

محاضرات التحليل العددي

Numerical Analyses Methods



Numerical Analyses Methods

Solution of Nonlinear Equations:-

1) Bisection Method:

The bisection method (sometimes called the midpoint method for equations) is a method used to estimate the solution of an equation

we approach this problem by writing the equation in the form $f(x) = 0$ for some function $f(x)$. This reduces the problem to (finding a root for the function $f(x)$)

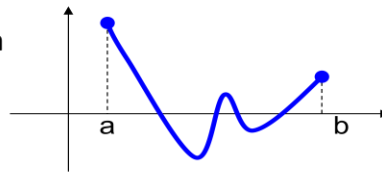
the Bisection Method needs a closed interval $[a,b]$ for which the function $f(x)$ is positive at one endpoint and negative at the other. In other words $f(x)$ must satisfy the condition $f(a)*f(b) < 0$. This means that this algorithm can not be applied to find tangential roots

There are several advantages that the Bisection method

The number of steps required to estimate the root within the desired error can be easily computed before the algorithm is applied. This gives a way to compute how long the algorithm will compute. (Real-time applications

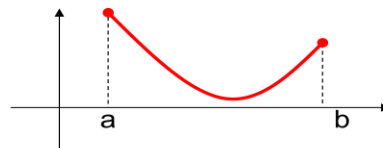
NOTE

- If $f(a)$ and $f(b)$ have the same sign, the function may have an even number of real zeros or no real zeros in the interval $[a, b]$.



The function has four real zeros

- Bisection method can not be used in these cases.



The function has no real zeros

Bisection Algorithm

The idea for the Bisection Algorithm is to cut the interval $[a, b]$ you are given in half (bisect it) on each iteration by computing the midpoint P . The midpoint will replace either a or b depending on if the sign of $f(P)$ agrees with $f(a)$ or $f(b)$.

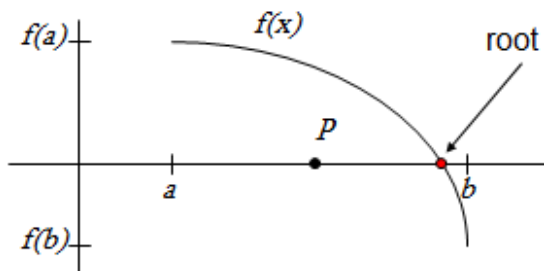
Step 1: Compute $P = (a+b)/2$

Step 2: If $\text{sign}(f(P)) = 0$ then end algorithm

else If $\text{sign}(f(P)) = \text{sign}(f(a))$ then $a = P$

else $b = P$

Step 3: Return to step 1



This shows how the points a , b and P are related.

Assumptions:

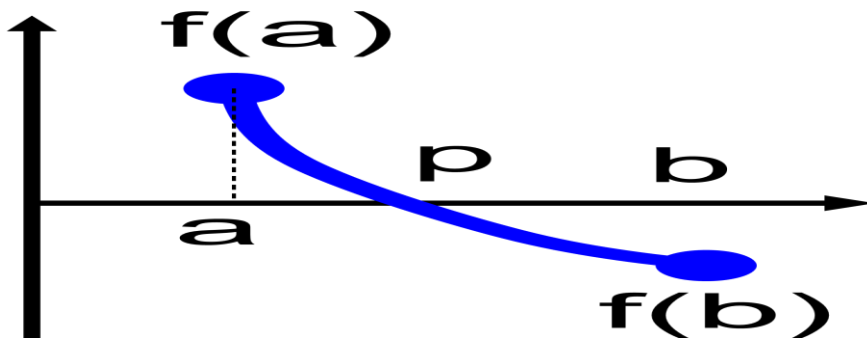
- $f(x)$ is continuous on $[a, b]$
- $f(a) f(b) < 0$

Algorithm:

Loop

1. Compute the mid point $p=(a+b)/2$
2. Evaluate $f(c)$
3. If $f(a) f(p) < 0$ then new interval $[a, p]$
If $f(a) f(p) > 0$ then new interval $[p, b]$

End loop



Example

Can you use Bisection method to find a zero of :

$f(x) = x^3 - 3x + 1$ in the interval $[0,1]$?

Answer:

$f(x)$ is continuous on $[0,1]$

and $f(0)*f(1) = (1)(-1) = -1 < 0$

\Rightarrow Assumptions are satisfied

\Rightarrow Bisection method can be used

Example

Use Bisection method to find a root of the equation $x = \cos(x)$ with absolute error < 0.02

(assume the initial interval $[0.5, 0.9]$)

$$f(a) = -0.3776$$

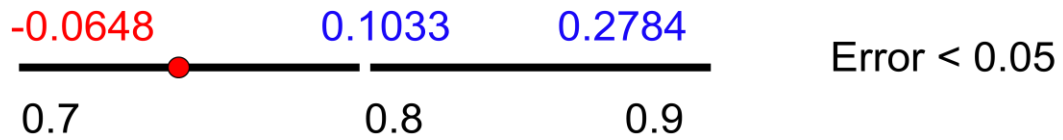
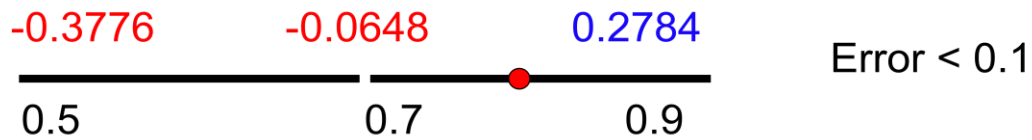
$$f(b) = 0.2784$$

Error < 0.2

$$a = 0.5$$

$$c = 0.7$$

$$b = 0.9$$



Iteration	a	b	$c = \frac{a+b}{2}$	f(c)
1	0	1	0.5	-0.375
2	0	0.5	0.25	0.266
3	0.25	0.5	.375	-7.23E-3
4	0.25	0.375	0.3125	9.30E-2
5	0.3125	0.375	0.34375	9.37E-3

In order to compute the number of iteration we use the following equation :-

$$n \geq \frac{\log(b - a) - \log(\varepsilon)}{\log(2)}$$

Example

Lets apply the Bisection Method to the same function as we did for the Regula-Falsi Method. The equation is: $x^3 - 2x - 3 = 0$, the function is: $f(x) = x^3 - 2x - 3$.

This function has a root on the interval [0,2]

Iteration	a	b	x_{mid}	$f(a)$	$f(b)$	$f(x_{mid})$
1	0	2	1	-3	1	-4
2	1	2	1.5	-4	1	-2.262
3	1.5	2	1.75	-2.262	1	-1.140
4	1.75	2	1.875	-1.140	1	-.158

Advantages

- **Simple** and easy to implement
- **One** function evaluation per iteration
- The **size** of the interval containing the zero is reduced by 50% after each iteration
- The **number of iterations** can be determined **a priori**
- **No** knowledge of the **derivative** is needed
- The function does **not** have to be **differentiable**

