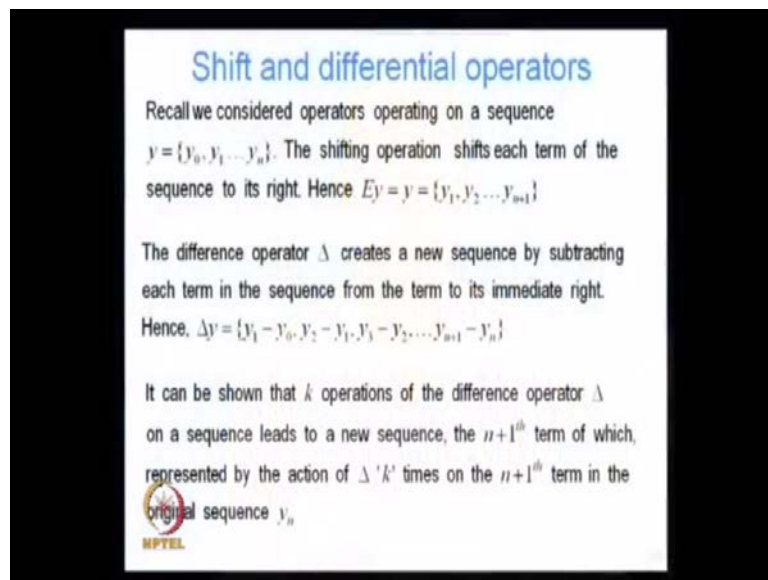


Numerical Methods in Civil Engineering
Prof. Arghya Deb
Department of Civil Engineering
Indian Institute of Technology, Kharagpur

Lecture - 27
Differential Operators

In lecture 27 of our series on numerical methods in civil engineering, we will continue with our discussion on differential operators, recall we considered operators operating on a sequence y is equal to y_0, y_1 through y_n .

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and we define two operators, we define the shifting operator which we denoted as E and which operates on the each term of the sequence and shifts It to the shifts each term to the and we also define the difference operator delta which creates a new sequence by taking the difference between each term In the sequence and Its next term. So, for y for in the 0th position, we had y_0 in my original sequence in the new sequence it will be y_1 minus y_0 . So, the term on the minus the original term similarly, for other terms in the sequence.

It can be shown that k operations of the differential operator delta, lead to a new sequence the $n + 1$ th term of which is represented by the action of delta. K times on the $n + 1$ th term in the original sequence y_n . So, the $n + 1$ th term in the original sequence is y_n because, it starts from y_0 and what I am just saying Is that. If you

operate k times on that operator that is the resultant sequence is the action of delta, k times on the n plus 1th term in my original sequence which was y_n .

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Relation between Δ and E


The result is represented in the following manner using binomial notation:

$$\Delta^k y_n = y_{n+k} - C_k^1 y_{n+k-1} + C_k^2 y_{n+k-2} - \dots + C_k^k (-1)^k y_n \quad (*)$$

Recalling that $\Delta y = y_{n+1} - y_n$ while $E y = y_{n+1}$ we can write symbolically $\Delta y = (E-1)y$ where Δy denotes Δ acting on the sequence y while $(E-1)y$ denotes the result of E acting on the sequence y from which the sequence y is then subtracted

Using this symbolic notation, the above theorem can be written as

$$\Delta^k = (E-1)^k$$

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So, the result is represented as you can understand. If you operate k times on the y_n you are going to get more and more terms. This first time when you operate delta on y_n you are going to get $y_{n+1} - y_n$. If you operate again on that as you operate on y_{n+1} as well, as y_n similarly, the terms become larger and eventually, the result of operating k times on y_n with the delta operator can be represented by something like this. We saw this expression last time and we also tried to give a proof on that using Induction. So, here I am just mentioning the final result. So, that was where we stopped last time.

Now, let us take a step back and recall that $\Delta y_n = y_{n+1} - y_n$ and since $E y_n = y_{n+1}$. We can write symbolically $\Delta y_n = E y_n - y_n$ because, E operating on y_n is going to be $y_{n+1} - y_n$; So that, is the equivalent to the operating on y_n with Δ . So, we can write this Δ is equal to $E - 1$. We can write Δ is equal to $E - 1$ and using this symbolic notation the above theorem, the above theorem meaning this result this result can be written as Δ^k is equal to $(E - 1)^k$, because they are equivalent. So, we can write this as well as $(E - 1)^k$ operating on y_n .

