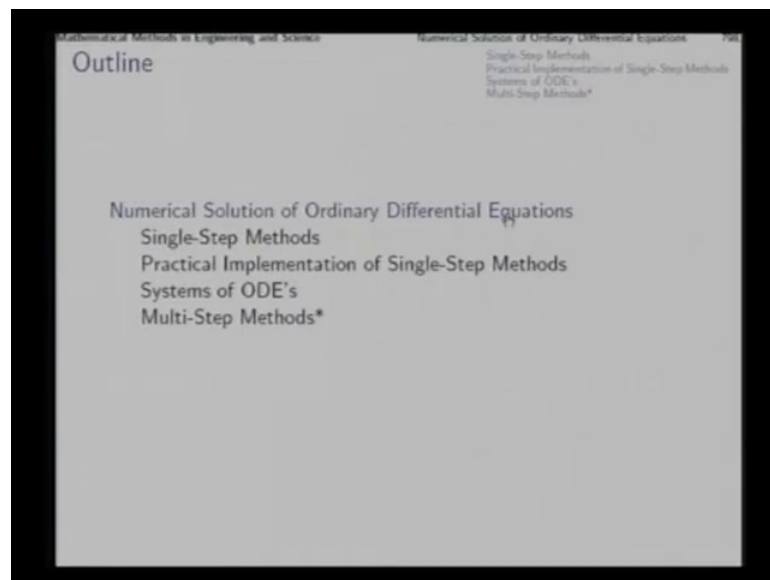


Mathematical Methods in Engineering and Science
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Module - V
Selected Topics in Numerical Analysis
Lecture - 03
Numerical Solution of Solution of ODE's as IVP

Good morning. Today we will study one of the most important lesson of applied mathematics and that is Numerical Solution of Ordinary Differential Equation.

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In many courses and many textbook of differential equation you might find that the analytical solutions of differentials equations are discussed first and then it is said that in all cases you may not be able to solve the differential equation analytically. In fact, in majority of cases you will not be able to solve and in such situations, we must resort to numerical solution.

However, we prefer to precede the discussion of analytical methods by the solution of differential equations by numerical means the reason is that this is most general and this is the way of historical development way of the field also that is first the initial attempts where in terms of finding the values of the solution function. And it was later found that in certain situations the solution can be expressed in terms of full form expressions in

special cases. So, in those special cases where certain analytical solution is possible we can do much more than getting just values, but it is the values of the solutions which have the prime base in terms of the determination of the solution of ODE.

So, we follow that methodology that sequence of operations first we try to find the solutions in the most primitive manner in terms of numbers and then we will examine how sensible are the resulting numbers and then we will consider those special cases in which analytical solutions are possible. So, first we start with numerical solution of ordinary differential equations this will be our last topic in the module of differential equations and this uh in the module of numerical analysis and it will be a bridge between the module on numerical analysis and the next module which is going to be on differential equations. So, this topic we will cover to 3 lectures starting from the current one.

(Refer Slide Time: 02:57)

Mathematical Methods in Engineering and Science

Numerical Solution of Ordinary Differential Equations

Single-Step Methods

Single-Step Methods
Practical Implementation of Single-Step Methods
Systems of ODE's
Multi-Step Methods*

Initial value problem (IVP) of a first order ODE:

$$\frac{dy}{dx} = f(x, y), \quad y(x_0) = y_0$$

To determine: $y(x)$ for $x \in [a, b]$ with $x_0 = a$.

Numerical solution: Start from the point (x_0, y_0) .

- ▶ $y_1 = y(x_1) = y(x_0 + h) = ?$
- ▶ Found (x_1, y_1) . Repeat up to $x = b$.

Information at how many points are used at every step?

- ▶ **Single-step method:** Only the current value
- ▶ **Multi-step method:** History of several recent steps

First we consider the straight forward problem of one differential equation in one independent one dependent variable one function one independent variable x and one dependent variable or function y unknown function which we want to determine now this is a first order differential equation in y with an initial condition given that is at one value of x the value of y is given. So, this makes it an initial value problem the initial value of y is given at x_0 and then for all subsequent values of x that greater than x_0 , we want to find out the values of y .

Further matter we could have asked for the values of y for x values which are less than x_0 as well it is equivalent. So, we want to determine y of x for x in an interval a to b with a being the initial value of x that is x_0 . Now this is in a way somewhat another ways to an integration problem y here we have got dy by dx and we want to find out y . So, it is in a way integration and therefore, you will find that numerical solution of ODE have a lot similarities with the numerical integration problem only major difference is that this side the dy by dx is not dependent on x only, but it is dependent on x as well as y .

So, a first order differential equation first we put in this form in which we get the expression for dy by dx in terms of x and y . Now if we are lucky if it just happens that this function turns out to be d from y , then it is a straight forward integration on the other hand if it is dependent on x and y , then we cannot solve the problem just by integration. So, in that case what we can do still is that we may say that we will take a very small step to begin with. So, starting from point x_0, y_0 , we will ask first that just a little ahead of x_0 at $x_0 + h$ what is the value of y that is at x_1 what is y_1 . So, we have x_0, y_0 the point starting point and we want the next point x_1, y_1 where x_1 is only slight ahead of x_0 that is $x_0 + h$.

Now, for that very small interval if we can consider this function not to change significantly then what we can say we can say that the value of that function we evaluate at x_0, y_0 and that derivative that slope we multiply with the small change in x that is h and that gives us the corresponding change in y and that Δy we add to the current y_0 and get next value of y that is y_1 . So, that gives us a point x_1, y_1 .

Now, we know that y of x_1 is y_1 and dy by dx at that point we will be able to find out from f of x_1, y_1 f is a known function. So, we go on repeating these kind of small steps up to x equal b this is indeed a method and shortly; we will see that this is a method with a given name and on that we can do certain analysis and so on.

So, before proceeding for that analysis we have a quick view at the 2 kinds of methods which we can use one is a single step method in which only the current value only the current x_0, y_0 and the corresponding f is used at every iteration and there is another family of method which is called multi step methods in which history of several recent steps are used. So, that kind of a method is called a multi step method most of our discussion here will be limited to single step methods.

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Mathematical Methods in Engineering and Science Numerical Solution of Ordinary Differential Equations

Single-Step Methods

Single-Step Methods
Practical Implementation of Single-Step Methods
Systems of ODE's
Multi-Step Methods*

Euler's method

- ▶ At (x_n, y_n) , evaluate slope $\frac{dy}{dx} = f(x_n, y_n)$.
- ▶ For a small step h ,

$$y_{n+1} = y_n + hf(x_n, y_n)$$

Repetition of such steps constructs $y(x)$.