Disadvantage

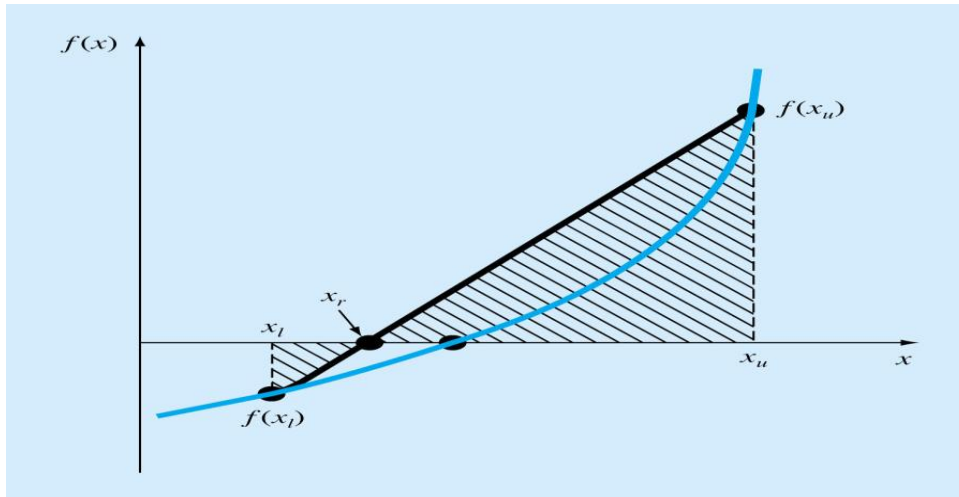
- **Slow** to converge

Good intermediate approximations may be **discarded**

2) False position method

If a real root is bounded by a and b of $f(x)=0$, then we can approximate the solution by doing a linear interpolation between the points

$[a, f(a)]$ and $[b, f(b)]$ to find the c value such that $f(c)=0$, where $f(x)$ is the linear approximation of $f(x)$.



1. Find a pair of values of a, b and x such that $f_l = f(a) < 0$ and $f_u = f(b) > 0$.
2. Estimate the value of the root from the following formula:-

$$c = \frac{af_u - bf_l}{f_u - f_l}$$

and evaluate $f(c)$.

3. Use the new point to replace one of the original points, keeping the two points on opposite sides of the x axis.

$$\text{If } f(c) < 0 \text{ then } a=c \implies \underset{l}{f} = f(c)$$

$$\text{If } f(c) > 0 \text{ then } b=c \implies \underset{u}{f} = f(c)$$

If $f(c) = 0$ then you have found the root and need go no further!

4. See if the new x_l and x_u are close enough for convergence to be declared. If they are not go back to step 2.

example1:- Root of $f(x) = x^3 - 0.165x^2 + 3.993 \times 10^{-4} = 0$ for false-position method.

Iteration	x_L	x_U	x_r	$ \epsilon_a \%$	$f(x_m)$
1	0.0000	0.1100	0.0660	----	-3.1944×10^{-5}
2	0.0000	0.0660	0.0611	8.00	-1.1320×10^{-5}
3	0.0611	0.0660	0.0624	2.05	-1.1313×10^{-7}

Example 2

Find the root of $f(x) = (x - 4)^2(x + 2) = 0$, using the initial guesses of $x_L = -2.5$ and $x_U = -1.0$, and a pre-specified tolerance of $\epsilon_s = 0.1\%$.

Solution

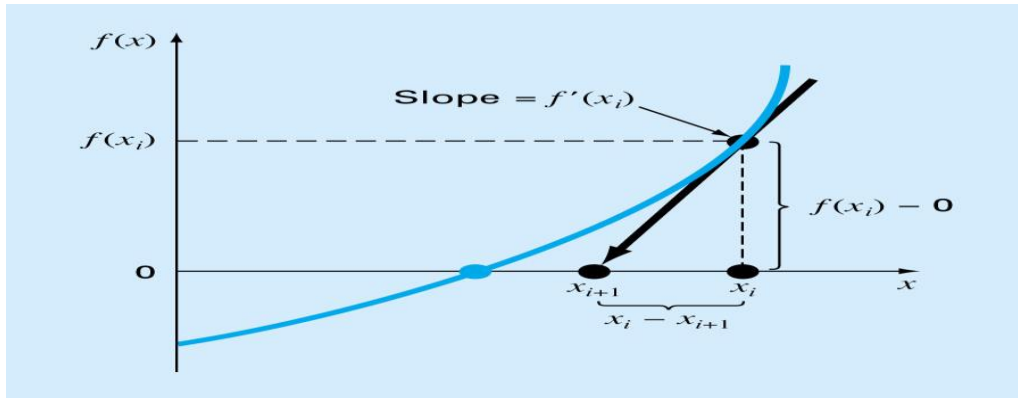
The individual iterations are not shown for this example, but the results are summarized in Table 2. It takes five iterations to meet the pre-specified tolerance.

Table 2 Root of $f(x) = (x - 4)^2(x + 2) = 0$ for false-position method.

Iteration	x_L	x_U	$f(x_L)$	$f(x_U)$	x_r	$ \epsilon_a \%$	$f(x_m)$
1	-2.5	-1	-21.13	25.00	-1.813	N/A	6.319
2	-2.5	-1.813	-21.13	6.319	-1.971	8.024	1.028
3	-2.5	-1.971	-21.13	1.028	-1.996	1.229	0.1542
4	-2.5	-1.996	-21.13	0.1542	-1.999	0.1828	0.02286
5	-2.5	-1.999	-21.13	0.02286	-2.000	0.02706	0.003383

3) Newton-Raphson Method:-

A convenient method for functions whose derivatives can be evaluated analytically. It may not be convenient for functions whose derivatives cannot be evaluated analytically.



Algorithm:-

algorithm

- 1) Evaluate $f'(x)$ symbolically.
- 2) Use an initial guess of the root, x_i , to estimate the new value of the root, x_{i+1} , as

$$x_{i+1} = x_i - \frac{f(x_i)}{f'(x_i)}$$

- 3) Find the absolute relative approximate error as

$$|\epsilon_a| = \left| \frac{x_{i+1} - x_i}{x_{i+1}} \right| \times 100$$

Example 1 Cont.

Solution

To aid in the understanding of how this method works to find the root of an equation, the graph of $f(x)$ is shown to the right,

where

$$f(x) = x^3 - 0.165x^2 + 3.993 \times 10^{-4}$$

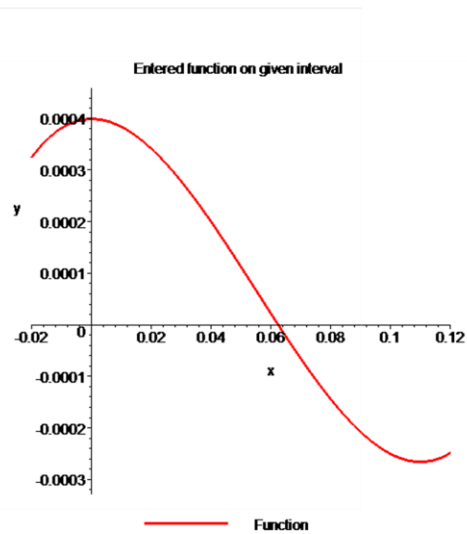


Figure 4 Graph of the function $f(x)$

Example 1 Cont.

Iteration 1

The estimate of the root is

$$\begin{aligned}x_1 &= x_0 - \frac{f(x_0)}{f'(x_0)} \\&= 0.05 - \frac{(0.05)^3 - 0.165(0.05)^2 + 3.993 \times 10^{-4}}{3(0.05)^2 - 0.33(0.05)} \\&= 0.05 - \frac{1.118 \times 10^{-4}}{-9 \times 10^{-3}} \\&= 0.05 - (-0.01242) \\&= 0.06242\end{aligned}$$

Example 1 Cont.