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The slide is titled "Difference operator on a sequence". It contains the following text: "Sometimes it is illuminating to consider the effect of applying repeatedly the difference operator Δ to a sequence if the results of the operation are arranged in the following fashion:"

The diagram shows a triangular arrangement of terms:

$$\begin{array}{ccccccc} & & & & & & y_0 \\ & & & & & & \Delta y_0 \\ & & & & & & y_1 & \Delta^2 y_0 \\ & & & & & & \Delta y_1 & \Delta^3 y_0 \\ & & & & & & y_2 & \Delta^2 y_1 & \Delta^4 y_0 \\ & & & & & & \Delta y_2 & \Delta^3 y_1 \\ & & & & & & y_3 & \Delta^2 y_2 & \Delta y_3 \\ & & & & & & \Delta y_3 \\ & & & & & & y_4 \end{array}$$

An NPTEL logo is visible in the bottom left corner of the slide.

So, sometimes it makes Its yields a lot of Insight, If we look at a sequence y_0 y_1 y_2 y_3 y_4 and then see the results of operating on the sequence repeatedly with the delta operator and arrange the terms In this fashion. So, here what I have done I had originally y_0 y_1 through y_4 .

First I operate on this. So, Δy_0 that is equal to y_1 minus y_0 Δy_1 which Is equal to y_2 minus y_1 Δy_2 y_3 minus y_2 and Δy_3 y_4 minus y_3 . So that, Is operate first on with once the delta operator with the difference operator once then If I operate again, So, let us see what $\Delta^2 y_0$ would be that would be Δy_1 minus Δy_0 $\Delta^2 y_1$ would be $\Delta^2 y_2$ minus $\Delta^2 y_1$ $\Delta^2 y_2$, would be $\Delta^3 y_3$ minus $\Delta^3 y_2$ similarly, If you operate 3 times $\Delta^3 y_0$ Is going to be $\Delta^2 y_1$ minus $\Delta^2 y_0$ $\Delta^3 y_1$ $\Delta^2 y_2$ minus $\Delta^2 y_1$ and $\Delta^4 y_0$ Is $\Delta^3 y_1$ minus $\Delta^3 y_0$.

So, If you arrange this sequence, this difference the action of the difference operator on the sequence the repeated action of the difference operator on the sequence In this fashion Sometimes It yields a lot to It gives a lot of Insights for Instance In the next problem.

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Difference operator on a sequence

Thus if we have an original sequence $y = \{0,0,0,1,0\}$ the results of repeatedly applying the difference operator Δ to the sequence if arranged as above yields:

0				
	0			
		0		
			0	
				1
			0	
				1
			1	
				-3
			1	
				-2
				-1
				0

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suppose, my original sequence was 0,0,0,1,0 and I operated on that repeatedly with my difference operator and you can see that after I operate first time I get 0,0,1 minus 1 second time I get 0, 1 minus 2, third time I get 1 minus 3, fourth time I get ((Refer Time, 05:48)) minus 4. So, what does this tell me this tells me that, If my original sequence was actually 0,0,0,0,0 and then I Introduced a minor perturbation to that sequence In the fourth term In the sequence I made It 1.

So, If my original sequence was 0,0,0,0 all the terms were 0 In my sequence, If I operated on that sequence with the difference operator 4 times what would I get? I would still get 0 Del 4 y 0 would still be 0. But, then If I Introduce some minor perturbation one term In the sequence undergoes a slight change, It changes from 0 to 1 In this test. The fourth term In the sequence changes from 0 to 1 then If I look at the difference way down the road after I have taken repeated differences you can see that the difference Is much larger It has become amplifier that minor change that change In the fourth member of the sequence that change In 1 has now become minus 4.


