## Root finding

## Eugeniy E. Mikhailov

The College of William \& Mary


Lecture 06

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## Example

$$
3 x^{3}+2=\sin x \rightarrow 3 x^{3}+2-\sin x=0
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A general search algorithm is the following

- make a guess i.e. trial
- make intelligent new guess $\left(x_{i+1}\right)$ judging from this trial $\left(x_{i}\right)$
- continue until $\left|f\left(x_{i+1}\right)\right|>\varepsilon_{f}$ and $\left|x_{i+1}-x_{i}\right|>\varepsilon_{x}$


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Let's play a simple game:

- some one think of any number between 1 and 100
- I will make a guess
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## Example

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- some one think of any number between 1 and 100
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- you provide me with either "less" or "more" depending where is my guess with respect to your number
How many guesses do I need? At most 7


## Bisection method pseudo code

Works for any continuous function in vicinity of function root

- make initial bracket for search $x_{+}$and $x_{-}$such that
- $f\left(x_{+}\right)>0$
- $f\left(x_{-}\right)<0$
- loop begins
- make new guess value $x_{g}=\left(x_{+}+x_{-}\right) / 2$
- if $\left|f\left(x_{g}\right)\right| \leq \varepsilon_{f}$ or $\left|x_{+}-x_{g}\right| \leq \varepsilon_{x}$
stop we found the solution with desired approximation
- otherwise if $f\left(x_{g}\right)>0$ then $x_{+}=x_{g}$ else $x_{-}=x_{g}$
- continue the loop



## Bisection - simplified matlab implementation

```
function x_sol=bisection(f, xn, xp, eps_f, eps_x)
% solving f (x)=0 with bisection method
xg=(xp+xn)/2; % initial guess 
while ( (abs(fg) > eps_f) & (abs(xg-xp)>eps_x) )
    if (fg>0)
        xp=xg;
    else
        xn=xg;
    end
    xg=(xp+xn)/2; % update guess
    fg=f(xg); % update function evaluation
end
x_sol=xg; % solution is ready
```

end

## Bisection - example of use

Let's define simple test function in the file 'function_to_solve.m'

```
function ret=function_to_solve(x)
    ret=(x-10) * (x-20) * (x+3);
end
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$$
\begin{aligned}
& \text { bisection(... } \\
& \text { @function_to_solve,... } \\
& -4.1,2, \ldots \\
& 1 e-6,1 e-8)
\end{aligned}
$$

pay attention to the function handle operator @

$$
a n s=-3.0000
$$

always cross check results

$$
\begin{aligned}
& \gg \text { function_to_solve(ans) } \\
& \text { ans }=3.0631 \mathrm{e}-07
\end{aligned}
$$

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> Muphry's Law

Never expect that user will put valid inputs.
So what should we check for sure
(1) $f(x n)<0$
(2) $f(x p)>0$

It would be handy to return secondary outputs

- with the value of function at the found solution point
- the number of iterations (good for performance tests)


## False position (regula falsi) method

In this method we naively approximate our function as a line.


## False position method - pseudo code

- make initial bracket for search $x_{+}$and $x_{-}$such that
- $f\left(x_{+}\right)>0$
- $f\left(x_{-}\right)<0$
- loop begins
- draw a chord between points $\left(x_{-}, f\left(x_{-}\right)\right)$and $\left(x_{+}, f\left(x_{+}\right)\right)$
- make new guess value at the point of the chord intersection with the ' $x$ ' axis

$$
x_{g}=\frac{x_{-} f\left(x_{+}\right)-x_{+} f\left(x_{-}\right)}{f\left(x_{+}\right)-f\left(x_{-}\right)}
$$

- if $\left|f\left(x_{g}\right)\right| \leq \varepsilon_{f}$ or $\left|x_{+}-x_{g}\right| \leq \varepsilon_{x}$ stop we found the solution with desired approximation
- otherwise if $f\left(x_{g}\right)>0$ then $x_{+}=x_{g}$ else $x_{-}=x_{g}$
- continue the loop

Note: it looks like bisection except the way of updating $x_{g}$

## Solution convergence

We say that algorithm has defined convergence if it is possible to express

$$
\lim _{k \rightarrow \infty}\left(x_{k+1}-x_{0}\right)=c\left(x_{k}-x_{0}\right)^{m}
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Where $x_{0}$ is true root of the equation, $c$ is some constant, and $m$ is the order of convergence.

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- it is generally impossible to define convergence order for the false position method


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Generally the speed of the algorithm is related to its convergence order. How ever other factors may affect the speed.