The absolute relative approximate error $|\epsilon_a|$ at the end of Iteration 1 is

$$\begin{aligned} |\epsilon_a| &= \left| \frac{x_1 - x_0}{x_1} \right| \times 100 \\ &= \left| \frac{0.06242 - 0.05}{0.06242} \right| \times 100 \\ &= 19.90\% \end{aligned}$$

The number of significant digits at least correct is 0, as you need an absolute relative approximate error of 5% or less for at least one significant digits to be correct in your result.

Example 1 Cont.

Iteration 2

The estimate of the root is

$$\begin{aligned} x_2 &= x_1 - \frac{f(x_1)}{f'(x_1)} \\ &= 0.06242 - \frac{(0.06242)^3 - 0.165(0.06242)^2 + 3.993 \times 10^{-4}}{3(0.06242)^2 - 0.33(0.06242)} \\ &= 0.06242 - \frac{-3.97781 \times 10^{-7}}{-8.90973 \times 10^{-3}} \\ &= 0.06242 - (4.4646 \times 10^{-5}) \\ &= 0.06238 \end{aligned}$$

Example 1 Cont.

The absolute relative approximate error $|\epsilon_a|$ at the end of Iteration 2 is

$$\begin{aligned} |\epsilon_a| &= \left| \frac{x_2 - x_1}{x_2} \right| \times 100 \\ &= \left| \frac{0.06238 - 0.06242}{0.06238} \right| \times 100 \\ &= 0.0716 \% \end{aligned}$$

The maximum value of m for which $|\epsilon_a| \leq 0.5 \times 10^{2-m}$ is 2.844.
Hence, the number of significant digits at least correct in the answer is 2.

Example 1 Cont.

Iteration 3

The estimate of the root is

$$\begin{aligned} x_3 &= x_2 - \frac{f(x_2)}{f'(x_2)} \\ &= 0.06238 - \frac{(0.06238)^3 - 0.165(0.06238)^2 + 3.993 \times 10^{-4}}{3(0.06238)^2 - 0.33(0.06238)} \\ &= 0.06238 - \frac{4.44 \times 10^{-11}}{-8.91171 \times 10^{-3}} \\ &= 0.06238 - (-4.9822 \times 10^{-9}) \\ &= 0.06238 \end{aligned}$$

Example 1 Cont.

The absolute relative approximate error $|\epsilon_a|$ at the end of Iteration 3 is

$$\begin{aligned} |\epsilon_a| &= \left| \frac{x_2 - x_1}{x_2} \right| \times 100 \\ &= \left| \frac{0.06238 - 0.06238}{0.06238} \right| \times 100 \\ &= 0\% \end{aligned}$$

The number of significant digits at least correct is 4, as only 4 significant digits are carried through all the calculations.

Newton's method

- Use Newton's method to find root of

$$f(x) = x^2 - 4 \sin(x) = 0$$

- Derivative is

$$f'(x) = 2x - 4 \cos(x)$$

so iteration scheme is

$$x_{k+1} = x_k - \frac{x_k^2 - 4 \sin(x_k)}{2x_k - 4 \cos(x_k)}$$

- Taking $x_0 = 3$ as starting value, we obtain

x	$f(x)$	$f'(x)$	h
3.000000	8.435520	9.959970	-0.846942
2.153058	1.294772	6.505771	-0.199019
1.954039	0.108438	5.403795	-0.020067
1.933972	0.001152	5.288919	-0.000218
1.933754	0.000000	5.287670	0.000000

.Example: Find the root of $e^{-x} - 3x = 0$

:Solution

$$f(x) = e^{-x} - 3x$$

$$f(x) = -e^{-x} - 3$$

With these, the Newton-Raphson solution
can be updated as

$$x_{i+1} = x_i + \frac{e^{-x_i} - 3x_i}{-e^{-x_i} - 3}$$

$$-1 \rightarrow 0:2795 \rightarrow 0:5680 \rightarrow 0:6172 \rightarrow \\ 0:6191 \rightarrow 0:6191$$

Converges much faster than the bisection

Example :-By using the Newton-Raphson's method find the
positive root of the quadratic equation

$$x^2 + 11x - 17 = 0 \text{ correct to 3 significant figures}$$

.

Numerical analyses of integration

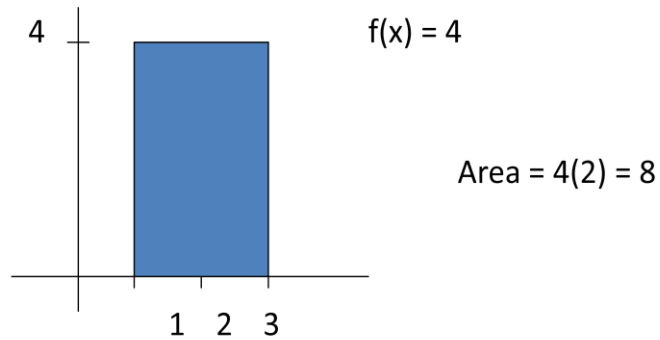
The Definite integral as the area of a region

If f is continuous and nonnegative on the closed interval $[a, b]$, then the area of the region bounded by the graph of f , the x -axis, and the vertical lines $x = a$ and $x = b$ is given by

$$\text{area} = \int_a^b f(x) dx$$

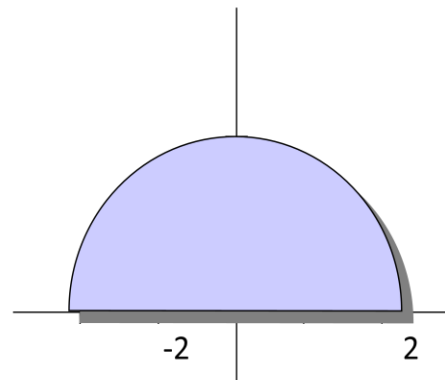
Areas of common geometric figures.

$$\int_1^3 4 dx$$



$$\int_{-2}^2 \sqrt{4-x^2} dx$$

$$A = \frac{1}{2} \pi r^2 = \frac{1}{2} \pi 2^2 = 2\pi$$



Riemann Sums and Definite Integrals

Definition of the Definite Integral

If f is defined on the closed interval $[a, b]$ and the limit of a Riemann sum of f exists, then we say f is integrable on $[a, b]$ and we denote the limit by

$$\lim_{\Delta x \rightarrow 0} \sum_{i=1}^n f(c_i) \Delta x_i = \int_a^b f(x) dx$$

The limit is called the definite integral of f from a to b . The number a is the lower limit of integration, and the number b is the upper limit of integration.

Introduction to area under a curve (cont.)

There are two methods we can use to find the area under a curve: **the trapezoidal rule, and Simpson's rule.**

For each method we must know:

f(x)- the function of the curve

n- the number of partitions or rectangles

(a, b)- the boundaries on the x-axis between which we are finding the area

$$\int_a^b f(x)$$

Trapezoidal Rule

TRAPEZOIDAL RULE **ALWAYS** begins with:

$$f(x_0) \text{ and ends with } f(x_n)$$

Within the brackets with every "f" being **multiplied** by 2 **EXCEPT** for the first and last terms

Trapezoidal Rule- Example

Remember: **Trapezoidal Rule Only**

$$A = \frac{b-a}{2n} [f(x_0) + 2f(x_1) + 2f(x_2) + 2f(x_3) + \dots + f(x_n)]$$

Given this problem below, what all do we need to know in order to find the area under the curve using Trapezoidal Rule?

$$f(x) = \int_0^4 x^3 \quad 4 \text{ partitions}$$

Simpson's Rule

Simpson's rule is the most accurate method of finding the area under a curve. It is better than the trapezoidal rule because instead of using straight lines to model the curve, it uses parabolic arches to approximate each part of the curve. The equation that is used for Simpson's Rule **ALWAYS** begins with:

$$f(x_0) \text{ And ends with } f(x_n)$$

Within the brackets with every "f" being **multiplied** by alternating coefficients of 4 and 2 **EXCEPT** the first and last terms.