First order truncated Taylor's series:
Expected error: $\mathcal{O}(h^2)$

Accumulation over steps
Total error: $\mathcal{O}(h)$

Euler's method is a first order method.

Question: Total error = Sum of errors over the steps?
Answer: No, in general.

Now resuming the discussion of this method, this method is actually called Euler's method and at every step this is the methodology at x_n, y_n evaluate the slope by this and for a small step h use that value of $\frac{dy}{dx}$ multiply that with small value change in x which is h and that you when you add to the current value of y you get the next value of y and this way repetition of such steps will construct the function y of x that is for x equal to x_0, x_1, x_2, x_3, x_4 , etcetera, you will find the corresponding values of y, y_0, y_1 , etcetera and those points in the $x-y$ plane will give you the trajectory and that will be the solution of the differential equation.

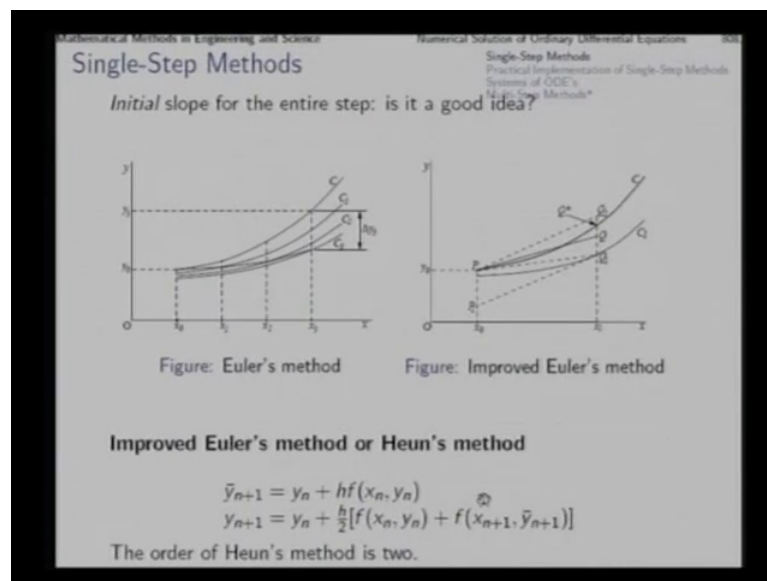
Now, if we construct the truncated Taylor's series first order truncated Taylor's series on of this function, then we will find that the expected error of this Euler's method turns out to be of second order that is order of h^2 because up to h we are actually retaining the change. So, up to from h^2 onwards there will be errors. So, leading error term will be h^2 over every such small step; that means, that from a to b as we go on taking large number of steps that is if we have divided the interval a to b into n parts each part of size h and. So, on in that case these kinds of errors will get accumulated and then the accumulated error as we saw in the problem of numerical integration will be of one order higher one order lower that is up to linear error.

So, these are at every step will have an order h^2 error. So, accumulated over steps the error will be larger; larger means lower error of h ; h is a small step now the total

order of the error total error order will be order h which is bad because it is first order error; error will be in the first order itself so; that means, that if you use Euler's method you are likely to have a lot of error first order error; error means that unless h is extremely small, you will find that the error is significant and the result is not very reliable.

Now, one question that we should ask at this point is that is the total error over say ten steps like this will be the sum of errors over the ten steps now the answer is not. So, in general the total error may be larger than the sum of the individual errors or for that matter it could be smaller also it depends upon the differential equation in the question. So, how that happens the total error could be larger than the sum of errors or smaller and what can be done to improve this error that we will explore next.

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First of all consider this situation $\frac{dy}{dx} = f(x, y)$ with an initial condition given at $x = 0$ the value of y is y_0 , this is the initial point initial condition and as we if we could solve the correct solution of the differential equation and if we could have got y as the function of x then suppose y as a function of x for that the graph is this shown by the curve C now if we take a small step h and move to x_1 , then here now I will enlarge this and try to show.

In this enlarged figure you can see better that is this curve the top curve is the true solution now as we start from the given initial condition $x = 0, y = y_0$, then with the Euler's

method will be proceeding along the current slope that is whatever is the slope of the curve; that means, along this direction and wherever this tangent cuts the vertical line at value x equal to x_1 that is x_0 plus h will get that point now from that point in the next step of Euler's method the current tangent will be used and; that means, that along the current tangent that is the tangent here will be proceeding towards this.

Now, note that first of all we have because we moved along the tangent we have left this true curve currently we are sitting at curve which is this curve second curve from the top. Now since we will be moving along a tangent at this point in this step that is in the second step will be leaving this this curve also and will be actually landing up at the third curve from top that is we will be leaving c in the first step reaching c_1 , then at the second step will be leaving even c_1 and reach c_2 the next curve and so on.

Now note that the error in the first step is this y intercept from the true value at x_1 to this value where we reach and the error at the second step will be actually must be counted along this that is this is the true value for the second step because it was trying to track this curve and it has reached here; that means, the error is this. Now this error in the second step plus this error in the first step will actually be somewhere here that is second step error plus first step error and the actual error is from here to here which is larger than the sum of these 2. Now the sum of these 2 can be found if you draw a line from here parallel to this tangent that is somewhere here.

So, in this particular example, the error of the first 2 steps is actually smaller than the total step that is individual errors error in the first step plus error in the second step compared to even this sum the overall error accumulated error in the 2 steps is even larger. So, these way errors not only accumulate by simple sum, but might even magnify in another example that could have been lesser than the sum.

Now, what is actually happening we find that this way at every step will be leaving the initial curve and then will be leaving the next curve and then will be leaving the next curve and finally, after 3 steps we would have actually got to a got to a point which is the solution of the same differential equation with initial condition y at x_0 equal to. So, far below the bottom curve wherever the bottom curve is that value of y . So, this way this will be the total error in 3 steps. So, that shows that with first order error getting

accumulated the total error over large number of steps may be a bad thing in the case of Euler's method.

Now, what is the reason while exploring the reason for this we also ask a question that from x_0 to x_1 we moved during the entire h along the slope which was given at the initial point right was it a good idea the slope changes from this one to that one if the slope changes from this point to that point then how good is the idea of moving all the time with the same slope as given in the initial point if we could figure out some average slope then that would have given us a good move now with that intention the Euler's mod method is modified and then we have what is called modified Euler's method or Heun's method.

