs

- A program or a script is a sequence of instructions/operations structured to perform a more complex procedure
- In MATLAB and OCTAVE (interpreted languages) program consist on ascii files containing the sequence of operations in lines.
- A MATLAB/OCTAVE script SHOULD always end in .m, i.e. example.m
- Programs are run by writing the name of the script in the prompt >>example


## OCTAVE/MATLAB exercise

Write a program that ask for the coefficients of a second order equations and provides the solution just in case they are real

## Programming using MATLAB

## Functions

- In programming is very usual that a given set of operations is repeated several times in the code, i.e. a second order polynomical equation that has to be solved several times
- For the sake of clarity, code brevity, etc, those sets of operations (small programs) can be written as functions
- Each functions is called by its name, and must be saved as a file name.m

```
function [out1 ,... , outn]= name(in1 ,..., inm)
definition of the operations to do with in1 to inm
in order to obtain out1 to outn
```

return
end

## Programming using MATLAB

## Functions

Examples: Program to obtain the determinant of a $2 \times 2$ matrix

```
function detFUNC=determinant2(A)
[n,m]=size(A);
if n==m
detFUNC=A (1, 1) *A (2,2) -A (1, 2) *A (2, 1);
disp ('determinant computed, value='),disp(detFUNC);
else
disp ('ERROR: Matrix is not 2x2 ');
end
```

return
end

## OCTAVE/MATLAB exercise

Write and run the previous determinant2 function. Try with and without ";"

## Programming using MATLAB

## OCTAVE/MATLAB exercise

A Fibonacci series consist on the sequence of numbers where each new number of the series consist on the addition of the preceding 2 values. The values of the terms depend on two initial values $a_{1}, a_{2}$, and $a_{n}=a_{n-1}+a_{n-2}$ Program a function that uses $a_{1}, a_{2}$ and $n$ as input parameters and gives the value of the term $a_{n}$

## Plots

Functions, time series, etc can be represented within the MATLAB/Octave framework, using plot command:

- Plot the elements of a vector $Y$ as function of the index:
plot (Y)
- Plot $Y=Y(X)$, being $X$ and $Y$ vectors plot ( $X, Y$ )
- Plot functions, $t=0: 0.1: 6.3$; plot ( $t, \cos (t)$ )
- In MATLAB and Octave > 6.3 or UPM-Octave, graphs can be personalized, modified and saved using GUI menus.


## OCTAVE/MATLAB exercise

Plot the evolution of the fibonacci series as function of $n$ until $n=100$

## Computational costs

- The computational cost of an algorithm is the number of floating point operations that are required for its execution.
- The maximum number of floating point operations which the computer can execute in one second (flops) measures the speed of a computer. Megaflop $=10^{6}$ flops, Gigaflop $=10^{9}$ flops and Teraflop $=10^{12}$ flops
- As example, a PC processor of year 2010, 6 core PC Intel Core i-7 980 XE reaches 109 GFlops
The efficiency of an algorithm is usually evaluated by the order of magnitude of the floating point operations needed as a function of a paramenter $n$ that measures the size of the analyzed system $O(n)$, i.e. in a linear system $n$ can be the number of unknowns.


## Computational costs

Growth of number of operations for different algorithms

| $n$ | $O(1)$ | $O(\log n)$ | $O(n)$ | $O(n \log n)$ | $O\left(n^{2}\right)$ | $O\left(n^{3}\right)$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1 | 1 | 1 | 1 | 1 | 1 |
| 2 | 1 | 1 | 2 | 2 | 4 | 8 |
| 4 | 1 | 2 | 4 | 8 | 16 | 64 |
| 100 | 1 | 5 | 100 | 500 | 1 E 4 | 1 E 6 |
| 1000 | 1 | 7 | 1000 | 7000 | 1 E 6 | 1 E 9 |

Usual computational methods:

- Molecular dynamics (evaluation of potential) with cutoffs $O(n)$
- Dislocation dynamics, evaluation of Peach-Koeler forces $O\left(n^{2}\right)$
- Finite elements $O\left(n^{2}-n^{3}\right)$ (sparse matrix inversion)


[^0]:    ${ }^{1}$ MATLAB and OCTAVE provide a false value of realmin for 64 bit processors.

[^1]:    transpose(A)