In Simpson's Rule, n **MUST** be even.

Simpson's Rule- Example

Remember: **Simpson's Rule Only**

$$A = \frac{b-a}{3n} [f(x_0) + 4f(x_1) + 2f(x_2) + 4f(x_3) + \dots + f(x_n)]$$

Given this problem below, what all do we need to know in order to find the area under the curve using Simpson's Rule?

$$f(x) = \int_0^4 x^3 \quad 4 \text{ Partitions}$$

Example: Simpson's Rules

Evaluate the integral

$$\int_0^4 xe^{2x} dx$$

□ Simpson's 1/3-Rule

$$\begin{aligned} I &= \int_0^4 xe^{2x} dx \approx \frac{h}{3} [f(0) + 4f(2) + f(4)] \\ &= \frac{2}{3} [0 + 4(2e^4) + 4e^8] = 8240.411 \\ \varepsilon &= \frac{5216.926 - 8240.411}{5216.926} = -57.96\% \end{aligned}$$

□ Simpson's 3/8-Rule

$$\begin{aligned} I &= \int_0^4 xe^{2x} dx \approx \frac{3h}{8} \left[f(0) + 3f\left(\frac{4}{3}\right) + 3f\left(\frac{8}{3}\right) + f(4) \right] \\ &= \frac{3(4/3)}{8} [0 + 3(19.18922) + 3(552.33933) + 11923.832] = 6819.209 \\ \varepsilon &= \frac{5216.926 - 6819.209}{5216.926} = -30.71\% \end{aligned}$$

UBC

Example

$$\int_0^4 x^2 dx$$

Approximate using trapizume rule , n = 8 subintervals.

$\Delta x = (4-0)/8 = 1/2$ $x_0 = 0$ $x_1 = 0.5$, $x_2 = 1$, $x_3 = 1.5$, $x_4 = 2$, $x_5 = 2.5$, $x_6 = 3$, $x_7 = 3.5$, $x_8 = 4$

$$\begin{aligned} \int_0^4 x^2 dx &\approx \frac{\Delta x}{2} [f(x_0) + 2f(x_1) + 2f(x_2) + \dots + f(x_n)] \\ &= \frac{1/2}{2} [f(0) + 2f(0.5) + 2f(1) + \dots + f(4)] \\ &= 0.25 [0 + 2(0.25) + 2(1) + \dots + 16] \\ &= 21.5 \end{aligned}$$

Example

Estimate $\int_0^4 x^2 dx$ using Simpson's Rule and $n = 4$.
Here, $\Delta x = (4-0)/4 = 1$.

$$\begin{aligned}\int_a^b f(x) dx &\approx \frac{\Delta x}{3} [f(x_0) + 4f(x_1) + 2f(x_2) + 4f(x_3) + f(x_4)] \\ &= \frac{1}{3} [f(0) + 4f(1) + 2f(2) + 4f(3) + f(4)] \\ &= \frac{1}{3} [0^2 + 4(1)^2 + 2(2)^2 + 4(3)^2 + (4)^2] \\ &= 64/3 \approx 21.333\end{aligned}$$

NUMERICAL SOLUTION OF ORDINARY DIFFERENTIAL EQUATIONS

Differential equations are among the most important mathematical tools used in producing models in the physical sciences, biological sciences, and engineering. In this text, we consider numerical methods for solving ordinary differential equations, that is, those differential equations that have only one independent variable.

The differential equations we consider in most of the book are of the form

$$Y'(t) = f(t, Y(t)),$$

where $Y(t)$ is an unknown function that is being sought. The given function $f(t, y)$ of two variables defines the differential equation.

- A first order initial value problem of ODE may be written in the form

$$y'(t) = f(y, t), \quad y(0) = y_0$$

- Example:

$$y'(t) = 3y + 5, \quad y(0) = 1$$

$$y'(t) = ty + 1, \quad y(0) = 0$$

- Numerical methods for ordinary differential equations calculate solution on the points, $t_n = t_{n-1} + h$ where h is the steps size .

Methods to find approximate solution of ORDINARY DIFFERENTIAL EQUATIONS

- Euler Methods
- Modified Euler Method
- Runge-Kutta Methods Second Order

1) EULER METHOD:-

The Euler forward scheme may be very easy to implement but it can't give accurate solutions. A very small step size is required for any meaningful result. In this scheme, since, the starting point of each sub-interval is used to find the slope of the solution curve, the solution would be correct only if the function is linear. So an improvement over this is to take the arithmetic average of the slopes at t_i and t_{i+1} (that is, at the end points of each sub-interval). The scheme so obtained is called modified Euler's method. It works first by approximating a value to y_{i+1} and then improving it by making use of average slope.

Consider the forward difference approximation for first derivative

$$y_n' \cong \frac{y_{n+1} - y_n}{h}, \quad h = t_{n+1} - t_n$$

- **Rewriting the above equation we have**

$$y_{n+1} = y_n + h y_n', \quad y_n' = f(y_n, t_n)$$

- **So, y_n is recursively calculated as**

$$\begin{aligned}
y_1 &= y_0 + h y_0' = y_0 + h f(y_0, t_0) \\
y_2 &= y_1 + h f(y_1, t_1) \\
&\vdots \\
y_n &= y_{n-1} + h f(y_{n-1}, t_{n-1})
\end{aligned}$$

Example: solve

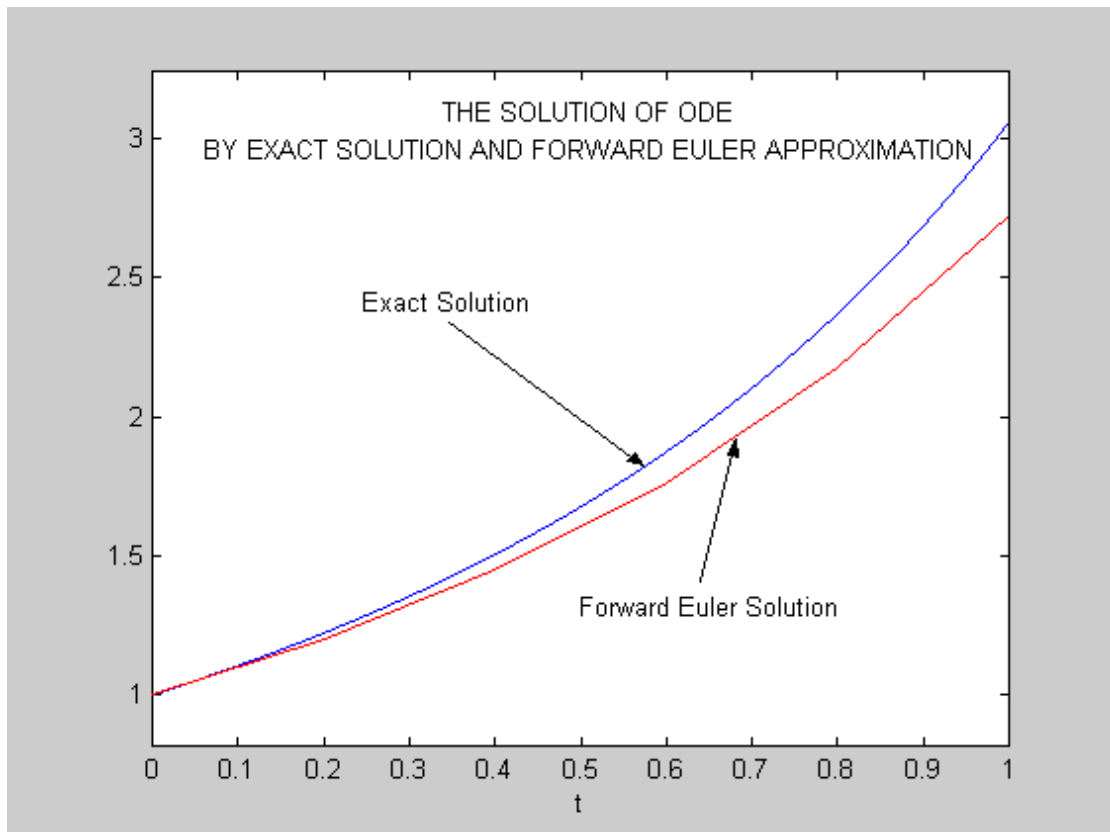
$$y' = ty + 1, \quad y_0 = y(0) = 1, \quad 0 \leq t \leq 1, \quad h = 0.25$$

