

**Computational Fluid Dynamics**  
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**Lecture - 23**  
**Finite difference approximation on an uniform mesh**

We have seen the basic idea of finite difference approximation. Now let us introduce some nomenclature and let us a try to make faster progress.

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**FD Approximations on a Uniform Mesh**

- Consider a uniform mesh with a spacing of  $\Delta x$  over an interval  $[0, L]$
- Denoting the mesh index by  $i$ , we can write  
 $f_i = f(x_i) = f(i \Delta x)$  and  $f_{i+1} = f[(i+1) \Delta x]$  and so on
- Then

(2)  $\Rightarrow \frac{df}{dx}|_x \approx [f(x+\Delta x) - f(x)] / \Delta x = (f_{i+1} - f_i) / \Delta x + O(\Delta x)$   
(3)  $\Rightarrow \frac{df}{dx}|_x \approx [f(x) - f(x-\Delta x)] / \Delta x = (f_i - f_{i-1}) / \Delta x + O(\Delta x)$   
(5)  $\Rightarrow \frac{df}{dx}|_x \approx [f(x+\Delta x) - f(x-\Delta x)] / (2\Delta x) = (f_{i+1} - f_{i-1}) / (2\Delta x) + O(\Delta x^2)$

are the            forward            "one-sided"  
                         backward            "one-sided"  
                         central                "symmetric"

differencing formulas, respectively, for  $df/dx$  at  $x$  or node  $i$

- One-sided formulas are necessary at ends of domains

So, we are looking at finite difference approximations on a uniform mesh. So, consider uniform mesh with a spacing of delta x over a space interval of between 0 and capital 1. So, we denote the mesh index by i here and what we mean by this is that f of the value of f at xi. So, that is the location the x value at the ith machine index or node which we write as f subscript i here is nothing, but f of i times delta x. So, that is what xi is here and we can also write f of i plus 1 in the shorthand notation as the value of f at i plus 1 delta x. So, that is instead of writing f of x and f of x plus delta x, we can write it as f subscript i and f subscript i plus 1 and similarly f subscript i minus 1.

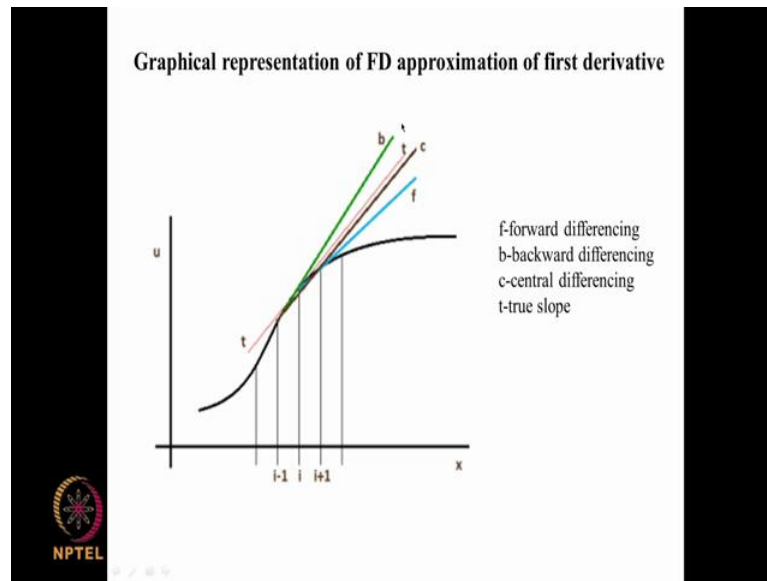
So, using this notation here we can write the approximation that we have got from equation 2  $df$  by  $dx$  at  $x$  as  $f$  of  $x$  plus delta  $x$  minus  $f$  of  $x$  divided by delta  $x$ . Instead of

that we can write it as  $f_{i+1} - f_i$  divided by  $\Delta x$  plus terms of the order of  $\Delta x$ . Similarly from the third equation where we expanded  $f$  of  $x - \Delta x$ , we got another approximation for  $df/dx$  as  $f_i - f_{i-1}$  by  $\Delta x$  plus again terms of the order of  $\Delta x$  other ones that are neglected. So, that neglected part is known as truncation error. So, the leading term of the truncation error varies as  $\Delta x$  the magnitude instead of that varies is  $\Delta x$  and that is what is denoted here as the order of accuracy of the approximation and we also got a different expression by manipulating equation 2 and equation 1 and 3, those 2 approximations we subtracted 3 from 1 and then we got a different approximation,  $df/dx$  at  $x$  as  $f_{i+1} - f_{i-1}$  divided by  $2\Delta x$  plus terms of the order of  $\Delta x^2$ . Now there is a some difference between these 3 approximations. So, first 1 is known as the forward differencing approximation because  $f(x)$ ,  $df/dx$  at  $x$  given in terms of  $f_{i+1} - f_i$  divide by  $\Delta x$ .

