

Section: Root-finding

Given a continuous function $f : \mathbb{R} \rightarrow \mathbb{R}$, we often need to find the root of f . Generally, the roots of a function cannot be expressed in a closed form, so root-finding algorithms can provide approximation to the root. There are different type of root-finding methods, here we introduce some of them:

Bracketing Methods (Bisection method, False positoin method...)

We make a initial guess of an interval such that f has different signs at the end points, then the function has a root in the interval by the intermediate value theorem. Then by iterating, we determine a smaller interval, so that the root can be found.

Iterative methods (Newton's method, Secant method...)

In iterative methods we use specific type of iteration by defining an auxiliary function, then iterate until we find the fixed point of the iteration function. This is an application of the fixed-point iteration.

Reference: [Root-finding algorithm](#)

[1] Bracketing Methods

[1.1] Bisection method (二分逼進法)

Condiser a continuous function $f(x) : [a, b] \rightarrow \mathbb{R}$ where $f(a)f(b) < 0$. We wish to find the root of $f(x) = 0$.

Since we already know that there must be a root in the interval, we split uniformly the interval into 2 and we know that at least one of the interval must contains a root. In this way, we get a interval that is half of length of the original one and we are sure that there must be a root exists in the interval. We then repeat the process to identify more accurately the location of the root.

Remark 1: The bisection method ensures that one can find one root. However, there might be multiple roots exist in the interval. Need to find it one by one.

Remark 2: The bisection method requires a bit of knowledge of the root, that is, we need to know in advance a and b such that $f(a)f(b) < 0$. Therefore, there is no way to find the root of $f(x) = (x - \pi)^2$ where the function is always non-negative.

[1.1.1] The bisection method can be given as following:

Let $a_0 = a, b_0 = b$. For $i = 0, 1, 2, \dots, n$

1. Calculate

$$c_i = \frac{a_i + b_i}{2},$$

and calculate $f(c_i)$.

2. If either $|c_i - a_i|$ or $|f(c_i)|$ is smaller than a predefined small number $\epsilon \ll 1$, stop iterating.
3.
 - If $f(c_i)$ has the same sign as $f(a_i)$, let $a_{i+1} = c_i$ and $b_{i+1} = b_i$.
 - Otherwise, let $a_{i+1} = b_i$ and $b_{i+1} = c_i$.

Reference: [Bisection method](#)

Example: Square root of a number:

$$f_1(x) = x^2 - R$$

Bisection iteration

Initial guess: $a_0 = 0, b_0 = R$.

```

# Setup parameters
R = 3;

# eps1: epsilon for values
# eps2: epsilon for function values
eps1 = 1.0e-14; eps2 = eps1;

# Setup the initial interval [a, b]
a = 0; fa = a^2-R;
b = R; fb = b^2-R;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Initialize er1 (error between values) and er2 (error between function values)
er1 = 1; er2 = 1;

# Start the iteration
while er1 > eps1 && er2 > eps2 && n_ite < n_iter_max
    # Define the midpoint c
    c = a + (b-a)/2;

    # Evaluate the function value at the midpoint c
    fc = c^2-R;

    # Determine where is the root
    if(fc*fa<0)
        b=c;
        fb = fc;
    else
        a=c;
        fa = fc;
    end

    # Evaluate errors and number of iterations
    er1 = b-a; er2 = abs(fc);
    n_ite = n_ite + 1;

    # Print the solution at n-th iteration and the exact error
    println("c= ", c, "\t\t", "error= ", abs(c-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations= ", n_ite)

```

```

c= 1.5      error= 0.2320508075688772
c= 2.25     error= 0.5179491924311228
c= 1.875    error= 0.1429491924311228
c= 1.6875   error= 0.04455080756887719