Solution:

$$\text{for } t_0 = 0, \quad y_0 = y(0) = 1$$

$$\begin{aligned}
\text{for } t_1 = 0.25, \quad y_1 &= y_0 + h y_0' \\
&= y_0 + h(t_0 y_0 + 1) \\
&= 1 + 0.25(0 \cdot 1 + 1) = 1.25
\end{aligned}$$

$$\begin{aligned}
\text{for } t_2 = 0.5, \quad y_2 &= y_1 + h y_1' \\
&= y_1 + h(t_1 y_1 + 1) \\
&= 1.25 + 0.25(0.25 \cdot 1.25 + 1) = 1.5781
\end{aligned}$$



2) Modified Euler Method

- Modified Euler method is derived by applying the trapezoidal rule to integrating $y_n' = f(y, t)$; So, we have

$$y_{n+1} = y_n + \frac{h}{2}(y_{n+1}' + y_n'), \quad y_n' = f(y_n, t_n)$$

- If f is linear in y , we can solved for y_{n+1} similar as backward euler method
- If f is nonlinear in y , we necessary to used the method for solving nonlinear equations i.e. successive substitution method (*fixed point*)

Example: solve

$$y' = ty + 1, \quad y_0 = y(0) = 1, \quad 0 \leq t \leq 1, \quad h = 0.25$$

Solution:

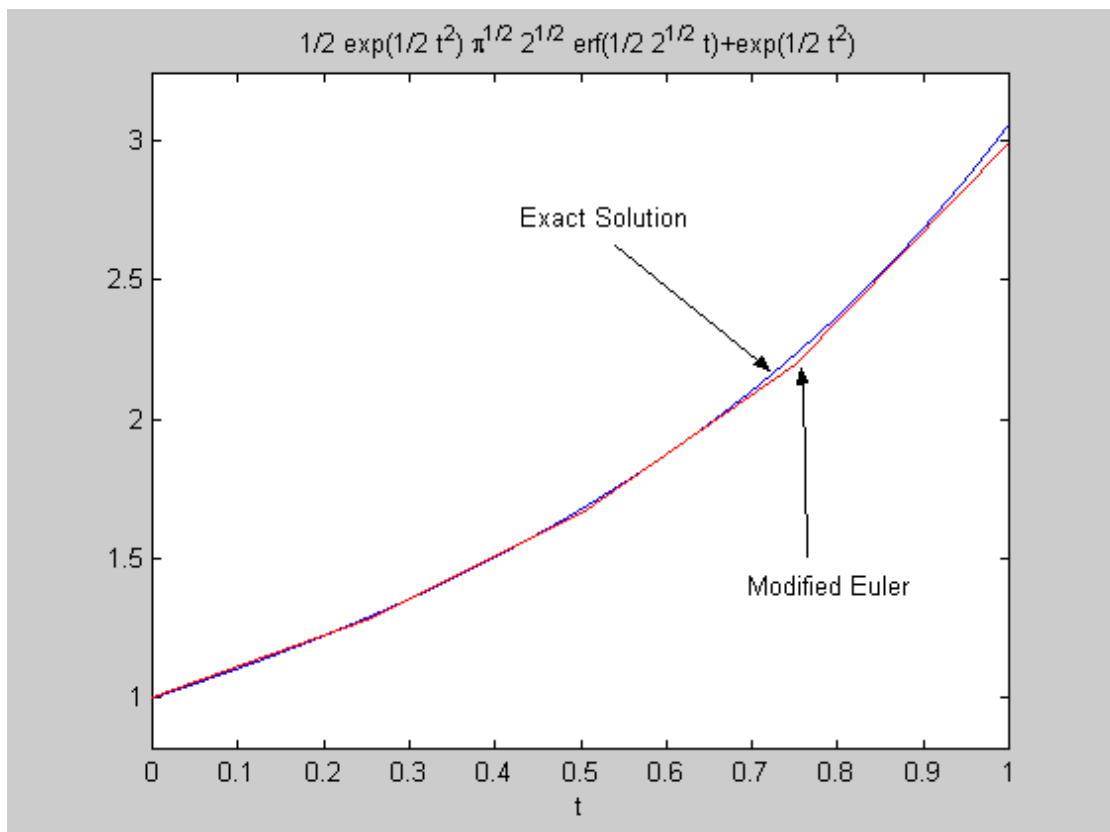
f is linear in y . So, solving the problem using modified Euler method for y_n yields

$$y_n = y_{n-1} + \frac{h}{2}(y'_{n-1} + y'_n)$$

$$= y_{n-1} + \frac{h}{2}(t_{n-1}y_{n-1} + 1 + t_n y_n + 1)$$

$$\Leftrightarrow y_n \left(1 - \frac{h}{2} t_n\right) = y_{n-1} \left(1 + \frac{h}{2} t_{n-1}\right) + h$$

$$\Leftrightarrow y_n = \frac{\left(1 + \frac{h}{2} t_{n-1}\right)}{\left(1 - \frac{h}{2} t_n\right)} y_{n-1} + h$$



Example 1:

Find $y(1.0)$ accurate upto four decimal places using Modified Euler's method by solving the IVP $y' = -2xy^2$, $y(0) = 1$ with step length **0.2**.