Now in improved Euler's method or modified Euler's method what is done is that the first step is taken now the problem is that it would be nice to be able to take an average slope, but then how do we know the average slope to begin with we know only the y value here and therefore, the slope here at the end point or in the middle point of the interval we do not know the y and we do not know the slope now in improved Euler's method what we do from here we take one tentative step and reach q_1 we reach q_1 along the slope here after that we say that it was perhaps not a good idea to move from here with this slope only.

Now let us calculate the slope here after we have got this tentative point at s_1 which we have got some value of y_1 call it \bar{y}_1 . And then we evaluate the slope here from the same f of x, y at this point we evaluate the slope then we say that along that tangent with that slope the new slope here we draw a line suppose that goes here at p_1 , then we say that what is the difference between p and p_1 this difference.

Now, we say that if rather than with the slope here if we had started with the slope here and moved, then where would we have reached that is rather than along this slope, but with this new slope which we have now evaluated if we have moved then we would reach q_2 , but then q_1 is wrong because it gives complete weigh age to the initial slope similarly q_2 would be wrong on the other side because that would be giving complete weight age to the final slope the true picture should lie somewhere in between.

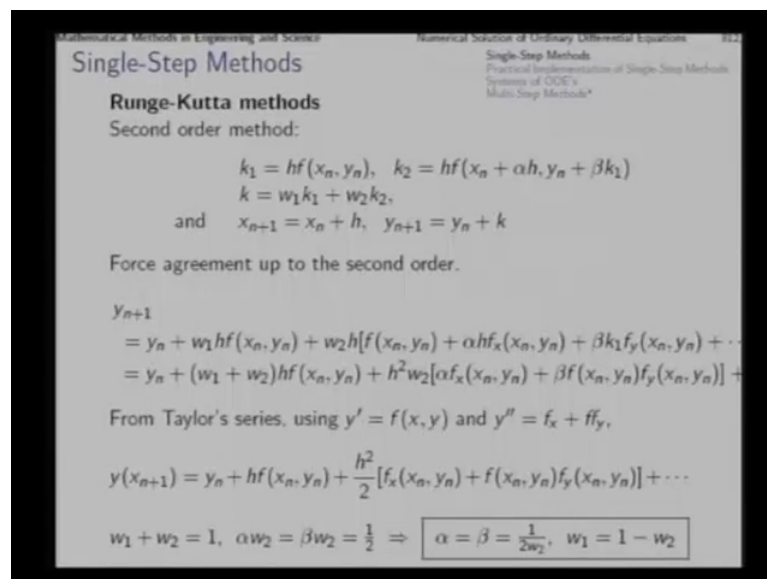
So, what about taking the average of q_1 and q_2 that is q that is given by improved Euler's method or Heun's method and this is the analytical formulation that is from the

value x_n, y_n take one tentative step and call that value of y at x_{n+1} as y_{n+1} . And then evaluate the step if we use that slope that is $f(x_{n+1}, y_{n+1})$ with that you will have the step as h into this. Now this is one proposal and h into this is another proposal; so what about the average of them average will be h by 2 into this plus this ok.

. So, this is the point taken for this step now this also will have some error, but if you make an analysis based on Taylor's series you will find that the corresponding error is second order over the complete domain over the complete interval a to b that is accumulated error that will be of second order. So, that makes sense because we have made 2 function evaluations at this point and at this point and we have got a second order method.

Now, this can be continued with 4 function evaluations we can land up at a fourth order method and actually there is a family of methods called Runge-Kutta methods.

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Second order Runge-Kutta method generally would go like this first estimate k_1 which is same as Euler k_1 is estimate for Δy second estimate now here we say that we do not make the evaluation of this at this n point, but somewhere in between that is in between x_n and x_{n+1} somewhere where that will decide by α and β that is α step from here and β step in the y direction. So, if we do that then we get this point where we can evaluate the slope function and based on that we work out the second

proposal for the change in y that is Δy and then say that we have got the first proposal from here and then second proposal part from here what about taking a weighted sum of the 2.

Now, in this particular case the weight w_1 and w_2 you will expect that $w_1 + w_2$ should be 1, otherwise this will not make very good sense as a weighted sum and take that k . Now we ask what weight values, we should use and for that we try to force agreement up to second order that is h term in the error and h^2 term; in the error, we try to force to 0 to get the appropriate values of w_1 and w_2 how do we do that we say that based on this if we try to work out on y_{n+1} that will be $y_n + h \left(w_1 f + w_2 k \right)$ into this this w_1 into $h f$ plus w_2 into k that is this w_2 into k now if we try to work out a Taylor's series of this truncated Taylor's series of this then you will get f at $x_n + y_n + \alpha h$ into first derivative with respect to x plus βk into first derivative of this function with respect to y plus higher terms.

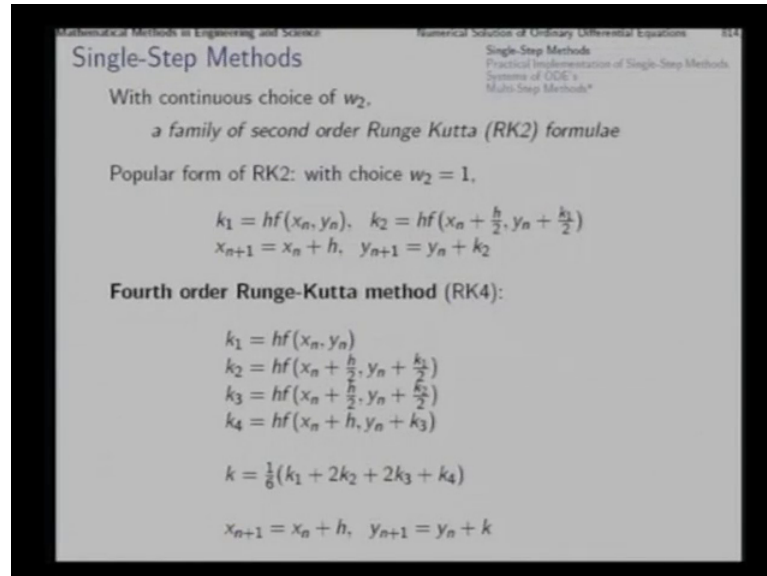
Now, if we simplify this and collect $h f$ terms together and then h^2 terms together then we get this right this is the Taylor's series of y_{n+1} which we are getting now at $x_n + 1$ the Taylor's series value of the original function y at $x_n + 1$ without this formula that would be $y_n + h \frac{dy}{dx}$ which is this plus $\frac{h^2}{2} \frac{d^2y}{dx^2}$ which will be this by chain rule of this this function that is this and so on. Now when we compare these 2 when you compare these 2, we get the error and in that we say that we want the error to have 0 value up to the second order; that means, first order error should be 0 first up to first order this should match and second order also this 2 should match.