The second expression where the same derivative at the same location is expressed in terms of  $f_i - f_{i-1}$  by  $\Delta x$ , that is known as backward differencing. And in this the value of the first derivatives at  $x$  is expressed in terms of the two neighboring points,  $f_{i+1} - f_{i-1}$  divided by  $2\Delta x$ .  $2\Delta x$  because the distance between these 2 points is  $2\Delta x$  here, we get a central differencing scheme. So, forward and backward differencing schemes are 1 sided differencing schemes. So, that is you have  $i$  and  $i+1$  and  $i$  and  $i-1$  not, where as this is central in sense that you have points which are goes to the left  $i-1$  and right of this. So, that is both sides are being used to express the approximation of this. So, these are known as central differencing formulas. Usually central differencing formulas are more accurate than 1 sided differencing formula, but we need both central because are more accurate, and forward and backward are required at the edges of the fluid of the computational domain. If a there is no point of the right of this point  $x$  or point node  $i$  then we cannot make use of the forward differencing.

Similarly at the left edge of a boundary here, we cannot make use of point which is outside this computation domain. So, at the edges we would like to have 1 sided differencing and in the center we would like to have central differencing. So, 1 sided formula's are necessary at the ends of domains.

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We can look at these derivatives that we have forward backward central in a graphical way by looking at this function in this case it is a  $u$  here varying with  $x$  as per this particular curve. So, fairly smooth variation, and you have your mesh nodes this is  $i$ th nodes and then  $i + 1$   $i + 2$  similarly  $i - 1$   $i - 2$  like that, with uniform spacing of  $\Delta x$ . Now we are looking at the derivatives  $\frac{du}{dx}$  at  $i$  at this particular point. So, here we have the red line here is the true slope of this particular function at the point  $i$ . If you take  $i + 1$  or  $i + 2$  the slope is varying, but at the location  $i$  here the red line here is what is the true slope the true derivative value at  $i$  here forward differencing is based on the difference between  $i + 1$  and  $i$ . So, the value of  $i$  here and the value of the function at  $i$  and  $i + 1$  here, if you join them by line and then following it then you get this blue lines. So, that is the forward differencing and the slope of this the angle with respect to the horizontal is the approximation of the first derivative as given by the forward differencing.

And backward differencing is based on a line drawn between the value of  $i - 1$  or the function at  $i - 1$  and  $i$  and that is the green line here. And the central differencing is based on a line which is drawn between  $i + 1$ ,  $i - 1$  value here and  $i + 1$  value here and that is this black line given by  $c$  central differencing here. And if you now look at the slopes, so that is the angle that each of the straight lines is making with the

horizontal you see that the central differencing line here is much closer to the value of the true slope. So, it is almost parallel to this which means it is accurate, where as both f and b the forward and backward is at different angle compared to the true slope. So, that indicates sense of more error with forward and backward differencing schemes that we would get as compared to the central differencing. So, this also an indication of the mathematically derived truncation error which is of second order accuracy in the case of central, where as f and b are first order if you go back to the Taylor series expansion here.

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### FD Approximation for a First Derivative


- The terms in the Taylor series expansion can be rearranged to give

$$\frac{df}{dx}\bigg|_x = \frac{[f(x+\Delta x) - f(x)]}{\Delta x} - \frac{d^2f}{dx^2}\bigg|_x \frac{(\Delta x)^2}{2!} + \dots - \frac{d^n f}{dx^n}\bigg|_x \frac{(\Delta x)^{n-1}}{n!} - \dots$$

Or

$$(2) \quad \frac{df}{dx}\bigg|_x \approx \frac{[f(x+\Delta x) - f(x)]}{\Delta x} + O(\Delta x)$$

- Here  $O(\Delta x)$  implies that the leading term in the neglected terms of the order of  $\Delta x$ , i.e., the error in the approximation reduces by a factor of 2 if  $\Delta x$  is halved.
- Equation (2) is therefore a first order-accurate approximation for the first derivative.