```

c= 1.78125	error= 0.04919919243112281
c= 1.734375	error= 0.002324192431122807
c= 1.7109375	error= 0.021113307568877193
c= 1.72265625	error= 0.009394557568877193
c= 1.728515625	error= 0.003535182568877193
c= 1.7314453125	error= 0.0006054950688771932
c= 1.73291015625	error= 0.0008593486811228068
c= 1.732177734375	error= 0.00012692680612280682
c= 1.7318115234375	error= 0.00023928413137719318
c= 1.73199462890625	error= 5.6178662627193177e-5
c= 1.732086181640625	error= 3.5374071747806823e-5
c= 1.7320404052734375	error= 1.0402295439693177e-5
c= 1.7320632934570312	error= 1.2485888154056823e-5
c= 1.7320518493652344	error= 1.0417963571818234e-6
c= 1.732046127319336	error= 4.680249541255677e-6
c= 1.7320489883422852	error= 1.8192265920369266e-6
c= 1.7320504188537598	error= 3.887151174275516e-7
c= 1.732051134109497	error= 3.265406198771359e-7
c= 1.7320507764816284	error= 3.1087248775207854e-8
c= 1.7320509552955627	error= 1.4772668555096402e-7
c= 1.7320508658885956	error= 5.8319718387878083e-8
c= 1.732050821185112	error= 1.3616234806335115e-8
c= 1.7320507988333702	error= 8.73550698443637e-9
c= 1.732050810009241	error= 2.4403639109493724e-9
c= 1.7320508044213057	error= 3.1475715367434987e-9
c= 1.7320508072152734	error= 3.536038128970631e-10
c= 1.7320508086122572	error= 1.0433800490261547e-9
c= 1.7320508079137653	error= 3.448881180645458e-10
c= 1.7320508075645193	error= 4.3578474162586645e-12
c= 1.7320508077391423	error= 1.7026513532414356e-10
c= 1.7320508076518308	error= 8.295364395394245e-11
c= 1.732050807608175	error= 3.929789826884189e-11
c= 1.7320508075863472	error= 1.7470025426291613e-11
c= 1.7320508075754333	error= 6.556089005016474e-12
c= 1.7320508075699763	error= 1.099120794378905e-12
c= 1.7320508075672478	error= 1.6293633109398797e-12
c= 1.732050807568612	error= 2.651212582804874e-13
c= 1.7320508075692942	error= 4.169997680492088e-13
c= 1.7320508075689531	error= 7.593925488436071e-14
c= 1.7320508075687826	error= 9.459100169806334e-14
c= 1.7320508075688679	error= 9.325873406851315e-15
c= 1.7320508075689105	error= 3.3306690738754696e-14
c= 1.7320508075688892	error= 1.199040866595169e-14
c= 1.7320508075688785	error= 1.3322676295501878e-15
Total number of iterations= 48	

[1.2] Method of false position

Consider a continuous function $f(x) : [a, b] \rightarrow \mathbb{R}$ where $f(a)f(b) < 0$. We wish to find the root of $f(x) = 0$.

We know that the root is located between a and b . To have a guess of the root, intuitively one can use a linear approximation to it, that is, assuming that the function is linear and we draw a line to connect the two points $(a, f(a))$ and $(b, f(b))$, and look for the intersection between this line and the x-axis. This is exactly the idea of the method of false position.

[1.2.1] The method of false position (which is really similar to bisection method) can be given as following:

Let $a_0 = a, b_0 = b$. For $i = 0, 1, 2, \dots, n$

1. Calculate

$$c_i = a_i - \frac{f(a_i)(b_i - a_i)}{f(b_i) - f(a_i)} = \frac{a_i f(b_i) - b_i f(a_i)}{f(b_i) - f(a_i)},$$

and calculate $f(c_i)$.

2. If $|c_i - a_i|$ is small or $|f(c_i)|$ is small, stop iterating.
3.
 - If $f(c_i)$ has the same sign as $f(a_i)$, let $a_{i+1} = c_i$ and $b_{i+1} = b_i$.
 - Otherwise, let $a_{i+1} = b_i$ and $b_{i+1} = c_i$.

Reference: [False position method](#)

Example: Square root of a number:

$$f_1(x) = x^2 - R$$

False position iteration

Initial guess: $a_0 = 0, b_0 = R$.

```
# Setup parameters
R = 3;

# eps1: epsilon for values
# eps2: epsilon for function values
eps1 = 1.0e-14; eps2 = eps1;

# Setup the initial interval [a, b]
a = 0; fa = a^2-R;
b = R; fb = b^2-R;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Initialize er1 (error between values) and er2 (error between function values)
er1 = 1; er2 = 1;

# Start the iteration
while er1 > eps1 && er2 > eps2 && n_ite < n_iter_max
    # Evaluate c and f(c)
    c = a - fa*(b-a)/(fb-fa);
    fc = c^2-R;

    # Determine where is the root
    if(fc*fa < 0)
        b=c;
        fb = fc;
    else
        a=c;
        fa = fc;
    end

    # Evaluate errors and number of iterations
    er1 = b-a; er2 = abs(fc);
    n_ite = n_ite + 1;

    # Print the solution at n-th iteration and the exact error
    println("c= ", c, "\t\t", "error= ", abs(c-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)
```