So, the first order terms here and here if you match then you get $w_1 + w_2$ equal to one which you would expect and then as you equate the second order terms you get these also there is α into w_2 should be from here $\frac{1}{2}$ and when you equate these 2 you get β into w_2 is half. So, there are 3 equation here in w_1 , w_2 , α β if you try to solve them 4 unknown from 3 equation you can get 3 of the unknowns in terms of one remaining unknown w_2 .

Now, depending upon which value of w_2 you select you may get slightly varying second order Runge-Kutta method it is a family of methods now if you take w_2 equal to half

and that will mean that alpha beta will turn out to be one then you get what we just now discussed that is improved Euler's method.

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On the other hand, popular choice of second order Runge-Kutta method is w_2 is equal to one which means that you take the first proposal as Euler's method and for the second proposal for Δy that is k_2 you evaluate the function at the midpoint of the chord of the step that has been taken at that midpoint you evaluate the function and thereby work out the second step second proposal for the step and then take the second step only not the first step at all. So, that will mean that w_2 is 1 and w_1 is 0, this has been used only as a stepping stone for evaluating this function and after that is not used at all the actual step has been taken equal to k_2 . So, this is second order Runge-Kutta method.

Similarly with 4 function evaluations you can get a fourth order Runge-Kutta method. Now this point onwards, I am not trying to derive or prove, but without proof let us state this that if you work out the first proposal as based on the initial value just like Euler's step and second proposal of Δy that is k_2 as we have just now done and then the third proposal as k_3 which is this in which in place of this you use k_1 you use k_2 the fresh one and finally, the last evaluation is made with first step h and k_3 and for Δy here you use the most recent estimate and then you have got 4 different proposals for Δy and take this sum $\frac{1}{6}k_1 + \frac{2}{6}k_2 + \frac{2}{6}k_3 + \frac{1}{6}k_4$ sum is 1.

Now, this particular arrangement of the 4 possible delta ys ensures that the error over an interval up to fourth order is 0; that means, over a particular inter subinterval over a particular step h the error that the leading error turned at you will get will be h to the power 5 that is only up to fifth order only up to only from fifth order there will be errors; that means, over accumulated; accumulated over several step for the entire domain the error will be fourth order and that is why this method is called fourth order Runge-Kutta method with 4 evaluations of the function you get a fourth order method.

However, you can work out higher order methods also in the Runge-Kutta family, but then for getting a fifth order Runge-Kutta method, it is not enough to make 5 function evaluations; however, with 6 function evaluations you can work out a fifth order method that particular arrangement has some further merits which we will be discussing a little ahead.

Now, through whichever method whether it is a second order method or fourth order method you develop the solution of the ordinary differential equation how do you figure out whether the resulting value is right that is what is the magnitude of the error which is really important in a practical situation how do you determine the magnitude of the error.

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Mathematical Methods in Engineering and Science Numerical Solution of Ordinary Differential Equations 811

Practical Implementation of Single-Step Methods

Question: How to decide whether the error is within tolerance?

Additional estimates:

- ▶ handle to monitor the error
- ▶ further efficient algorithms

Runge-Kutta method with adaptive step size

In an interval $[x_n, x_n + h]$,

$$y_{n+1}^{(1)} = y_{n+1} + ch^5 + \text{higher order terms}$$

Over two steps of size $\frac{h}{2}$,

$$y_{n+1}^{(2)} = y_{n+1} + 2c \left(\frac{h}{2}\right)^5 + \text{higher order terms}$$

Difference of two estimates:

$$\Delta = y_{n+1}^{(1)} - y_{n+1}^{(2)} \approx \frac{15}{16}ch^5$$

Best available value: $y_{n+1}^* = y_{n+1}^{(2)} - \frac{\Delta}{15} = \frac{16y_{n+1}^{(2)} - y_{n+1}^{(1)}}{15}$

So, this is an; in particular whether the error is within tolerance for that purpose you can do 2 things one is you can make an additional estimate which will give you a handle to monitor the error and based on that you can develop further additional further efficient

algorithms that is whatever best you get with a particular order of method. So, if you have additional estimate, then you can develop an estimate of the error and on the same basis you can develop further efficient algorithms that is you can reduce the error as well as you can know; how much is the error.

So, it is pretty much like what we did with Richardson extrapolation in the case of the numerical integration process suppose in a particular interval from x_n to $x_n + h$ you have developed one particular estimate of the value at $x_n + h$ that is y_{n+1} estimate. So, we are showing it as with this super script one and that is the correct value plus some error

Now, if you have used the fourth order Runge-Kutta method, then the leading error will be fifth order right plus higher order terms. Now what you can do is that you can now evaluate the same y_{n+1} not with 1 step of size h , but 2 successive steps of size $h/2$ then the corresponding second estimate will be y_{n+1} such steps. So, twice c into this coefficient is same constant is same c into the $h/2$ to the power 5 because every step is now of $h/2$ size. So, in the first step you accumulate c into $h/2$ to the power 5 in the second step also that is the estimate; so 2 half steps that is the estimates.

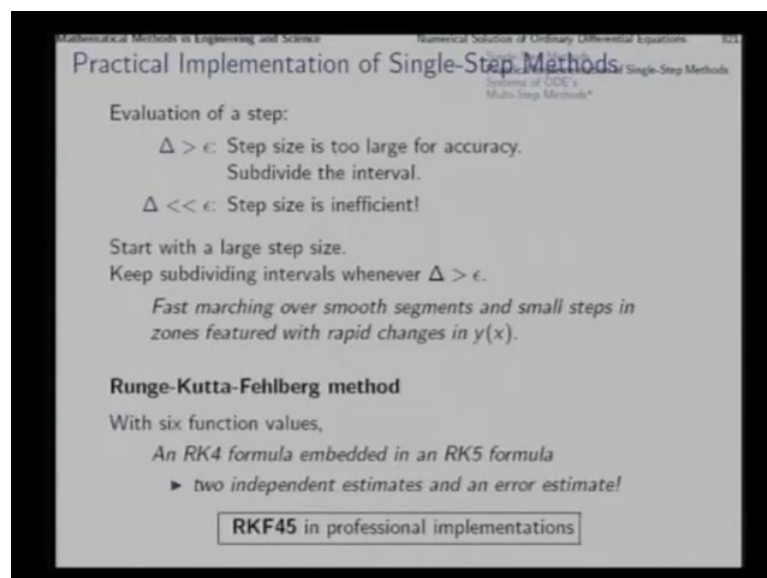
Now, note that here you have got 2 equations in the true value and h you know and these 2 estimate you have got through the RK 4 formulas Runge-Kutta formulas. So, these left sides you know and h you know. So, you have got 2 equations in y_{n+1} and c these things you do not know now 2 equations into one linear equations into one you can solve. So, as you solve that you find that difference of the 2 estimates will throw out one of the unknowns that is y_{n+1} and give you this is $c h^3$ to the power 5 and this is $c h^3$ to the power 5 by 16. So, difference is $15/16 c h^5$. So, this gives you the difference of 2 estimates.

