

# Numerical Method Programming

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## 1 Introduction

Numerical methods are a very effective way to solve problems with a high degree of complexity, which analytically would not have a solution. Also, thanks to the exponential growth in computing power in computers, it is possible for us to implement these numerical methods to obtain better results. As a final project of the numerical analysis subject, we have developed some numerical methods for solving different problems in the Python programming language.

## 2 How to use the program

The first step to use the program is to download the funete code from the [repository](#). In order to run our program, you have to do the following process: Having Python installed, the version used is Python3, along with some additional libraries (Tkinter, numpy, sympy). What we will do is run the following command in the project directory:

Python ./Principal.py principal being the class with the initial interface.

The next thing we will see will be a screen with 3 categories of methods, we will see a list of buttons with the name of the corresponding method, what follows will be to click on the method we want to execute, a sub-window will appear which will have the necessary fields for calculate method and a button to calculate, the values will come out in the same interface.

Second option: the buttons of the main interface will be linked to their respective code on the Replit page, for later execution, each method will have input variables which we will change at will and execute the corresponding operations, the results appearing on the console.

## 3 Methods developed

### 3.1 Numerical solution of nonlinear equations

- **Incremental searches**

program that finds an interval where  $f(x)$  has a change of sign using the method of incremental searches.

Pseudocode:

```
input:
f, continuous function
x0, starting point
h, step
Nmax, maximum number of iterations
```

```
output:
a, left end of the interval
b, right end of interval
iter, number of iterations
```

```
//function
```

Incremental searches(f, x0, h, Nmax):

```
// Initialization
xant = x0
fant = f (xant)
xact = xant + h
fact = f (xact)

//Cycle
for i = 1: Nmax
    if fant * fact <0
        break
    end if
    xant = xact
    fantastic = fact
    xact = xant + h
    fact = f (xact)
end for

// Delivery of results
a = xant
b = xact
iter = i
```

- **Bisection**

program that finds the solution to the equation  $f(x) = 0$  in the interval  $[a, b]$  using the bisection method.

Pseudocode:

input:  
f, continuous function  
a, right end of the initial interval  
b, end end of end interval  
tol, tolerance  
Nmax, maximum number of iterations

output:  
x, solution  
iter, number of iterations  
err, error

```
//function
bisection (f, a, b, tol, Nmax):
```

```
// Initialization
fa = f (a)
pm = (a + b) / 2
fpm = f (pm)
E = 1000;
cont = 1

//Cycle
while E> tol && cont <Nmax
    if fa * fpm <0
        b = pm;
    else
        a = pm
```

```

        end if
        p0 = pm
        pm = (a + b) / 2
        fpm = f (pm)
        E = abs (pm-p0)
        cont = cont + 1
    end while

    // Delivery of results
    x = pm
    iter = cont
    err = E

```

- **False rule**

program that finds the solution to the equation  $f(x) = 0$  in the interval  $[a, b]$  using the false rule method.

Pseudocode:

Input:

f, continuous function  
a, right end of the initial interval  
b, end end of end interval  
tol, tolerance  
Nmax, maximum number of iterations

Output:

x, solution  
iter, number of iterations  
err, error

//function

false rule (f, a, b, tol, Nmax):

```

    // Initialization
    fa = f (a)
    fb = f (b)
    pm = (fb * a-fa * b) / (fb-fa)
    fpm = f (pm)
    E = 1000
    cont = 1

    //Cycle
    while E> tol && cont <Nmax
        if fa * fpm <0
            b = pm
        else
            a = pm
        end if
        p0 = pm
        pm = (f (b) * a-f (a) * b) / (f (b) -f (a))
        fpm = f (pm)
        E = abs (pm-p0)
        cont = cont + 1
    end while

    // Delivery of results
    x = pm

```

```

    iter = cont
    err = E

```

- **Fixed point**

program that finds the solution to the equation  $f(x) = 0$  by solving the analogous problem  $x = g(x)$  using the fixed point method.

Pseudocode:

Input:

```

f, continuous function
g, continuous function
x0, initial approximation
tol, tolerance
Nmax, maximum number of iterations

```

output:

```

x, solution
iter, number of iterations
err, error

```

fixedpoint (g, x0, tol, Nmax):

```

    // Initialization
    xant = x0
    E = 1000
    cont = 0

    //Cycle
    while E > tol && cont < Nmax
        xact = g (xant)
        E = abs (xact-xant)
        cont = cont + 1
        xant = xact
    end while

    // Delivery of results
    x = xact
    iter = cont
    err = E

```

- **Newton**

program that finds the solution to the equation  $f(x) = 0$  using Newton's method.