Solution: $f(x, y) = -2xy^2$
 $y' = -2*x*y*y, \quad y[0.0] = 1.0$ with $h = 0.2$

Given

$$y[0.0] = 1.0$$

Euler Solution: $y(1) = y(0) + h*(-2*x*y*y)(1)$

$$y[0.20] = 1.0$$

Modified Euler iterations: $y(1) = y(0) + .5*h*((-2*x*y*y)(0) + (-2*x*y*y)(1))$

$$y[0.20] = 1.0 \quad y[0.20] = 0.9599999988079071 \quad y[0.20] = 0.9631359989929199$$

$$y[0.20] = 0.9628947607919341 \quad y[0.20] = 0.9629133460803093$$

Euler Solution: $y(2) = y(1) + h*(-2*x*y*y)(2)$

$$y[0.40] = 0.8887359638083165$$

Modified Euler iterations: $y(2) = y(1) + .5*h*((-2*x*y*y)(1) + (-2*x*y*y)(2))$

$$y[0.40] = 0.8887359638083165 \quad y[0.40] = 0.8626358081578545$$

$$y[0.40] = 0.8662926943348495 \quad y[0.40] = 0.8657868947404332$$

$$y[0.40] = 0.865856981554814$$

Euler Solution: $y(3) = y(2) + h*(-2*x*y*y)(3)$

$$y[0.60] = 0.7458966289094106$$

Modified Euler iterations: $y(3) = y(2) + .5*h*((-2*x*y*y)(2) + (-2*x*y*y)(3))$

$$y[0.60] = 0.7458966289094106 \quad y[0.60] = 0.7391085349039348$$

$$y[0.60] = 0.7403181774980547 \quad y[0.60] = 0.7401034281837107$$

$$y[0.60] = 0.7401415785278189$$

Euler Solution: $y(4) = y(3) + h*(-2*x*y*y)(4)$

$$y[0.80] = 0.6086629119889084$$

Modified Euler iterations: $y(4) = y(3) + .5*h*((-2*x*y*y)(3) + (-2*x*y*y)(4))$

$$y[0.80] = 0.6086629119889084 \quad y[0.80] = 0.6151235687114084$$

$$y[0.80] = 0.6138585343771569 \quad y[0.80] = 0.6141072871136244$$

$$y[0.80] = 0.6140584135348263$$

Euler Solution: $y(5) = y(4) + h*(-2*x*y*y)(5)$

$$y[1.00] = 0.49340256427369866$$

Modified Euler iterations: $y(5) = y(4) + .5*h*((-2*x*y*y)(4) + (-2*x*y*y)(5))$

$$y[1.00] = 0.49340256427369866 \quad y[1.00] = 0.5050460713552334$$

$$y[1.00] = 0.5027209825340415 \quad y[1.00] = 0.5031896121302805$$

$$y[1.00] = 0.5030953322323046 \quad y[1.00] = 0.503114306721248$$

Example 2:

Find y in $[0,3]$ by solving the initial value problem $y' = (x - y)/2$, $y(0) = 1$. Compare solutions for $h = 1/2$, $1/4$ and $1/8$.

Solution: $f(x, y) = (x - y)/2$

Case(i) : $y' = (x - y)/2$, $y(0) = 1.0$ with $h = 1/2$

Given

$$y[0.0] = 1.0$$

Euler Solution: $y(1) = y(0) + h*((x-y)/2)(1)$

$$y[0.50] = 0.75$$

Modified Euler iterations: $y(1) = y(0) + .5*h*(((x-y)/2)(0) + ((x-y)/2)(1)$

$$y[0.50] = 0.75 \quad y[0.50] = 0.84375 \quad y[0.50] = 0.83203125 \quad y[0.50] = 0.83349609375 \quad y[0.50] = 0.83331298828125 \quad y[0.50] = 0.8333358764648438$$

Euler Solution: $y(2) = y(1) + h*((x-y)/2)(2)$

$$y[1.00] = 0.7499997615814209$$

Modified Euler iterations: $y(2) = y(1) + .5*h*(((x-y)/2)(1) + ((x-y)/2)(2)$

$$y[1.00] = 0.7499997615814209 \quad y[1.00] = 0.8229164183139801 \quad y[1.00] = 0.8138018362224102 \\ y[1.00] = 0.8149411589838564 \quad y[1.00] = 0.8147987436386757 \quad y[1.00] = 0.8148165455568233$$

Euler Solution: $y(3) = y(2) + h*((x-y)/2)(3)$

$$y[1.50] = 0.8611107402377911$$

Modified Euler iterations: $y(3) = y(2) + .5*h*(((x-y)/2)(2) + ((x-y)/2)(3)$

$$y[1.50] = 0.8611107402377911 \quad y[1.50] = 0.9178236877476991 \quad y[1.50] = 0.9107345693089606 \\ y[1.50] = 0.9116207091138029 \quad y[1.50] = 0.9115099416381975 \quad y[1.50] = 0.9115237875726483$$

Euler Solution: $y(4) = y(3) + h*((x-y)/2)(4)$

$$y[2.00] = 1.0586415426231315$$

Modified Euler iterations: $y(4) = y(3) + .5*h*(((x-y)/2)(3) + ((x-y)/2)(4)$

$$y[2.00] = 1.0586415426231315 \quad y[2.00] = 1.1027516068990952 \quad y[2.00] = 1.0972378488645997 \\ y[2.00] = 1.0979270686189118 \quad y[2.00] = 1.0978409161496228 \quad y[2.00] = 1.0978516852082838$$

Euler Solution: $y(5) = y(4) + h*((x-y)/2)(5)$

$$y[2.50] = 1.3233877543069634$$

Modified Euler iterations: $y(5) = y(4) + .5*h*(((x-y)/2)(4) + ((x-y)/2)(5)$

$$y[2.50] = 1.3233877543069634 \quad y[2.50] = 1.357695577403087 \quad y[2.50] = 1.3534070995160716 \quad y[2.50] = 1.3539431592519484 \\ y[2.50] = 1.3538761517849638$$

Euler Solution: $y(6) = y(5) + h*((x-y)/2)(6)$

$$y[3.00] = 1.6404133957887526$$

Modified Euler iterations: $y(6) = y(5) + .5*h*(((x-y)/2)(5) + ((x-y)/2)(6)$

$$y[3.00] = 1.6404133957887526 \quad y[3.00] = 1.6670972872799508 \quad y[3.00] = 1.663761800843551 \quad y[3.00] = 1.664178736648101 \\ y[3.00] = 1.6641266196725322$$

Case(ii) : $y' = (x - y)/2$, $y(0) = 1.0$ with $h = 1/4$

Given

$$y[0.0] = 1.0$$

Euler Solution: $y(1) = y(0) + h*((x-y)/2)(1)$

$$y[0.250] = 0.875$$

Modified Euler iterations: $y(1) = y(0) + .5*h*(((x-y)/2)(0) + ((x-y)/2)(1)$

$$y[0.250] = 0.875 \quad y[0.250] = 0.8984375 \quad y[0.250] = 0.89697265625 \quad y[0.250] = 0.897064208984375$$

Euler Solution: $y(2) = y(1) + h*((x-y)/2)(2)$

$$y[0.500] = 0.816176176071167$$

Modified Euler iterations: $y(2) = y(1) + .5*h*(((x-y)/2)(1) + ((x-y)/2)(2)$

$y[0.500] = 0.816176176071167$ $y[0.500] = 0.8368563205003738$ $y[0.500] = 0.8355638114735484$
 $y[0.500] = 0.835644593287725$

Euler Solution: $y(3) = y(2) + h*((x-y)/2)(3)$

$y[0.750] = 0.7936846013712966$

Modified Euler iterations: $y(3) = y(2) + .5*h*((x-y)/2)(2) + ((x-y)/2)(3)$

$y[0.750] = 0.7936846013712966$ $y[0.750] = 0.8119317853121117$ $y[0.750] = 0.8107913363158108$

$y[0.750] = 0.8108626143780796$

Euler Solution: $y(4) = y(3) + h*((x-y)/2)(4)$

$y[1.000] = 0.8032508895617894$

Modified Euler iterations: $y(4) = y(3) + .5*h*((x-y)/2)(3) + ((x-y)/2)(4)$

$y[1.000] = 0.8032508895617894$ $y[1.000] = 0.8193513439328768$ $y[1.000] = 0.8183450655346838$