And what is the error here error here is $c h^5$ by 16 that is $1/16$ times this right. So, you have got an error estimate that is error estimate of the second value; obviously, this value is better than this because this is with one step of this size this estimate is based on 2 half steps. So, this is a better estimate and in this the error is $c h^5$ which turns out to be from here related to the difference of the 2 estimates right. So, difference of the 2 estimate will be giving you $1/16$ of the difference of the 2 estimates is $c h^5$ by 16 which is the error estimate here right.

So, if you use that or if you multiply this with 16 multiply this with 16 and take the difference then also you get the same result in any case between these 2 equations you can solve for ch to the power 5 by 16 which is the error estimate and the true value or the best estimate till now that is y_{n+1} . So, this is the best ever value out of these 2 estimates. So, this way you get 2 things one is an estimate of y_{n+1} which is better than both of these which you get like this and 2 you get an error estimate of this that is ch to the power 5 by 16 which is the difference of these 2 divided by 15.

So, now you can say that if that is within your required accuracy within your tolerance.

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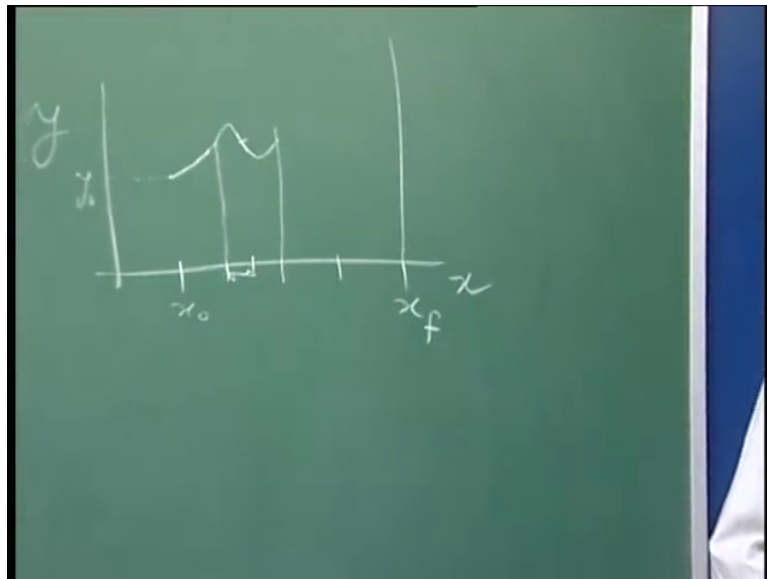
So, if you find that the delta that you are ready to tolerate is quite large; that means, if delta is quite large compared to the epsilon value which you are ready to tolerate then that will mean that the current step size is too large for accuracy. So, in that case you subdivide the step further and take smaller steps.

On the other hand if the delta that you get is much much less than epsilon; that means, what; that means, the error is within tolerance, but perhaps you are taking too small steps even larger steps would be alright to solve the problem within the required accuracy, but then you have already determined. So, many function evaluations you have already made computational steps computational resources already spent. Now, you cannot do anything further to save the computational resources spent. So, that is why the at the starting you should stay you should keep the steps size not too small reasonable step size

not too small and if you find that at some location the delta that is coming with this estimate is too large then that particular step you subdivide further.

So, start with a large step size not extremely large reasonably large and then keep subdividing intervals whenever you find delta is greater than epsilon. So, that will mean that suppose you want to solve this from this initial point to this final point.

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So, this is x_0 when the value of y is given this point. So, what you can do you can say that initially this entire interval from x_0 to say final x this entire domain over which you want the solution of the ODE you can say that I will try to solve it with 4 steps.

So, this step you find that you develop one estimate and another estimate based on that you get a third much better estimate and an error estimate now find out whether that error estimate is acceptable if it is acceptable then take the best value that you have got till. Now similarly you try to do it for this step and suppose here again from here; this point you find that you have got one estimate second estimate and based on these 2 you get a third much better estimate and at the same time an estimate further error. Now suppose in this case the error turns out to be too large can you say in this location this step is going to turn out to be too large? So, you subdivide and do the same thing for this and this. So, now, over this small step you operate and get this next whatever.

So, whenever you find that the error estimate shows that too much error is coming then subdivide the interval further otherwise continue. So, this ensures that you keep on marching fast over those segments of the function where the function is smooth and those segments where you get quick changing fast changing situation there you make small steps and where to make the small step that this delta will tell you. So, this is what is called adaptive step size algorithm.

Now, another interesting thing another interesting feature of Runge-Kutta method is that as we discussed just now that with 6 functional values we can get a fifth order formula fifth order Runge-Kutta formula not only that using a different combination of those 6 function values you get another formula which is a fourth order formula. Now with this situation with 6 function values a fourth order formula is found embedded in a fifth order formula and this helps you in 2 ways that is you get 2 ways independent estimates of the value of y_{n+1} . And another estimate based on the same 6 functional evaluations and this is called Runge-Kutta Fehlberg method and most of the professional implementations use that RK 45.

However, if you are a beginner in this kind of implementations then, and if you want to implement your own solution of ODE routine then I would suggest that RK 4 itself fourth RK Runge-Kutta method itself with these straight forward formulas is also going to be.

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The slide is titled "Single-Step Methods" and is part of a presentation on "Numerical Solution of Ordinary Differential Equations". It discusses two types of Runge-Kutta methods:

- Second order Runge-Kutta (RK2) formulae:**
 - With continuous choice of w_2 , a family of second order Runge-Kutta (RK2) formulae.
 - Popular form of RK2: with choice $w_2 = 1$.
 - Formulas: $k_1 = hf(x_n, y_n)$, $k_2 = hf(x_n + \frac{h}{2}, y_n + \frac{k_1}{2})$
 - Update: $x_{n+1} = x_n + h$, $y_{n+1} = y_n + k_2$
- Fourth order Runge-Kutta method (RK4):**
 - Formulas: $k_1 = hf(x_n, y_n)$, $k_2 = hf(x_n + \frac{h}{2}, y_n + \frac{k_1}{2})$, $k_3 = hf(x_n + \frac{h}{2}, y_n + \frac{k_2}{2})$, $k_4 = hf(x_n + h, y_n + k_3)$
 - Update: $k = \frac{1}{6}(k_1 + 2k_2 + 2k_3 + k_4)$
 - Update: $x_{n+1} = x_n + h$, $y_{n+1} = y_n + k$

Quite effective for your purposes with adaptive step size which we just now discussed; however, if you call a library shelf routine, then most likely you are going to get a RK f 4 5 routine available in most of the important library func; libraries numerical libraries.