Pseudocode:

Input:

```

f, continuous function
f ', continuous function
x0, initial approximation
tol, tolerance
Nmax, maximum number of iterations

```

output:

```

x, solution
iter, number of iterations
err, error

```

```

//function
newton (f, df, x0, tol, Nmax):

    // Initialization
    xant = x0
    fant = f (xant)
    E = 1000
    cont = 0

    //Cycle
    while E> tol && cont <Nmax
        xact = xant-fant / (df (xant))
        fact = f (xact)
        E = abs (xact-xant)
        cont = cont + 1
        xant = xact
        fantastic = fact
    end while

    // Delivery of results
    x = xact
    iter = cont
    err = E

```

- **Secant**

program that finds the solution to the equation  $f(x) = 0$  using the secant method.  
Pseudocode:

Input:  
f, continuous function  
x0, initial approximation  
x1, initial approximation  
tol, tolerance  
Nmax, maximum number of iterations

Output:  
x, solution  
iter, number of iterations  
err, error

```

secant (f, x0, x1, tol, Nmax):

    // Initialization
    f0 = f (x0)
    f1 = f (x1)
    E = 1000
    cont = 1

    //Cycle
    while E> tol && cont <Nmax
        xact = x1-f1 * (x1-x0) / (f1-f0)
        fact = f (xact)
        E = abs (xact-x1)
        cont = cont + 1
        x0 = x1
        f0 = f1
        x1 = xact

```

```

        f1 = fact
    end while

    // Delivery of results
    x = xact
    iter = cont
    err = E

```

- **Multiple roots**

program that finds the solution to the equation  $f(x) = 0$  using the multiple roots method.  
Pseudocode:

Input:  
 f, continuous function  
 f', continuous function  
 f'', continuous function  
 x0, initial approximation  
 tol, tolerance  
 Nmax, maximum number of iterations

Output:  
 x, solution  
 iter, number of iterations  
 err, error

multiple roots (f, df, d2f, x0, tol, Nmax):

```

    // Initialization
    xant = x0
    fant = f (xant)
    E = 1000
    cont = 0

    //Cycle
    while E > tol && cont < Nmax
        xact = xant - fant * df (xant) / ((df (xant)) ^ 2 - fant * d2f (xant))
        fact = f (xact)
        E = abs (xact - xant)
        cont = cont + 1
        xant = xact
        fantastic = fact
    end while

    // Delivery of results
    x = xact
    iter = cont
    err = E

```

## 3.2 Solution of systems of linear equations

- **Gauss**

program that finds the solution to the system  $Ax = b$  using the Gaussian elimination method.  
Pseudocode:

Input:  
 A, invertible matrix

b, constant vector

Output:  
x, solution

```
//function
gausspl (A, b):

    // Initialization
    n = size (A, 1)
    M = [A b]

    We reduce the system
    for i = 1: n-1
        for j = i + 1: n
            if M (j, i) ~ = 0
                M (j, i: n + 1) = M (j, i: n + 1) - (M (j, i) / M (i, i)) * M (i, i: n + 1)
            end for
        end for
    end for

    // Delivery of results
    x = subst (M); // Backward substitution
```

#### • LU factorization

Program that finds the solution to the system  $Ax = b$  and the LU factorization of A using the LU factorization method with simple Gaussian elimination.

Pseudocode:

Input:  
A, invertible matrix  
b, constant vector

Output:  
x, solution  
L, factorization matrix L  
U, U matrix of factorization

```
lu (A, b):

    // Initialization
    n = size (A, 1)
    L = eye (n)
    U = zeros (n)
    M = A

    //Factoring
    for i = 1: n-1
        for j = i + 1: n
            if M (j, i) ~ = 0
                L (j, i) = M (j, i) / M (i, i)
                M (j, i: n) = M (j, i: n) - (M (j, i) / M (i, i)) * M (i, i: n)
            end if
        end for
        U (i, i: n) = M (i, i: n)
        U (i + 1, i + 1: n) = M (i + 1, i + 1: n)
    end for
```

```

U (n, n) = M (n, n)

// Delivery of results
z = subs ([L b])
x = subs ([U z])

```

- **Doolittle**

Program that finds the solution to the system  $Ax = b$  and the LU factorization of  $A$  using the Doolittle method.