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Difference operator on a sequence

This shows the effect of perturbation in one element of a sequence. If the sequence $y = \{0,0,0,0,0\}$ is changed to the sequence $y = \{0,0,0,1,0\}$ just by perturbing one element of the sequence, it is clear that after applying the difference operator four times to the sequence the difference broadens out and grows quickly

This sort of approach allows us to study the effect of errors in initial data on derivatives if we can relate derivatives to difference operators

It also leads to the conclusion that the error in the derivative is always higher than the error in the initial data



So, this shows the effect of perturbation in 1 element on the sequence, which changes by just 1 element then after difference operator it, has grown 4 times. So, this tells us why in any numerical method you will see that if you look at the derivative, the error in the derivative is always higher than the error in my original variable. For instance, if I know many of you are familiar with the finite element method where suppose, we have the primary variable as the displacement, so, and then we are interested if you look at the results of the solution, we are looking at the displacements we are looking at this stress, we look at this stresses; so, suppose there is an error in the displacement and then we look at the error in the stresses the error in the stress will always be higher than the error in the displacement. Whether the error in the displacement is due to discretization error or it is just a truncation error that error in the derivative will always be higher this exactly shows why because, repeated operations of the difference operator, it always multiplies it always scales magnifies the error.

So, this sort of approach allows us to study the effect of errors in initial data on derivatives. If there is a ((Refer Time-08:27)) here, if we can relate the derivatives to the difference operators I have shown this for the difference operators but, when if you have to claim if I claim this for the derivatives I have to relate the derivatives to the difference operator, in the terms of that you can do that; so, the same thing carries over for derivatives and error in the initial data it gets multiplied, it gets scaled several times then more times you take the derivatives more is the error scaled by. It also leads to the

conclusion that the error in the derivative is always higher than the error in the initial data.

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Difference operators on a function

In case of a known function, evaluation of successive higher order differences leads to the following conclusion: it is seen that differences decrease rapidly as the order of the differences increase, until the differences become small enough that round off error dominates.

Such behavior is typical of difference schemes of well behaved functions. In the following table, which shows the evaluation of successive difference operators of the function $\sin x$ for $x \in [1.30, 1.36]$, with step size $h = .01$, it is clear that for $k \geq 4$, $\Delta^k y$ is completely determined by the round-off errors in the table of values of y .

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up till now we have looked at difference operators on a sequence, we can as well operate we can as well apply these different operator, In a function So, In case of a known function evaluation of success of higher order differences leads to the following conclusion. We can show that also, it is seen that differences decrease rapidly as the order of the differences Increase until the differences becomes small enough that round of operators, the round of error dominates. So, It Is now that If you If Instead of a sequence I look at a function, If I see, If I take repeated differences If I take repeated differences on a function, It Is found that the differences decrease rapidly and then until finally, the differences are only different by the round of error. So, If In my original function values I had certain round of error then after repeated differences what is going to show up is just the round of error.

Such behaviors typical of difference schemes of well behaved functions, In the following table which shows the evaluation of successive difference operators of the function $\sin x$ So, If we looking at the function $\sin x$ over the range x belongs to 1 point 3, 0 and 1 point 3, 6 and we are evaluating It at step size of point of 0, 1; we can see that after we take the fourth difference the It Is totally dominated by the round of error In the values of y let us look at this little table .

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Difference operator on $\sin x$

x	y	Δy	$\Delta^2 y$	$\Delta^3 y$	$\Delta^4 y$
1.30	96356	2620			
1.31	96618	2535	-0085		
1.32	968715	2433	-0102	-0017	
1.33	971148	2336	-0097	0005	0022
1.34	973484	2336	-0097		
1.35	975723	2239			



So, here now we are looking at difference operators on a sequence on a function rather than a sequence and the function that we are considering is $\sin x$ and I am evaluating that $\sin x$ over an interval from 1 point 3 0 to 1 point 3, 6 and I am evaluating it at steps of point 0,1; So, 1 point 3, 0 1 point 3, 1 these are my values at which I am evaluating the function $\sin x$ and these are the values, the results of $\sin x$, these are the results of $\sin x$ and here I have taken the difference between this and this and this and this and so on and so forth.

Then I have taken the difference again, So, In this case this minus, this becomes that, this minus this, becomes this minus this, becomes that and then I have taken the difference of third time you can see that these are becoming smaller and smaller these magnitudes are becoming smaller and smaller the magnitudes of these differences are becoming smaller and smaller until they are so small that this may be as small as the round of error involved in the calculation of this.