(Refer Slide Time: 36:54)

Mathematical Methods in Engineering and Science Numerical Solution of Ordinary Differential Equations 8.11

Systems of ODE's

Single-Step Methods
Practical Implementation of Single-Step Methods
Systems of ODE's
Multi-Step Methods*

Methods for a single first order ODE
directly applicable to a first order vector ODE

A typical IVP with an ODE system:

$$\frac{dy}{dx} = f(x, y), \quad y(x_0) = y_0$$

An n -th order ODE: convert into a system of first order ODE's
Defining state vector $\mathbf{z}(x) = [y(x) \quad y'(x) \quad \dots \quad y^{(n-1)}(x)]^T$,
work out $\frac{dz}{dx}$ to form the state space equation.

Initial condition: $\mathbf{z}(x_0) = [y(x_0) \quad y'(x_0) \quad \dots \quad y^{(n-1)}(x_0)]^T$

A system of higher order ODE's with the highest order derivatives
of orders $n_1, n_2, n_3, \dots, n_k$

- Cast into the *state space form* with the state vector of
dimension $n = n_1 + n_2 + n_3 + \dots + n_k$

Now, till now we have been discussing a single first order equation now, but then whatever we have been doing is directly applicable to a first order vector ODE if x remains scalar, but y becomes vector. And therefore, f of x, y becomes vector; vector function even then all the operations that we have been conducting can be still conducted that is why whatever we have been discussing in the context of a single first order ODE can be immediately extended to a vector ODE. That means, a system of first order ODEs like this of course, in that case the initial condition has to be available for all the y s. So, the entire y vector has got an initial value initial vector y_0 . So, this can be solved with the help of the same formulas only with the change that y s become vector x remains scalar still ok.

However if you have an a high order differential equation then an n eth order ordinary differential equation can be always converted into n first order ordinary differential equation for that the way is to develop the equations in the state base; that means, that you first define a state vector including the unknown function, if first derivative second derivative up to n minus one eth derivative if the ODEs of n th order that is if the ordinary

differential equation involves derivatives up to n th order, then the state vector will involve derivatives up to $n - 1$ th order one order less ok.

So, this vector completely defines the state of the system that the differential equation is trying to describe and then you try to work out $\frac{dz}{dx}$ partly from this definition and partly from the differential equation how you see here that one is y . So, $\frac{dz}{dx}$ is going to be y' which is z_2 then y' now z_2 is y' ; that means, $\frac{dz_2}{dx}$ will be y'' which will be next entry that is z_3 ; that means, from here to here except the last one z_1' will be z_2 z_2' will be z_3 and. So, on till z_{n-2} z_{n-1}' will be z_n ; this one this is z_n z_n' will be the n th derivative of y and that you get from that you get from the differential equation and initial conditions also will get this kind of values whatever is the values given for y y' y'' etcetera, etcetera, up to the $n - 1$ th derivative. So, those will form the initial condition for that and then you solve the system with the same RK 4 formulas, etcetera, etcetera.

So, in general if you have got a number of ordinary differential equations each of order higher than the first then also you can follow the same procedure and break down the entire system into a large number of first order of differential equations in general if you have got a system of higher ODEs with higher order derivatives of the unknown functions y_1 , y_2 , y_3 , y_4 , etcetera being n_1 , n_2 , n_3 , etcetera, then you can cast the entire system into the state space form with the state sector of dimension $n_1 + n_2 + n_3$ etcetera; let us take an example.

(Refer Slide Time: 40:49)

Mathematical Methods in Engineering and Science Numerical Solution of Ordinary Differential Equations

Systems of ODE's

State space formulation is directly applicable when
the highest order derivatives can be solved explicitly.

The resulting form of the ODE's: normal system of ODE's

Example:

$$y \frac{d^2 x}{dt^2} - 3 \left(\frac{dy}{dt} \right) \left(\frac{dx}{dt} \right)^2 + 2x \left(\frac{dx}{dt} \right) \sqrt{\frac{d^2 y}{dt^2}} + 4 = 0$$

$$e^{xy} \frac{d^3 y}{dt^3} - y \left(\frac{d^2 y}{dt^2} \right)^{3/2} + 2x + 1 = e^{-t}$$

State vector: $\mathbf{z}(t) = \left[x \quad \frac{dx}{dt} \quad y \quad \frac{dy}{dt} \quad \frac{d^2 y}{dt^2} \right]^T$

With three trivial derivatives $z_1'(t) = z_2$, $z_3'(t) = z_4$ and $z_4'(t) = z_5$
and the other two obtained from the given ODE's,
we get the state space equations as $\frac{dz}{dt} = \mathbf{f}(t, \mathbf{z})$.

So, this state space formulation is directly applicable when the highest order derivatives can be solved explicitly for example, let us take these example this is a system of 2 ordinary differential equations in 2 unknown functions x of p and y of p which we want to solve. So, we want to solve for x of p and y of p.

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$x(t) \quad y(t)$

$$z_3 z_2' - 3 z_4 z_2^2 + 2 z_1 z_2 \sqrt{z_5} + 4 = 0$$

So, 2 unknown functions. So, we have got 2 differential equations right and what is the highest order of derivative of x that is involved here up to second order right similarly what is the highest order of derivative of y that is involved up to third order. So, in the

state space we will have x and $\frac{dx}{dt}$, this we will not have in the state space that is if the if up to the n th order derivative is involved, then up to the n minus one eth order derivative will appear in the state vector. So, $\frac{d^2x}{dt^2}$ is there as the highest order derivative of x .