Pseudocode:

Input:

A, invertible matrix  
b, constant vector

Output:

x, solution  
L, factorization matrix L  
U, U matrix of factorization

//function

Doolittle (A, b):

```

// Initialization
n = size (A, 1)
L = eye (n)
U = eye (n)

//Factoring
for i = 1: n-1
    for j = i: n
        U (i, j) = A (i, j) -dot (L (i, 1: i-1), U (1: i-1, j) ')
    end for
    for j = i + 1: n
        L (j, i) = (A (j, i) -dot (L (j, 1: i-1), U (1: i-1, i) ')) / U (i, i)
    end for
end for
U (n, n) = A (n, n) -dot (L (n, 1: n-1), U (1: n-1, n) ')

// Delivery of results
z = nounprgr ([L b])
x = subregr ([U z])

```

- **Crout**

Program that finds the solution to the system  $Ax = b$  and the LU factorization of  $A$  using the Crout method.

Pseudocode:

Input:

A, invertible matrix  
b, constant vector

Output:

x, solution  
L, factorization matrix L  
U, U matrix of factorization



```

//function
Crout (A, b):

    // Initialization
    n = size (A, 1)
    L = eye (n)
    U = eye (n)

    //Factoring
    for i = 1: n-1
        for j = i: n
            L (j, i) = A (j, i) -dot (L (j, 1: i-1), U (1: i-1, i) ')
        end for
        for j = i + 1: n
            U (i, j) = (A (i, j) -dot (L (i, 1: i-1), U (1: i-1, j) ')) / L (i, i)
        end for
    end for
    L (n, n) = A (n, n) -dot (L (n, 1: n-1), U (1: n-1, n) ')

    // Delivery of results
    z = noundprgr ([L b])
    x = subregr ([U z])

```

- **Cholesky**

Program that finds the solution to the system  $Ax = b$  and the LU factorization of A using the Cholesky method.

Pseudocode:

Input:

A, invertible matrix  
b, constant vector

Output:

x, solution  
L, factorization matrix L  
U, U matrix of factorization

```

//function
Cholesky (A, b):

    // Initialization
    n = size (A, 1)
    L = eye (n)
    U = eye (n)

    //Factoring
    for i = 1: n-1
        L (i, i) = sqrt (A (i, i) -dot (L (i, 1: i-1), U (1: i-1, i) '))
        U (i, i) = L (i, i)
        for j = i + 1: n
            L (j, i) = (A (j, i) -dot (L (j, 1: i-1), U (1: i-1, i) ')) / U (i, i)
        end for
        for j = i + 1: n
            U (i, j) = (A (i, j) -dot (L (i, 1: i-1), U (1: i-1, j) ')) / L (i, i)
        end for
    end for

```

```

L (n, n) = sqrt (A (n, n) -dot (L (n, 1: n-1), U (1: n-1, n) '))
U (n, n) = L (n, n)

// Delivery of results
z = nounprgr ([L b])
x = subregr ([U z])

```

- **Jacobi**

Program that finds the solution to the system  $Ax = b$  using the Jacobi method.  
Pseudocode:

Input:  
A, invertible matrix  
b, constant vector  
x0, initial approximation  
tol, tolerance  
Nmax, maximum number of iterations

Output:  
x, solution  
iter, number of iterations  
err, error

jacobi (A, b, x0, tol, Nmax):

```

// Initialization
D = diag (diag (A))
L = -tril (A) + D
U = -triu (A) + D
T = inv (D) * (L + U)
C = inv (D) * b
xant = x0
E = 1000
cont = 0

//Cycle
while E> tol && cont <Nmax
    xact = T * xant + C
    E = norm (xant-xact)
    xant = xact
    cont = cont + 1
end while

// Delivery of results
x = xact
iter = cont
err = E

```

- **Gauss-Seidel** Program that finds the solution to the system  $Ax = b$  using the Gauss-Seidel method.  
Pseudocode:

Input:  
A, invertible matrix  
b, constant vector  
x0, initial approximation

tol, tolerance  
 Nmax, maximum number of iterations

Output:  
 x, solution  
 iter, number of iterations  
 err, error

gseidel (A, b, x0, tol, Nmax):

```
// Initialization
D = diag (diag (A))
L = -tril (A) + D
U = -triu (A) + D
T = inv (D-L) * U
C = inv (D-L) * b
xant = x0
E = 1000
cont = 0

//Cycle
while E> tol && cont <Nmax
    xact = T * xant + C
    E = norm (xant-xact)
    xant = xact
    cont = cont + 1
end while

// Delivery of results
x = xact
iter = cont
err = E
```

### 3.3 Interpolation

- Vandermonde

Program that finds the interpolating polynomial of the given data using the Vandermonde method.

Pseudocode:

Input:  
 X, abscissa  
 And, ordered

Output:  
 Coef, coefficients of the polynomial

vandermonde (X, Y):

```
// Initialization
n = length (X)
A = zeros (n)

//Cycle
for i = 1: n
    A (:, i) = (X. ^ (N-i)) '
end for
```

```
// Delivery of results
Coef = A \ Y '
```

- **Divided differences**

Program that finds the interpolating polynomial of the given data using the Divided differences method.