If, we have calculated this with a round of error up to the fourth decimal place then this difference is the same as the round of error which I used round of which I used in my calculation of this $\sin x$. So, this is this may become as small as the round of error is that clear. So, Let I hope it is clear. The first thing that I talked about was the fact that when you have a when you have a perturbation, in the initial data when you take repeated difference that perturbation gets amplified. So, that means that when you have an error in

the Initial data that error becomes amplified but, here I am saying that when you have a certain function that you are evaluating at certain Intervals, at a certain fixed Interval If I take repeated differences those things become smaller, this differences become smaller does not say anything about the error the error the error might If there was an error here If there was an error In the calculation here, when I take repeated differences that Is also going to get amplified, that Is for sure that holds every time all I am saying here Is that this differences this magnitude of this differences are becoming smaller but, the error can become larger.

If there was an error there that Is going to get magnified this Is the actual difference the actual difference Is becoming smaller but, the error If there was an error In my calculation of $\sin x$ somewhere then when I do this repeatedly that error Is going to become larger and larger that Is why when I say that this becomes this Is equivalent to the round of that means that Is actually reflected by that. So, If there was a round of error In the calculation of $\sin y$ have I take repeated differences that round of error Is going to get multiplied that Is a It Is going to become larger It Is going to get magnified but, now when I take the repeated differences the function value the difference value Is also becoming smaller the difference value Is also becoming smaller the actual. So that, so that round of error, If It Is Increasing It may be become actually larger than the true difference it become larger than the true difference Is that clear I hope I did not confuse you.

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Difference operators on a function

As the above example shows, difference operations can be applied fruitfully to functions as well as sequences


E and Δ relate a function f , evaluated at a certain value of its argument, say x , to the function value evaluated at $x+h$, where h is the step size

$$Ef(x) = f(x+h), \quad \Delta f(x) = f(x+h) - f(x)$$

Higher order differences can be evaluated similarly :

$$\begin{aligned} \Delta^2 f(x) &= \Delta[\Delta f(x)] = \Delta[f(x+h) - f(x)] = \Delta f(x+h) - \Delta f(x) \\ &= f(x+2h) - f(x+h) - f(x+h) - f(x) \\ &= f(x+2h) - 2f(x+h) - f(x) \end{aligned}$$

Similarly, $\Delta^2 f(x-h) = f(x+h) - 2f(x) + f(x-h)$

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So, as the above example shows difference operations can be applied fruitfully to functions as well as sequence. So, E and Δ relate a function f evaluated at a certain so It is very similar, So, I do not want to elaborate this but, this is very similar to how we operate on sequence so $E f$ of x is nothing but, f of x plus h x evaluated at the after a after a move one step forward, So, If I am If I have uniform grad If I have a uniform grad If $E f$ of x is f evaluated at x plus next at x .

At the next point on the grad so f evaluated at the next point on the grad which is x plus h similarly, Δf of x is equal to f evaluated at the next point on the grad minus f evaluated at x similarly, we can evaluate we can evaluate higher order differences, So, $\Delta^2 f$ of x is equal to Δf of x I operate on Δf of x I operate with on f of x with the difference operator and then I operate again.

So, operating on f of x with a difference operator I get f of x plus h minus f of x and then I operate again with the difference operator, So, I have write first on f of x plus h , So, I am going to get f of x plus $2h$ minus f of x plus h minus Δ operating on f of x will give me f of x plus h minus f of x , So that, is what I am going to get; If I pull the terms together I get f of x plus h minus $2f$ of x plus h minus f of x similarly, $\Delta^2 f$ of x minus h is given by this same logic x minus h Δf of x minus h is equal to f of x minus f of x minus h and operate on that with Δ again I get that value.

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Difference operators on a function

It is important to note that for functions unlike sequences, the values of the difference operators depend on the step size h


Next we consider the following result which states that if f is a polynomial of degree m then $\Delta^k f$ for $1 \leq k \leq m$ is a polynomial of degree $m - k$ and $\Delta^{m+1} f = 0$

This can be easily proved for $k = 1$ by Taylor's theorem:

$$\Delta f(x) = f(x+h) - f(x) = hf'(x) + \frac{h^2}{2!} f''(x) + \dots + \frac{h^m}{m!} f^{(m)}(x)$$

which is a polynomial of degree $(m-1)$

For $k > 1$ this can be proved by induction

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So, It Is Important to know that for functions unlike sequences, the values of the difference operator depends on the step size It depends on h remember for sequences, It only evaluated, It only depended on the function value on the various terms; In the sequence on the various depended on y_n, y_{n+1}, y_0, y_1 , now It depends not only It depends on the step size It depends on the step size.

