MA 322: Scientific Computing Lecture - 1



Unit-I

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 - Numerical methods for solving scalar nonlinear equations.

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More precisely, can we solve non-linear IVP exactly?



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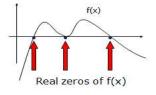
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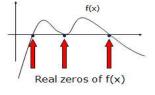
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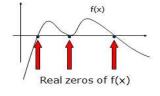
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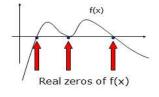
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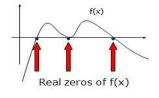


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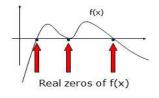
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• The numerical methods for finding the roots are called *iterative methods*, and they are the main subject of next few lectures.



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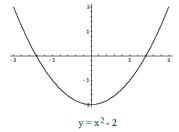
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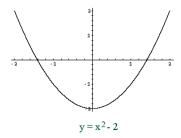
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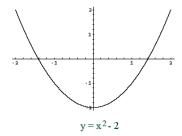


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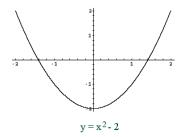


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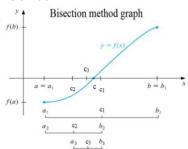
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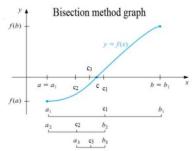
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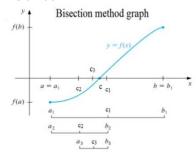
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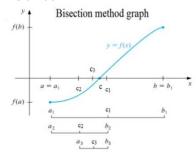




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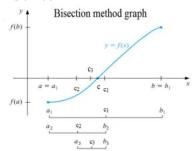


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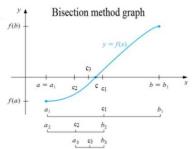
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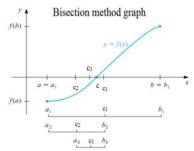
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Example of bisection method

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Definition: A sequence of iterates $\langle x_n \rangle$ is said to converge with order $p \geq 1$ to the actual root α if

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