c= 1.0	error= 0.7320508075688772
c= 1.5	error= 0.2320508075688772
c= 1.6666666666666667	error= 0.06538414090221045
c= 1.7142857142857142	error= 0.017765093283163003
c= 1.7272727272727273	error= 0.0047780802961499
c= 1.7307692307692308	error= 0.0012815767996463556
c= 1.7317073170731707	error= 0.0003434904957064777
c= 1.731958762886598	error= 9.204468227919094e-5
c= 1.7320261437908497	error= 2.4663778027456118e-5
c= 1.7320441988950277	error= 6.608673849495261e-6
c= 1.7320490367775832	error= 1.7707912940423398e-6
c= 1.7320503330866026	error= 4.74482274581689e-7
c= 1.7320506804317222	error= 1.2713715502599143e-7
c= 1.7320507735025783	error= 3.4066298892909685e-8
c= 1.73205079844084	error= 9.128037214978235e-9
c= 1.732050805123027	error= 2.44585018904786e-9
c= 1.7320508069135137	error= 6.553635412132053e-10
c= 1.7320508073932732	error= 1.75603975804961e-10
c= 1.7320508075218244	error= 4.705280609584861e-11
c= 1.7320508075562695	error= 1.2607692667643278e-11
c= 1.732050807565499	error= 3.3781866193294263e-12
c= 1.7320508075679721	error= 9.050538096744276e-13
c= 1.7320508075686347	error= 2.424727085781342e-13
c= 1.7320508075688124	error= 6.483702463810914e-14
c= 1.7320508075688599	error= 1.7319479184152442e-14
c= 1.7320508075688725	error= 4.6629367034256575e-15
c= 1.732050807568876	error= 1.1102230246251565e-15
Total number of iterations=27	

[2] Iterative methods

[2.1] Newton's method (切線法)

Suppose we are given the point $(x_n, f(x_n))$ and the slope at this point $f'(x_n)$, we can then draw the tangent line and look for the intersection between this tangent line and the x-axis. This should be a good guess of the root and this is exactly the idea of Newton's method.

[2.1.1] The Newton's method is given as the following:

Given an initial guess x_0 , for $n = 0, 1, 2, \dots$

$$x_{n+1} = x_n - \frac{f(x_n)}{f'(x_n)}$$

and iterate until $|x_{n+1} - x_n|$ is small enough or we exceeded the maximum number of iterations.

Reference: [Newton's method](#)

Example 1: Square root of a number:

$$f_1(x) = x^2 - R$$

Newton's iteration

$$x_{n+1} = x_n - \frac{f_1(x_n)}{f_1'(x_n)} = x_n - \frac{x_n^2 - R}{2x_n} = \frac{x_n}{2} + \frac{R}{2x_n}$$


```

# Setup parameters
R = 3;

# eps: epsilon for function values
eps = 1.0e-14;

# Initial guess x0
x0 = 1;

# Initialize er: error between values
er = 1;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Start the iteration
while er > eps && n_ite < n_iter_max
    # Evaluate the next point
    x1 = x0/2 + R/(2*x0);

    # Evaluate error, number of iterations
    er = abs(x1-x0);
    n_ite = n_ite + 1;

    # Initialize the next iteration
    x0 = x1;

    # Print the solution at n-th iteration and the exact error
    println("x1= ", x1, "\t\t", "error= ", abs(x1-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)

```

```

x1= 2.0      error= 0.2679491924311228
x1= 1.75     error= 0.017949192431122807
x1= 1.7321428571428572      error= 9.204957398001312e-5
x1= 1.7320508100147274     error= 2.44585018904786e-9
x1= 1.7320508075688772     error= 0.0
x1= 1.7320508075688772     error= 0.0
Total number of iterations=6

```

Example 2: Square of a number but with difference function

$$f_2(x) = (x^2 - R)^2$$

Newton's iteration

$$x_{n+1} = x_n - \frac{(x_n^2 - R)^2}{4x_n(x_n^2 - R)} = \frac{3x_n}{4} + \frac{R}{4x_n}$$

```
# Setup parameters
R = 3;

# eps: epsilon for function values
eps = 1.0e-14;

# Initial guess x0
x0 = 1;

# Initialize er: error between values
er = 1;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Start the iteration
while er > eps && n_ite < n_iter_max
    # Evaluate the next point
    x1 = 3*x0/4 + R/(4*x0);

    # Evaluate error, number of iterations
    er = abs(x1-x0);
    n_ite = n_ite + 1;

    # Initialize the next iteration
    x0 = x1;

    # Print the solution at n-th iteration and the exact error
    println("x1= ", x1, "\t\t", "error= ", abs(x1-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)
```