So, the in a in central differencing it is this 1 which is being neglected from this term onwards.


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**Basics of Finite Difference Methods**

- The basis of a finite difference method is the Taylor series expansion of a function.
- Consider a continuous function  $f(x)$ . Its value at neighbouring points can be expressed in terms of a Taylor series as

$$(1) f(x + \Delta x) = f(x) + \frac{df}{dx}\bigg|_x (\Delta x) + \frac{d^2f}{dx^2}\bigg|_x \frac{(\Delta x)^2}{2!} + \dots + \frac{d^n f}{dx^n}\bigg|_x \frac{(\Delta x)^n}{n!} + \dots$$

- The above series converges if  $\Delta x$  is small and  $f(x)$  is differentiable
- For a converging series, successive terms are progressively smaller



Now, what if it is the third derivatives which is being neglected, and in the case of 1 sided differencing it is a second derivative and terms are being neglected. So, if it is a converging series the second derivative term is likely to be larger in magnitude, then the third derivative term so; that means that we are neglecting a larger amount of error with 1 sided differencing involving first order accurate comes here. Whereas in the case of central differencing it is a third derivative. So, that is the next term is the one that has been neglected and all the successive terms and since the next term is smaller than this term the error involved in the central differencing is less. So, that is also another way of looking at these approximations. So, they can be these approximations and we can also get an approximation of even higher order accuracy, we can get a third-order or nth order type of thing.

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### Higher Order Accuracy

- Higher order of accuracy of approximation can be obtained by including more number of adjacent points
- Let us seek a third-order, one-sided approximation for  $u(x)$ . This requires four points and will be of the form

$$(6) \quad \frac{du}{dx}\Big|_i = [a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3}] / \Delta x + O(\Delta x^3)$$

- This is equivalent to writing (6) as

$$(7) \quad \frac{du}{dx}\Big|_i = [a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3}] / \Delta x + (f) \frac{d^2 u}{dx^2}\Big|_i (\Delta x) + (g) \frac{d^3 u}{dx^3}\Big|_i (\Delta x^2) + (h) \frac{d^4 u}{dx^4}\Big|_i (\Delta x^3)$$

or

$$(8) \quad a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3} = \frac{du}{dx}\Big|_i (\Delta x) + (f) \frac{d^2 u}{dx^2}\Big|_i (\Delta x^2) + (g) \frac{d^3 u}{dx^3}\Big|_i (\Delta x^3) + (h) \frac{d^4 u}{dx^4}\Big|_i (\Delta x^4)$$

- How to find a, b, c and d?

So, let us say that we want to have we can have a systematic way of arising at order of accuracy for a given derivative. In this case we are going to look at only the first derivative and we will seek a third-order one sided approximation for  $u$  of  $x$  at  $x$ . So, we will see when we generalize it then you generalize recent requires that in order to write this we need 4 successive points of the mesh. So, that and this is of this particular form that is  $\frac{du}{dx}\Big|_i = \frac{a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3}}{\Delta x} + O(\Delta x^3)$ . So, we are making use of that and that is this formula here for a one sided third-order accurate approximation will involve four points four successive points all to 1 side of  $i$ . So, that is  $u_i, u_{i+1}, u_{i+2}, u_{i+3}$  and these are all multiplied by certain coefficients, real coefficients  $a, b, c, d$  and divide this whole thing is divided by  $\Delta x$  and this whole formula is third-order accurate and therefore, we can write  $\frac{du}{dx}\Big|_i$  as per this in this particular way. So, that is we seek an approximation for  $\frac{du}{dx}\Big|_i$ , in the form of  $a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3}$  divided by  $\Delta x$  plus terms of the order of  $\Delta x^3$ , this makes it a third-order accurate of approximation.