So, in the state vector we will have up to $\frac{dx}{dt}$ in y will have we have the third order derivative of y as the highest order derivative. So, the state vector will have y $\frac{dy}{dt}$ $\frac{d^2y}{dt^2}$ that is up to second order derivative. So, the state vector will be x $\frac{dx}{dt}$ $\frac{d^2x}{dt^2}$ this will not be there the highest order derivative will not appear immediately for y will have $\frac{dy}{dt}$ and the second derivative of y not the third one because the highest order derivative will be actually found will be solved from the differential equation itself now see what we have got 3 derivatives; derivatives of 3 of the the components here will be trivial because z_1 is x . So, z_1' will be $\frac{dx}{dt}$ which happens to be z_2 . So, z_1' is z_2 similarly z_3 is y . So, z_3' will be y' that is $\frac{dy}{dt}$ which happens to be z_4 similarly z_4 is $\frac{dy}{dt}$ its derivative z_4' with second derivative of y which happens to be z_5 that is given. So, these 3 derivatives are trivial we need to find out what is z_2' and what is z_5' that you find from here from this differential equation from the above first differential equation you can write $y z_2' - 3 z_4 z_2^2 + 2 z_1 z_2^2 \sqrt{z_5 + 4} = 0$ right just match term by term we have written this differential equation y is in place of y actually we can write z_3 in place of y we can write z_3 .

So, just go on reading this first differential equation in terms of these as $z_1 z_2 z_3 z_4 z_5$. So, y is z_3 look up there then this second derivative is z_2' that is prime of this minus 3 then $\frac{dy}{dt}$ that is z_4 . So, z_4 here and then we have got $\frac{dx}{dt}$ whole square that is z_2^2 plus twice z_1 twice z_1 and then these derivative which is $z_2 z_2'$ and then square root of this which is third prime. So, square root of $z_5 + 4$. So, from this differential equation can we not find z_2' we can find z_2' we take this whole thing on the other side of the equation divide by z_3 .

So, as we take this whole thing on the other side of the equation.

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$$x(t) \quad y(t)$$

$$z_3 z_2' = 3 z_4 z_2^2 - 2 z_1 z_2 \sqrt{z_5} - 4$$

We get this and then we divide this whole thing with z_3 ; of course, this will be valid in a domain in which z_3 does not become 0.

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$$e^{4z_3} z_5' = z_3 z_5^{3/2} - 2 z_1 - 1 + e^{-1}$$

$$z_2' = \frac{3 z_4 z_2^2 - 2 z_1 z_2 \sqrt{z_5} - 4}{z_3}$$

$$z_3' = z_4$$

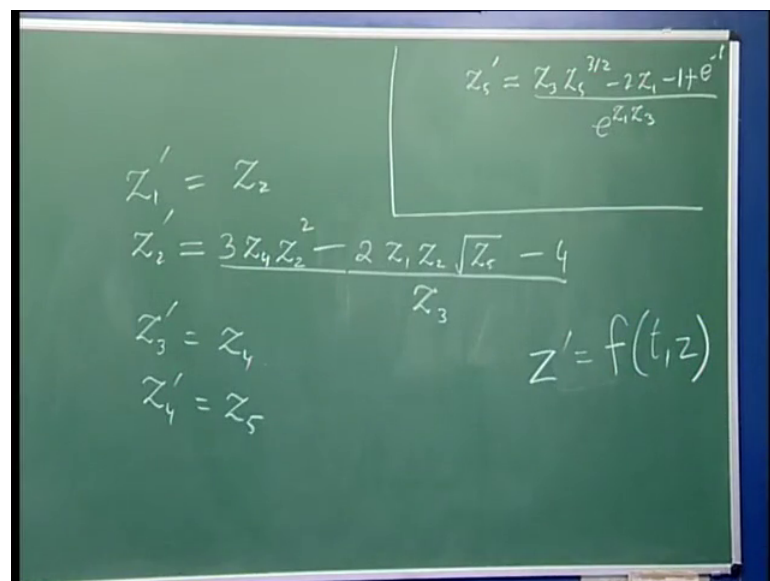
$$z_4' = z_5$$

So z_2 prime turns out to be a function of z_1, z_2, z_3, z_4, z_5 , right and we have already found that z_1 prime is z_2 and we have already found that z_3 prime is z_4 ; z_4 prime is z_5 and z_5 prime we need. So, for finding z_5 prime that is the derivative of this which is here actually; so we do a little further more in this box here.

The second differential equation here we write in the language of z's from here, so e to the power x y e to the power x y. So, x is z 1 and y is z 3 into d 3 y by d t cube, right. So, that is z 5 prime which we want to determine is equal to sorry minus or we can take is equal to and write the other things with the same style z 3 z 5 to the power 3 by 2 two z 1 minus one minus e to the power minus e do we get that plus. So, just relock this e to the power x y there e to the power z 1 z 3 into this third derivative which is the prime of z 5. So, z 5 prime is equal to. So, these things will take on the other side y that is z 3 into d 2 y by d t square to the power 3 by two; that means, z 5 to the power 3 by 2 this also goes to the other side minus 2 x minus one minus 2 z 1 minus one plus e to the power minus 3 that is here.

So; that means, that we can solve for z 5 prime as.

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$$z_5' = \frac{z_3 z_5^{3/2} - 2z_1 - 1 + e^{-1}}{e^{z_1 z_3}}$$

$$z_1' = z_2$$

$$z_2' = \frac{3z_4 z_2^2 - 2z_1 z_2 \sqrt{z_5} - 4}{z_3}$$

$$z_3' = z_4$$

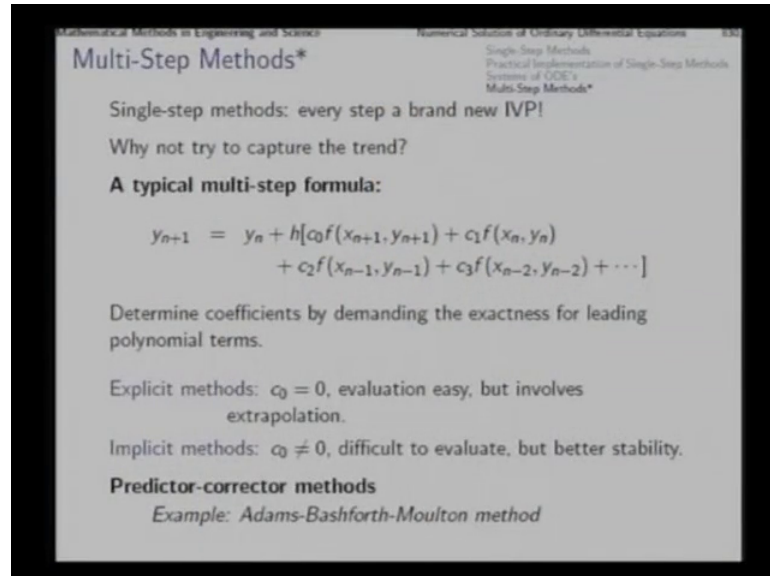
$$z_4' = z_5$$

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

Now, you see the prime the derivative or the factor function z that is z 1 prime z 2 prime z 3 prime z 4 prime and z 5 prime all these 5 are available in terms of the 5 sets and e; that means, together we can write the factor z 5 as this function with these 5 components in the same standard form right. So, that is this form and this is the state space equation. So, this is how we can formulate a system of higher order ODEs into the state space form and then use the same numerical methodologies that we discussed for the scalar single function.