Julia

x1= 1.5	error= 0.2320508075688772
x1= 1.625	error= 0.1070508075688772
x1= 1.6802884615384617	error= 0.05176234603041552
x1= 1.7065682774843183	error= 0.02548253008455892
x1= 1.7194046690076297	error= 0.012646138561247522
x1= 1.7257509912233235	error= 0.006299816345553655
x1= 1.7289066487316345	error= 0.0031441588372427276
x1= 1.730480157628071	error= 0.0015706499408061347
x1= 1.731265838993956	error= 0.0007849685749212743
x1= 1.7316584122590377	error= 0.00039239530983947724
x1= 1.7318546321432375	error= 0.0001961754256396553
x1= 1.7319527254114888	error= 9.808215738837944e-5
x1= 1.7320017678788049	error= 4.9039690072305575e-5
x1= 1.7320262880709671	error= 2.451949791004715e-5
x1= 1.7320385479067	error= 1.2259662177216413e-5
x1= 1.7320446777594827	error= 6.129809394517238e-6
x1= 1.7320477426696035	error= 3.0648992737081215e-6
x1= 1.7320492751205963	error= 1.5324482809386808e-6
x1= 1.7320500413450757	error= 7.66223801518251e-7
x1= 1.7320504244570611	error= 3.831118160491087e-7
x1= 1.7320506160129905	error= 1.9155588670827228e-7
x1= 1.7320507117909392	error= 9.577793802506562e-8
x1= 1.7320507596799095	error= 4.788896768026518e-8
x1= 1.732050783624394	error= 2.394448328502108e-8
x1= 1.7320507955966358	error= 1.1972241420465934e-8
x1= 1.7320508015827565	error= 5.986120710232967e-9
x1= 1.7320508045758167	error= 2.993060466138786e-9
x1= 1.732050806072347	error= 1.496530233069393e-9
x1= 1.7320508068206122	error= 7.482650055123941e-10
x1= 1.7320508071947447	error= 3.7413250275619703e-10
x1= 1.7320508073818108	error= 1.8706636240040098e-10
x1= 1.7320508074753442	error= 9.353295915559556e-11
x1= 1.7320508075221106	error= 4.6766590600100244e-11
x1= 1.732050807545494	error= 2.3383295300050122e-11
x1= 1.7320508075571857	error= 1.1691536627722598e-11
x1= 1.7320508075630314	error= 5.845768313861299e-12
x1= 1.7320508075659542	error= 2.922995179233112e-12
x1= 1.7320508075674157	error= 1.461497589616556e-12
x1= 1.7320508075681464	error= 7.30748794808278e-13
x1= 1.7320508075685117	error= 3.6548541970660153e-13
x1= 1.7320508075686945	error= 1.8274270985330077e-13
x1= 1.7320508075687857	error= 9.14823772291129e-14
x1= 1.7320508075688315	error= 4.574118861455645e-14
x1= 1.7320508075688543	error= 2.2870594307278225e-14
x1= 1.7320508075688656	error= 1.1546319456101628e-14
x1= 1.7320508075688714	error= 5.773159728050814e-15

Total number of iterations=46

Example 3: Square of a number but with difference function

$$f_3(x) = x^4 - R^2$$

Newton's iteration

$$x_{n+1} = x_n - \frac{(x_n^4 - R^2)}{4x_n^3} = \frac{3x_n}{4} + \frac{R^2}{4x_n^3}$$

```
# Setup parameters
R = 3;

# eps: epsilon for function values
eps = 1.0e-14;

# Initial guess x0
x0 = 1;

# Initialize er: error between values
er = 1;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Start the iteration
while er > eps && n_ite < n_iter_max
    # Evaluate the next point
    x1 = 3*x0/4 + R^2/(4*x0^3);

    # Evaluate error, number of iterations
    er = abs(x1-x0);
    n_ite = n_ite + 1;

    # Initialize the next iteration
    x0 = x1;

    # Print the solution at n-th iteration and the exact error
    println("x1= ", x1, "\t\t", "error= ", abs(x1-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)
```

Julia

x1= 3.0	error= 1.2679491924311228
x1= 2.3333333333333335	error= 0.6012825257644563
x1= 1.9271137026239067	error= 0.1950628950550295
x1= 1.75971932364339	error= 0.027668516074512706
x1= 1.732696552935594	error= 0.0006457453667167989
x1= 1.7320511684660165	error= 3.60897139284333e-7
x1= 1.73205080756899	error= 1.127986593019159e-13
x1= 1.7320508075688772	error= 0.0
x1= 1.7320508075688774	error= 2.220446049250313e-16
Total number of iterations=9	