Pseudocode:

Input:

X, abscissa

And, ordered

Output:

Coef, coefficients of Newton's polynomial

differences (X, Y):

```
// Initialization
n = length (X)
A = zeros (n)

//Cycle
D (:, 1) = Y '
for i = 2: n
    aux0 = D (i-1: n, i-1)
    aux = diff (aux0)
    aux2 = X (i: n) -X (1: n-i + 1)
    D (i: n, i) = aux / aux2 '
end for

// Delivery of results
Coef = diag (D) '
```

- **Lagrange**

Program that finds the interpolating polynomial of the given data using the Lagrange method.

Pseudocode:

Input:

X, abscissa

And, ordered

Output:

L, Lagrange polynomials

Coef, coefficients of the interpolation polynomial

lagrange (X, Y):

```
// Initialization
n = length (X)
L = zeros (n)

//Cycle
for i = 1: n
    aux0 = setdiff (X, X (i))
    aux = [1 -aux0 (1)]
```

```

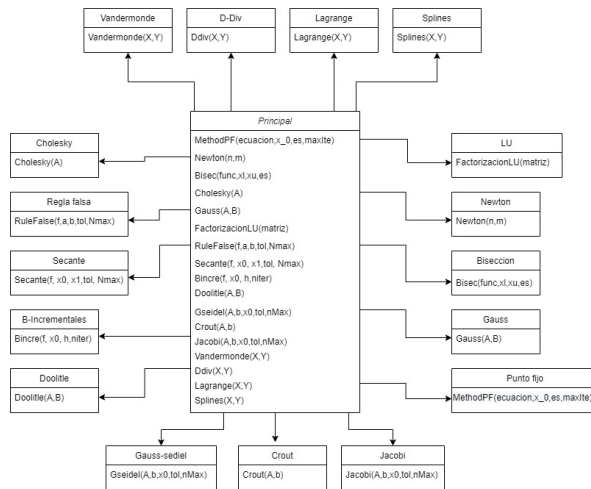
        for j = 2: n-1
            aux = conv (aux, [1 -aux0 (j)])
        end for
        L (i,:) = aux / polyval (aux, X (i))
    end for

    // Delivery of results
    Coef = Y * L

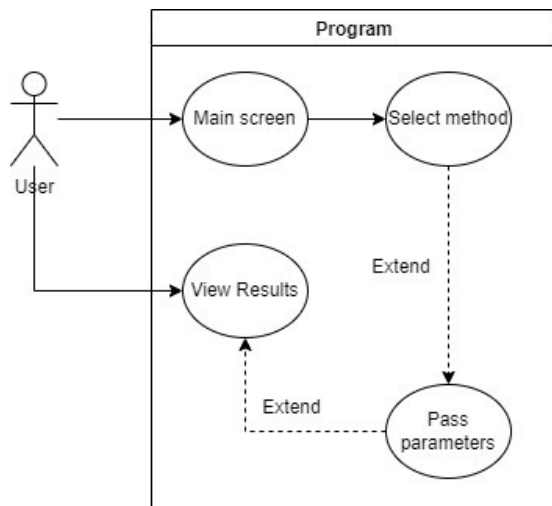
```

## 4 Diagrams

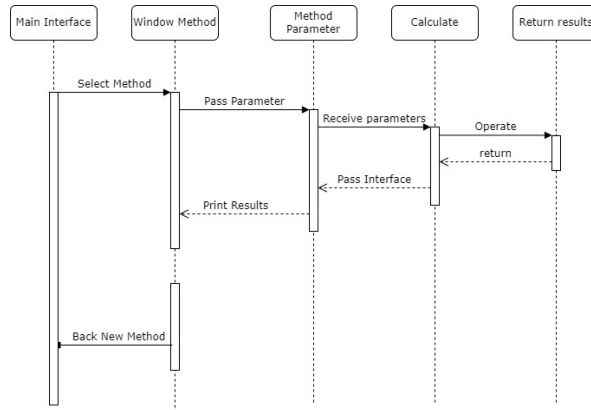
### 4.1 class diagram



### 4.2 use case diagram



### 4.3 sequence diagram



## 5 Conclusions

To carry out this project we have chosen the Python programming language, since it has different benefits compared to other programming languages. the first one is the simplicity in some aspects of the code, since this is a language interpreted with dynamic types. the second is the ease of working with mathematical functions using specialized libraries. and the third reason is the large amount of documentation that exists about the different numerical methods implemented in Python. the limitations or problems we had were related to the graphical interface, since there was no experience in the team to work with it and an accelerated learning curve was required to carry out the project.