Next, we look at the following results which states that If f is a polynomial of degree n then $\Delta^k f$ for k lesser than or equal to n greater than or equal to 1. Is a polynomial of degree $n - k$ and $\Delta^{n+1} f$ Is equal to 0, If you think of derivative this Is very, this should be very familiar to you, If I have a function which Is a polynomial of degree n and I take the derivative k times I take the derivative k times then the order Is reduced to $n - k$ think of a polynomial x to the power n .

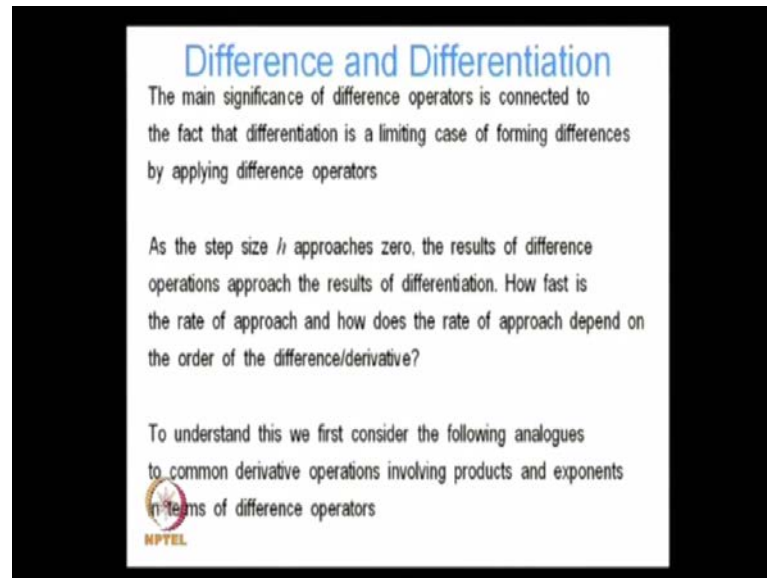
If I take the derivative k times then I have the term will become x^{n-k} , So, the same thing holds for the difference operator what It Is saying that, If f Is a polynomial of degree n then I If I operate on that function k times with the difference operator then I am going to get a polynomial of degree $n - k$ similar to what I have would get If I operated with f k times with the different, differential operator Instead of the difference operator.

And then If I operate $n + 1$ times on f I am going to get 0 think of a polynomial of degree x to the power n If I take $n + 1$ derivative of x to the power n I am going to get 0 similarly, exactly the same thing happens for the difference operator to show that well If we can show that for k equal to 1 by using Taylor's theorem; So, $\Delta f(x)$ Is equal to $f(x+h) - f(x)$ by definition and then I expand $f(x+h)$ about x , In Taylor series. So, what do I get $f(x+h) = f(x) + hf'(x) + \frac{h^2}{2!} f''(x) + \dots$ $f(x)$ cancels and I have $hf'(x) + \frac{h^2}{2!} f''(x) + \dots$ h $f'(x)$ plus $\frac{h^2}{2!} f''(x)$ through $\frac{h^m}{m!} f^{(m)}(x)$, m th derivative of f evaluated f at x which It Is clear, Is a polynomial of degree $n - 1$ It Is a polynomial of degree $n - 1$, where Is the leading order term Is given by this $hf'(x)$ and that Is the first derivative of the polynomial of degree n . So, that is a polynomial of degree $n - 1$.

So, this term will be $n - 1$ that term will be $n - 2$ and so on and so forth so what does this tell me that if I and this Is actually equal to that, this Is exactly equal to my difference the result of my difference operation. So, this tells me that If I take the

first difference of $f(x)$ and if f is a polynomial of degree m then $\Delta f(x)$ is going to be a polynomial of degree $m - 1$ and for higher orders of k we can prove it similarly, by induction.

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Difference and Differentiation

The main significance of difference operators is connected to the fact that differentiation is a limiting case of forming differences by applying difference operators

As the step size h approaches zero, the results of difference operations approach the results of differentiation. How fast is the rate of approach and how does the rate of approach depend on the order of the difference/derivative?

To understand this we first consider the following analogues to common derivative operations involving products and exponents in terms of difference operators

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the main significance of difference operators is connected to the fact that differentiation is a limiting case of forming differences by applying difference operators. So, the difference operators as I make this step size as h if I take, if I consider, difference operators operating on a function and I reduce my step size I reduce my h in the limit that h goes to 0 it can be shown that my difference and derivative operators become very similar so that, is why they are useful that is why these difference operators when we solve a differential equation numerically. We can use these difference operators to approximate my differentiation operations.