Now, when this is equivalent in a way to writing this approximation, because we have seen that all these tells is expansion involve derivatives; first derivatives, second derivative, third derivative and all that. So, what this approximation actually implies is that we are we would like to get an approximate formula which is  $\frac{du}{dx}\Big|_i$

equal to  $au_i + bu_i + 1 + cu_i + 2 + du_i + 3$  divided by  $\Delta x$ , plus zero times  $du^2$  by  $du \times \Delta x$  there is if this 1 is not that is it is not there. It is there, but being multiplied by zero. So, that it does not appear in this expression similarly zero times the third derivative time  $\Delta x^2$  because we divided by  $\Delta x$  here it become  $\Delta x$  and of course, you have factorial 3 here, but since it is zero it does not matter here again you have factorial 2 it does not matter because multiple by this. And a coefficient  $e$  times the fourth derivatives at  $x$ , times  $\Delta x^3$  by factorial four which can be substitute in this coefficient here and when you have an expression like this plus higher order terms, that is the fifth derivative times  $\Delta x$  to the power four and all that this expression equation 7 and equation 6 are equivalent because they both are saying that  $\frac{d^2 u}{dx^2}$  at  $i$  is in terms of this  $u_i + 1 + u_i + 2 + u_i + 3$  like this plus 0 times this. So, this  $\Delta x$  term does not appear zero times  $\Delta x^2$  terms. So, this also does not appear and the only term the leading term that appears is this factor coefficient  $e$  still to be determined times  $\frac{d^4 u}{dx^4}$  at  $x$  time  $\Delta x^3$ .

So, this is what although we are writing it like this what we are saying is that this approximation is a this form plus higher order terms. Now, you can rewrite this as you bring this on to this side  $au_i + 1 + bu_i + \dots$  all this things equal to  $\frac{du}{dx}$  minus 0 times this, minus 0 times this, minus 0 times this. So, writing this is, but how do we define the values of  $a, b, c, d$ ? If we can find unique values of  $a, b, c, d$  then we have a formula here.

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### Third-Order, One-sided Formula

- Expand  $u_{i+1}$ ,  $u_{i+2}$  and  $u_{i+3}$  in Taylor series about  $u_i$ :
  - (9a)  $u_{i+1} = u(x + 1\Delta x) = u(x) + du/dx|_x (\Delta x) + d^2u/dx^2|_x (\Delta x)^2/ 2! + \dots$
  - (9b)  $u_{i+2} = u(x + 2\Delta x) = u(x) + du/dx|_x (2\Delta x) + d^2u/dx^2|_x (2\Delta x)^2/ 2! + \dots$
  - (9c)  $u_{i+3} = u(x + 3\Delta x) = u(x) + du/dx|_x (3\Delta x) + d^2u/dx^2|_x (3\Delta x)^2/ 2! + \dots$
- Find  $\{ a u_i + b (9a) + c(9b) + d (9c) \}$  and rearrange to get
  - (10)  $a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3} = p u + q du/dx|_x (\Delta x) + r d^2u/dx^2|_x (\Delta x^2) + s d^3u/dx^3|_x (\Delta x^3) + t d^4u/dx^4|_x (\Delta x^4)$
  - (8)  $a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3} = + du/dx|_x (\Delta x) + (0) d^2u/dx^2|_x (\Delta x^2) + (0)d^3u/dx^3|_x (\Delta x^3) - (e) d^4u/dx^4|_x (\Delta x^4)$
- Compare the coefficients of (8) and (10) to get
  - $a = -11/6 \quad b = 3 \quad c = -3/2 \quad d = 1/3 \quad \text{or}$

(11)  $\left. \frac{du}{dx} \right|_i = [-11 u_i + 18 u_{i+1} - 9 u_{i+2} + 2 u_{i+3}] / (6\Delta x) + O(\Delta x^3)^4$

And in order to find this a, b, c, d what we do is that we expand  $u_{i+1}$ ,  $u_{i+2}$ ,  $u_{i+3}$  which are appearing in this formula, in this proposed formula in terms of Taylor series about point i for example,  $u_{i+1}$  is nothing, but  $u$  at  $x$  plus  $1 \Delta x$  and that we know is  $u$  of  $x$  plus  $du$  by  $dx$  at  $\Delta x$  plus  $d^2u$  by  $dx^2$  at  $\Delta x^2$  factorial 2 like this. Similar  $u_{i+2}$  is nothing, but  $u$  of  $x$  plus  $2 \Delta x$ . So, wherever we had  $\Delta x$  here we substitute  $2 \Delta x$  here. So, and if  $\Delta x$  is small, two times  $\Delta x$  also small. So, and assuming that it is small and it is still convergent and all that kind of thing we can write  $u_{i+2}$  as  $u$  plus  $du$  by  $dx$  times  $2 \Delta x$  plus  $d^2u$  by  $dx^2$  times  $2 \Delta x$  whole square by factorial 2 in similarly,  $u$  at  $i+3$  is  $u$  of  $x$  plus  $3 \Delta x$  and therefore, we can write this as  $u$  of  $x$  plus  $du$  by  $dx$  times  $3 \Delta x$  plus  $d^2u$  by  $dx^2$  times  $3 \Delta x$  whole square plus  $3 \Delta x$  whole cube by factorial 3 and so on.