$y[1.000] = 0.8184079579345709$

Euler Solution: $y(5) = y(4) + h*((x-y)/2)(5)$

$y[1.250] = 0.8411035237646307$

Modified Euler iterations: $y(5) = y(4) + .5*h*((x-y)/2)(4) + ((x-y)/2)(5)$

$y[1.250] = 0.8411035237646307$ $y[1.250] = 0.8553098052268149$ $y[1.250] = 0.8544219126354284$

$y[1.250] = 0.8544774059223901$

Euler Solution: $y(6) = y(5) + h*((x-y)/2)(6)$

$y[1.500] = 0.9039146953929605$

Modified Euler iterations: $y(6) = y(5) + .5*h*((x-y)/2)(5) + ((x-y)/2)(6)$

$y[1.500] = 0.9039146953929605$ $y[1.500] = 0.9164496480303976$ $y[1.500] = 0.9156662134905579$

$y[1.500] = 0.9157151781492978$

Euler Solution: $y(7) = y(6) + h*((x-y)/2)(7)$

$y[1.750] = 0.9887481031258607$

Modified Euler iterations: $y(7) = y(6) + .5*h*((x-y)/2)(6) + ((x-y)/2)(7)$

$y[1.750] = 0.9887481031258607$ $y[1.750] = 0.9998083540466274$ $y[1.750] = 0.9991170883640794$

$y[1.750] = 0.9991602924692387$

Euler Solution: $y(8) = y(7) + h*((x-y)/2)(8)$

$y[2.000] = 1.093012893186083$

Modified Euler iterations: $y(8) = y(7) + .5*h*((x-y)/2)(7) + ((x-y)/2)(8)$

$y[2.000] = 1.093012893186083$ $y[2.000] = 1.1027719368752444$ $y[2.000] = 1.1021619966446718$

$y[2.000] = 1.1022001179090826$

Euler Solution: $y(9) = y(8) + h*((x-y)/2)(9)$

$y[2.250] = 1.2144230184137998$

Modified Euler iterations: $y(9) = y(8) + .5*h*((x-y)/2)(8) + ((x-y)/2)(9)$

$y[2.250] = 1.2144230184137998$ $y[2.250] = 1.223033938221066$ $y[2.250] = 1.2224957557331118$

$y[2.250] = 1.222529392138609$

Euler Solution: $y(10) = y(9) + h*((x-y)/2)(10)$

$y[2.500] = 1.3509613786303571$

Modified Euler iterations: $y(10) = y(9) + .5*h*((x-y)/2)(9) + ((x-y)/2)(10)$

$y[2.500] = 1.3509613786303571$ $y[2.500] = 1.3585592480824138$ $y[2.500] = 1.3580843812416603$

$$y[2.500] = 1.3581140604192075$$

Euler Solution: $y(11) = y(10) + h*((x-y)/2)(11)$

$$y[2.750] = 1.5008481797867843$$

Modified Euler iterations: $y(11) = y(10) + .5*h*(((x-y)/2)(10) + ((x-y)/2)(11)$

$$y[2.750] = 1.5008481797867843 \quad y[2.750] = 1.5075521813920236 \quad y[2.750] = 1.5071331812916962$$

$$y[2.750] = 1.5071593687979665$$

Euler Solution: $y(12) = y(11) + h*((x-y)/2)(12)$

$$y[3.000] = 1.6625130155689716$$

Modified Euler iterations: $y(12) = y(11) + .5*h*(((x-y)/2)(11) + ((x-y)/2)(12)$

$$y[3.000] = 1.6625130155689716 \quad y[3.000] = 1.6684283103508373 \quad y[3.000] = 1.6680586044269707$$

$$y[3.000] = 1.6680817110472124$$

Case(iii) : $y' = (x - y)/2$, $y(0) = 1.0$ with $h = 1/8$

Given

$$y[0.0] = 1.0$$

Euler Solution: $y(1) = y(0) + h*((x-y)/2)(1)$

$$y[0.1250] = 0.9375$$

Modified Euler iterations: $y(1) = y(0) + .5*h*(((x-y)/2)(0) + ((x-y)/2)(1)$

$$y[0.1250] = 0.9375 \quad y[0.1250] = 0.943359375 \quad y[0.1250] = 0.94317626953125$$

Euler Solution: $y(2) = y(1) + h*((x-y)/2)(2)$

$$y[0.2500] = 0.8920456171035767$$

Modified Euler iterations: $y(2) = y(1) + .5*h*(((x-y)/2)(1) + ((x-y)/2)(2)$

$$y[0.2500] = 0.8920456171035767 \quad y[0.2500] = 0.8975498788058758 \quad y[0.2500] =$$

$$0.8973778706276789$$

Euler Solution: $y(3) = y(2) + h*((x-y)/2)(3)$

$$y[0.3750] = 0.8569217930155446$$

Modified Euler iterations: $y(3) = y(2) + .5*h*(((x-y)/2)(2) + ((x-y)/2)(3)$

$$y[0.3750] = 0.8569217930155446 \quad y[0.3750] = 0.8620924634176603 \quad y[0.3750] =$$

$$0.8619308799675942$$

Euler Solution: $y(4) = y(3) + h*((x-y)/2)(4)$

$$y[0.5000] = 0.8315024338597582$$

Modified Euler iterations: $y(4) = y(3) + .5*h*(((x-y)/2)(3) + ((x-y)/2)(4)$

$$y[0.5000] = 0.8315024338597582 \quad y[0.5000] = 0.836359730596966 \quad y[0.5000] = 0.8362079400739283$$

Euler Solution: $y(5) = y(4) + h*((x-y)/2)(5)$

$$y[0.6250] = 0.8151993908072874$$

Modified Euler iterations: $y(5) = y(4) + .5*h*(((x-y)/2)(4) + ((x-y)/2)(5)$

$$y[0.6250] = 0.8151993908072874 \quad y[0.6250] = 0.8197623062048026 \quad y[0.6250] =$$

$$0.8196197150986302$$

Euler Solution: $y(6) = y(5) + h*((x-y)/2)(6)$

$$y[0.7500] = 0.8074601603787794$$

Modified Euler iterations: $y(6) = y(5) + .5*h*((x-y)/2)(5) + ((x-y)/2)(6)$
 $y[0.7500] = 0.8074601603787794$ $y[0.7500] = 0.8117465357129019$ $y[0.7500] = 0.8116125864837106$

Euler Solution: $y(7) = y(6) + h*((x-y)/2)(7)$
 $y[0.8750] = 0.8077657241223026$

Modified Euler iterations: $y(7) = y(6) + .5*h*((x-y)/2)(6) + ((x-y)/2)(7)$
 $y[0.8750] = 0.8077657241223026$ $y[0.8750] = 0.8117923193808908$ $y[0.8750] = 0.8116664882790599$

Euler Solution: $y(8) = y(7) + h*((x-y)/2)(8)$
 $y[1.0000] = 0.8156285192196802$

Modified Euler iterations: $y(8) = y(7) + .5*h*((x-y)/2)(7) + ((x-y)/2)(8)$
 $y[1.0000] = 0.8156285192196802$ $y[1.0000] = 0.8194110786347212$ $y[1.0000] = 0.8192928736530011$

Euler Solution: $y(9) = y(8) + h*((x-y)/2)(9)$
 $y[1.1250] = 0.8305905320862623$

Modified Euler iterations: $y(9) = y(8) + .5*h*((x-y)/2)(8) + ((x-y)/2)(9)$
 $y[1.1250] = 0.8305905320862623$ $y[1.1250] = 0.8341438456947754$ $y[1.1250] = 0.8340328046445094$

Euler Solution: $y(10) = y(9) + h*((x-y)/2)(10)$
 $y[1.2500] = 0.852221507509997$