Now, apart from these single step methods that we have discussed till now there is a family of methods called which used several earlier steps results as well?

(Refer Slide Time: 49:21)



For example in single step method every step of h is taken as a brand new initial problem in which the current value is there and from there we try to develop the slope function and take one step; now can we not try to capture the trend by learning from the history of several recent steps that is the kind of thing that is there in multi step method a typical multistep formula for solution of ODE is this that is in which you take y_{n+1} that is the next value of y as the current value plus h into a sum of several function values inverted sum of several function values. So, c_0 into f at the next point plus c_1 into f at the current point plus c_2 into f of the next previous point plus c_3 into f at the yet earlier point and so on. So, this a typical multi step formula.

Now, based on what do we determine the coefficients c_0, c_1, c_2, c_3 , etcetera, we say that we want the leading error terms h, h^2, h^3, h^4 as $0, 0, 0, 0$. So, as the leading error terms are forced to be 0 that gives us a system of linear equations in the coefficients c_0, c_1, c_2, c_3 and those coefficients are used in a multi step formula now you will say that we cannot use a multi step formula at the first step because at the first step all that we have is this starting from there x_0, y_0 before that there was no step no function evaluation that is why a typical multistep formula can be used as a multi step formula only after the single step results have been accumulated. So, they have to be

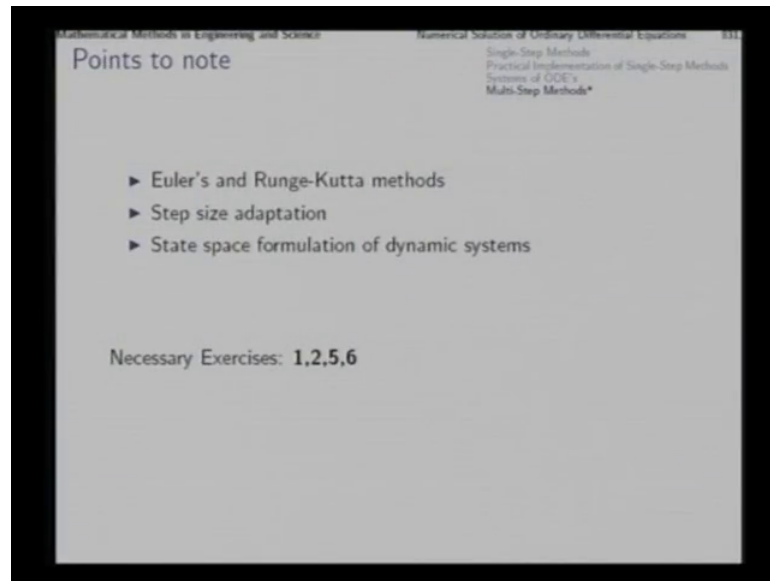
started with single step formula method single step methods and after some steps have been developed then only this kind of a formula can be used.

Now, there are 2 kinds of multi-step formulas one is explicit where c_0 is 0 that is the next value y_{n+1} is explicitly available in terms of the current and old value on the other hand if c_0 is not 0 then the corresponding method is called not an explicit method, but an implicit method; that means, y_{n+1} has been expressed in the form of a function which involves y_{n+1} itself and from that to determine y_{n+1} we really have to solve the equation in y_{n+1} . So, that kind of a method is called an implicit method. So, it is of course, not explicit. So, it is difficult to evaluate as a solution of an equation, but such methods have better stability.

And. So, far as the issue of stability is concerned in the next lecture we will discuss the issue of stability in more detail and talk of implicit methods in comparison to explicit methods even in single step formulas the kind of formulas that we have been discussing. So, far and the most famous most popular multi step formula is called the Adams Bashforth Moulton method in which there is a solution predicted using the using the Adams Bashforth formula and the solution is the corrected using the Moulton; Adams Moulton formula. So, this combination of a predictive formula and a corrector formula by which you predict and then make a correction. So, that kind of a predictor corrector formula is used in multi step method and if you need multi step methods then you can look up further literature on this kind of methods.

So, for the time being, we stop here with this little summary over what we have discussed.

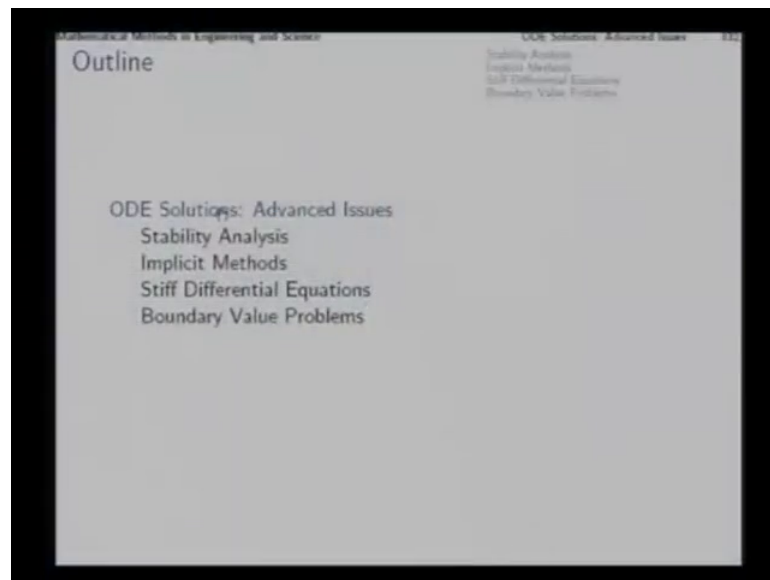
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In this particular lecture one is the basics of Euler's and Runge-Kutta methods and the second is the one of the very important professional of step size adaptation for really non-linear problems in which you use the step size in an efficient and effective manner without wasting too much of computational time. And the third important thing in this lesson is the state space formulation of dynamic systems with the way to reduce higher order differential equations or their systems into larger number of lower order larger number of first order differential equations and then develop the state space formulation in this manner which can be then numerically solved. So, this state space formulation is a necessary precursor to any numerical solution of ordinary differential equation.

In the next lecture, we will consider advanced issues of ODE solutions.

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We will discuss stability analysis and the utility of implicit methods and their specific usefulness in the case of stiff differential equations. And then we will continue into discussing boundary value problems in ordinary differential equations.

Thank you.