Example 4:

$$f_4(x) = \frac{1}{\sqrt{x^2 - R}}$$

Newton's iteration

$$x_{n+1} = x_n - \frac{\frac{1}{\sqrt{x_n^2 - R}}}{\frac{-x_n}{(x_n^2 - R)^{3/2}}} = 2x_n - \frac{R}{x_n}$$

```
# Setup parameters
R = 3;

# eps: epsilon for function values
eps = 1.0e-14;

# Initial guess x0
x0 = 1;

# Initialize er: error between values
er = 1;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Start the iteration
while er > eps && n_ite < n_iter_max
    # Evaluate the next point
    x1 = 2*x0 - R/x0;

    # Evaluate error, number of iterations
    er = abs(x1-x0);
    n_ite = n_ite + 1;

    # Initialize the next iteration
    x0 = x1;

    # Print the solution at n-th iteration and the exact error
    println("x1= ", x1, "\t\t", "error= ", abs(x1-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)
```

Julia

x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
x1= 1.0	error= 0.7320508075688772
x1= -1.0	error= 2.732050807568877
Total number of iterations=50	

This loop goes on forever.

[2.2] Secant method (割線法)

Secant method can be thought as an extension of Newton's method, and also share some idea of the method of false position. In Newton's method, we require the knowledge of the function value as well as its derivative, so that one can draw the tangent line at a given point and find the root of that line. However, there might be circumstance where the derivative is not known or not easy to obtain so that we don't have the tangent line exactly. The idea of secant method is to approximate this tangent line using the function values at two points, then we find the root of this approximated tangent line as the next guess.

Suppose we are given the points $(x_{n-1}, f(x_{n-1}))$ and $(x_n, f(x_n))$, we can then draw a line passing through this two points and look for the intersection between this approximated tangent line and the x-axis. This should be a good guess of the root and this is exactly the idea of secant method.

[2.2.1] Secant method is given as the following:

Given initial guesses x_0 and x_1 , for $n = 1, 2, \dots$

$$x_{n+1} = x_n - f(x_n) \frac{x_n - x_{n-1}}{f(x_n) - f(x_{n-1})}$$

and iterate until $|x_{n+1} - x_n|$ is small enough or we exceeded the maximum number of iterations.

Reference: [Secant method](#)

Example 5: Square root of a number:

$$f_1(x) = x^2 - R$$

Secant iteration:

Initial guess: $x_0 = 0, x_1 = R$.

$$x_{n+1} = x_n - f(x_n) \frac{x_n - x_{n-1}}{f(x_n) - f(x_{n-1})} = x_n - (x_n^2 - R) \frac{(x_n - x_{n-1})}{(x_n^2 - R) - (x_{n-1}^2 - R)} = \frac{x_n x_{n-1} + R}{x_n + x_{n-1}}$$

```
# Setup parameters
R = 3;

# eps: epsilon for function values
eps = 1.0e-14;

# Initial guess x0 and x1
x0 = 1;
x1 = 2;

# Initialize er: error between values
er = 1;

# n_iter_max: max. number of iterations
n_ite = 0; n_iter_max = 50;

# Start the iteration
while er > eps && n_ite < n_iter_max
    # Evaluate the next point
    x2 = (x0*x1+R)/(x0+x1);

    # Evaluate error, number of iterations
    er = abs(x2-x1);
    n_ite = n_ite + 1;

    # Initialize the next iteration
    x0 = x1;
    x1 = x2;

    # Print the solution at n-th iteration and the exact error
    println("x2= ", x2, "\t\t", "error= ", abs(x2-sqrt(R)))
end

# Print total number of iterations
println("Total number of iterations=", n_ite)
```

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x2= 1.6666666666666667	error= 0.06538414090221045
x2= 1.7272727272727273	error= 0.0047780802961499
x2= 1.7321428571428572	error= 9.204957398001312e-5
x2= 1.7320506804317224	error= 1.2713715480394683e-7
x2= 1.7320508075654992	error= 3.3779645747245013e-12
x2= 1.7320508075688772	error= 0.0
x2= 1.7320508075688772	error= 0.0
Total number of iterations=7	

Summary

So, as a brief summary. We have shown several examples of finding the root, including bisection, false position, Newton's and secant method.

Regarding bracketing methods, we see that the bisection and false position method both converges to the true solution. Also, false position method seems to be a little bit faster in convergence. So the questions are the following: * Can we show/prove that the bisection and false position method indeed converge to the solution? * Is it true that false position method converges faster than Bisection method?

The second set of questions concerns about the Newton's method: * In what circumstances does the Newton's method converges? * If the Newton's iteration converges, what is the rate of convergence?