Modified Euler iterations: $y(10) = y(9) + .5*h*((x-y)/2)(9) + ((x-y)/2)(10)$
 $y[1.2500] = 0.852221507509997$ $y[1.2500] = 0.8555594689839763$ $y[1.2500] = 0.8554551576879144$

Euler Solution: $y(11) = y(10) + h*((x-y)/2)(11)$
 $y[1.3750] = 0.8801172663274216$

Modified Euler iterations: $y(11) = y(10) + .5*h*((x-y)/2)(10) + ((x-y)/2)(11)$
 $y[1.3750] = 0.8801172663274216$ $y[1.3750] = 0.883252927298937$ $y[1.3750] = 0.8831549378935771$

Euler Solution: $y(12) = y(11) + h*((x-y)/2)(12)$
 $y[1.5000] = 0.9138981250585888$

Modified Euler iterations: $y(12) = y(11) + .5*h*((x-y)/2)(11) + ((x-y)/2)(12)$
 $y[1.5000] = 0.9138981250585888$ $y[1.5000] = 0.9168437461524608$ $y[1.5000] = 0.9167516954932773$

Euler Solution: $y(13) = y(12) + h*((x-y)/2)(13)$
 $y[1.6250] = 0.9532074113216032$

Modified Euler iterations: $y(13) = y(12) + .5*h*((x-y)/2)(12) + ((x-y)/2)(13)$
 $y[1.6250] = 0.9532074113216032$ $y[1.6250] = 0.95597451009519$ $y[1.6250] = 0.9558880382585153$

Euler Solution: $y(14) = y(13) + h*((x-y)/2)(14)$
 $y[1.7500] = 0.9977100692219482$

Modified Euler iterations: $y(14) = y(13) + .5*h*((x-y)/2)(13) + ((x-y)/2)(14)$
 $y[1.7500] = 0.9977100692219482$ $y[1.7500] = 1.000309465199494$ $y[1.7500] = 1.0002282340751956$

Euler Solution: $y(15) = y(14) + h*((x-y)/2)(15)$

$$y[1.8750] = 1.0470913492635905$$

$$\text{Modified Euler iterations: } y(15) = y(14) + .5 * h * (((x-y)/2)(14) + ((x-y)/2)(15))$$

$$y[1.8750] = 1.0470913492635905 \quad y[1.8750] = 1.049533206241223 \quad y[1.8750] = 1.049456898210672$$

$$\text{Euler Solution: } y(16) = y(15) + h * ((x-y)/2)(16)$$

$$y[2.0000] = 1.1010555776593376$$

$$\text{Modified Euler iterations: } y(16) = y(15) + .5 * h * (((x-y)/2)(15) + ((x-y)/2)(16))$$

$$y[2.0000] = 1.1010555776593376 \quad y[2.0000] = 1.1033494434461277 \quad y[2.0000] = 1.1032777601402906$$

$$\text{Euler Solution: } y(17) = y(16) + h * ((x-y)/2)(17)$$

$$y[2.1250] = 1.1593250002283733$$

$$\text{Modified Euler iterations: } y(17) = y(16) + .5 * h * (((x-y)/2)(16) + ((x-y)/2)(17))$$

$$y[2.1250] = 1.1593250002283733 \quad y[2.1250] = 1.161479843978849 \quad y[2.1250] = 1.1614125051116466$$

$$\text{Euler Solution: } y(18) = y(17) + h * ((x-y)/2)(18)$$

$$y[2.2500] = 1.221638696360544$$

$$\text{Modified Euler iterations: } y(18) = y(17) + .5 * h * (((x-y)/2)(17) + ((x-y)/2)(18))$$

$$y[2.2500] = 1.221638696360544 \quad y[2.2500] = 1.2236629436446282 \quad y[2.2500] = 1.2235996859170006$$

$$\text{Euler Solution: } y(19) = y(18) + h * ((x-y)/2)(19)$$

$$y[2.3750] = 1.2877515588009272$$

$$\text{Modified Euler iterations: } y(19) = y(18) + .5 * h * (((x-y)/2)(18) + ((x-y)/2)(19))$$

$$y[2.3750] = 1.2877515588009272 \quad y[2.3750] = 1.289653124548429 \quad y[2.3750] = 1.2895937006188196$$

$$\text{Euler Solution: } y(20) = y(19) + h * ((x-y)/2)(20)$$

$$y[2.5000] = 1.357433335265581$$

$$\text{Modified Euler iterations: } y(20) = y(19) + .5 * h * (((x-y)/2)(19) + ((x-y)/2)(20))$$

$$y[2.5000] = 1.357433335265581 \quad y[2.5000] = 1.359219654714051 \quad y[2.5000] = 1.3591638322312865$$

$$\text{Euler Solution: } y(21) = y(20) + h * ((x-y)/2)(21)$$

$$y[2.6250] = 1.4304677281411309$$

$$\text{Modified Euler iterations: } y(21) = y(20) + .5 * h * (((x-y)/2)(20) + ((x-y)/2)(21))$$

$$y[2.6250] = 1.4304677281411309 \quad y[2.6250] = 1.4321457859080915 \quad y[2.6250] = 1.432093346602874$$

$$\text{Euler Solution: } y(22) = y(21) + h * ((x-y)/2)(22)$$

$$y[2.7500] = 1.5066515487479644$$

$$\text{Modified Euler iterations: } y(22) = y(21) + .5 * h * (((x-y)/2)(21) + ((x-y)/2)(22))$$

$$y[2.7500] = 1.5066515487479644 \quad y[2.7500] = 1.5082279061411892 \quad y[2.7500] = 1.508178644972651$$

$$\text{Euler Solution: } y(23) = y(22) + h * ((x-y)/2)(23)$$

$$y[2.8750] = 1.5857939228601574$$

$$\text{Modified Euler iterations: } y(23) = y(22) + .5 * h * (((x-y)/2)(22) + ((x-y)/2)(23))$$

$$y[2.8750] = 1.5857939228601574 \quad y[2.8750] = 1.5872747435327825 \quad y[2.8750] = 1.5872284678867632$$

$$\text{Euler Solution: } y(24) = y(23) + h * ((x-y)/2)(24)$$

$$y[3.0000] = 1.6677155443756573$$

$$\text{Modified Euler iterations: } y(24) = y(23) + .5 * h * (((x-y)/2)(23) + ((x-y)/2)(24))$$

y[3.0000] = 1.6677155443756573 y[3.0000] = 1.66910661842644 y[3.0000] = 1.669063147362353

3) Second Order Runge-Kutta Method

- The second order Runge-Kutta (RK-2) method is derived by applying the trapezoidal rule to integrating $y' = f(y, t)$ over the interval $[t_n, t_{n+1}]$. So, we have

$$\begin{aligned} y_{n+1} &= y_n + \int_{t_n}^{t_{n+1}} f(y, t) dt \\ &= y_n + \frac{h}{2} (f(y_n, t_n) + f(\bar{y}_{n+1}, t_{n+1})) \end{aligned}$$

We estimate \bar{y}_{n+1} by the forward euler method.

So, we have

$$y_{n+1} = y_n + \frac{h}{2} (f(y_n, t_n) + f(y_n + hf(y_n, t_n), t_{n+1}))$$

Or in a more standard form as

$$y_{n+1} = y_n + \frac{1}{2} (k_1 + k_2)$$

where $k_1 = hf(y_n, t_n)$

$$k_2 = hf(y_n + k_1, t_{n+1})$$