Now we have these approximations and we replace these things in the previous equation here. So, we evaluate this term  $a u_i + b u_{i+1} + c u_{i+2} + d u_{i+3}$  like that. So, we multiply this whole thing by  $b$  and then this whole thing by  $c$  and this whole thing by  $d$  and then take the sum of all this things and this will be given finally, in this particular form. This will be  $p u_i + q$  times  $du$  by  $dx$  times  $\Delta x$  plus  $r$  times  $d^2u$  by  $dx^2$  times  $\Delta x^2$  whole square. For example;  $p$  will be  $a$  here, and then when we multiply this by  $b$  we get



$b + c + d$ . So,  $p$  is  $a + b + c + d$  and  $q$  here will be  $b + 2c + 3c$ ,  $a + 3d$ . In that way we can ones we multiply and then put all these things together we can express this  $p$ ,  $q$ ,  $r$ ,  $s$ ,  $t$  in terms of  $a$ ,  $b$ ,  $c$ ,  $d$ s. Now we compare this equation with the equivalent expression equation 8 that we said is equivalent to this approximation here with zero coefficients here. From this we can say that  $p$  is equal to 1. So, that is  $a + b + c + d$  is equal to 1 and  $b + 2c + 3c + 3d$  equal to 0 and this will be a square here. So, this will be  $4b + 9c + 16d$  will be equal to 0 and so on like this.

So, that will be give you four equations 1 for  $p$ , 1 for  $q$ , 1 for  $r$  and 1 for  $s$ . This  $p$  coefficient is 1 and the other 3 coefficients are 0. So, it does not matter what this  $e$  is we will come out of the solution because we have 4 equations, that is  $a + b + c + d$  equal to 1 and  $2b + 3c + 4d$  equal to 0 and  $4b + 9c + 16d$  equal to 0 and so on like that. So, you have 4 equations and 4 unknowns and if you solve those things you get  $a$  equal to  $-\frac{11}{6}$ ,  $b$  equal to  $\frac{3}{2}$  and  $c$  equal to  $-\frac{3}{2}$ ,  $d$  equal to  $\frac{1}{3}$ . And  $e$  will be some sort of summation of this that will come out in this way, it does not matter what the coefficient is this. Anywhere this whole term is going to be neglected. So, that will give us the third-order approximation and when we substitute this back into the original equation we can get  $\frac{du}{dx}$  at  $i$  here as  $-\frac{11}{6}u_i + 18u_{i+1} - 9u_{i+2} + 2u_{i+3}$  divided by  $6\Delta x$  plus terms of the order of  $\Delta x^3$ .

So, this is a third-order 1 sided approximation for the first derivative at  $i$  involving  $i$ ;  $i + 1$  the value of  $u$  at  $i$ ;  $i + 1$   $i + 2$  like this and in this think on a uniform mesh when we derive it using this Taylor series like this, we will notice that the sum of all these coefficients will be equal to 0. So, you have  $-11 + 9$ ,  $-9$ . So, that is  $-20$  and you have  $18 + 2$ ;  $20$ . The sum of all these things, that is  $a + b + c + d$  will be equal to zero of here. So, that is something that that is 1 quick way of us for us to verify that we have got the right kind of formula here. So, this kind of expression can be derived not just the first derivative, we can derive it for any  $p$ th derivative and we can do it for any order of  $q$ . It is possible for us to derive a  $q$ th order of approximation for a  $p$ th derivative using either one sided or central things and the number of points  $n$  here depends on what is order of  $p$  here, and what is the order of  $q$ . It is equal to  $t + q$  in the case of one sided, and it is one less in the case of central

differencing. So, this is your a general way of deriving a finite difference approximation of some order. In the next lecture we will try to apply this to an equation and then see what kind of approximation we get.

Thank you.