So, as the step size approaches 0 the results of difference operations approach the results of differentiation the question is how fast is the rate of approach number 1; how fast does the difference operator approach the derivative as h goes to 0 number 1 and number 2 how does the rate of approach change with the order of the difference order of the derivative is the rate of approach the same for the first order difference operator and the first order different derivative and the second order difference operator and the second order derivative, the third order difference operator and the third order derivative before

we look at this we first consider the following analogous operations, which are very similar to for.

When you first look at derivatives you look at things like derivative of a product and things like that derivative of an exponential or derivative of something raise to the power of something. So, you looked at those derivatives first when we looked at derivatives like In high school or somewhere now I want to look at very similar operations using the difference operators I want to apply the difference operator on a product, I want to apply difference operator and exponent and see the result look at the result and compare to what I would get, If I apply the derivative on those same things, So, If I apply the difference operator on a product how does the result compare to the derivative of the same of that same product let us look at that.

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Common differentiation operations

Difference of a product: $\Delta(u_n v_n) = u_{n+1} v_{n+1} - u_n v_n$
 $= u_n (v_{n+1} - v_n) + (u_{n+1} - u_n) v_{n+1}$ (*)

Comparing this result with the formula for the derivative of a product uv , we see that $d(uv) = u dv + v du$. In the difference formula the second term contains v_{n+1} rather than v_n , which is different from the differential formula

Difference of a exponent: $\Delta(ca^x) = ca^{x+h} - ca^x = ca^x (a^h - 1)$
 $= c(a^h - 1)a^x$

By induction $\Delta^t(ca^x) = c(a^h - 1)^t a^x$. For the exact differential $d(a^x) = a^x \ln a$ which is very different from the difference formula

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So, If I apply If I look at the difference of a product, So, I have a product u, n, v, n I have a product u n v n and I am operating on that with a difference operator. So, by definition this Is going to be u n this thing evaluated at n plus 1 minus this thing evaluated at n, So, that Is going to be u n plus 1 v n plus 1 minus u n v n.

So, I can write this as u n v n plus 1 minus v n plus u n plus 1 minus u n v n plus 1 you can see that the only terms that are going to survive are going to be u n plus 1, v n plus 1 and u n v n this term u n v n plus 1 and u n and u n v n plus 1 they are going to cancel out because, they are going to negate each other. So, I can write It like that so let us compare

this result with the formula for the derivative of a product $u v$ derivative of a product $u v$
 $d u v$ Is equal to $u d v$ plus $v d u$.

Now, look at this If we think of this as Δv as Δv , So, I have $u \Delta v$ plus, If I think of
this as $\Delta u \Delta v$ operating on $u^n \Delta u^n$ and this has Δv^n , So, I get $\Delta u^n v^n$ plus 1
which Is very different we have $d u v$ Is equal to $u d v$, So, this term Is similar then you
have u^n plus 1 u^n you can think of that Is $d u$ analogous to $d u$ that then here It should
have been v^n but, It Is actually v^n plus 1. So that, Is that is the difference.

So, In the difference operator formula the second term contains v^n plus one rather than v^n
 n which Is different from the differential formula this tells us that this operation Is not
exactly equal to the derivative this difference operation Is not exactly equal to the
derivative It will become close to the derivative when my n plus one Is very close to n
when my v^n plus 1 is very close to v^n when my step size is small but, It is not exactly
equal to the derivative, So that, is the point I want to emphasis friends next let next look
at let us look at the difference of an exponent.

So, $\Delta c a$ to the power x , If I evaluate that So, by definition that Is equal to the function
evaluated at x plus h minus the function evaluated at x So, that is equal to $c a x$ to the
power x plus h minus $c a$ to the power x , I pull out $c a x$ I get a to the power h minus 1 I
can write this as $c a^{h-1}$ Into a to the power x , by Induction If I operate on this k
times with the difference operator I can show that this becomes $c a^{h-1}$ to the
power k times $a x$. Now, see what you would get, If I used exact differentiation $d a$ to the
power x would have given me $a x \ln a$ which Is very different from the difference
formula, which we calculated here which is very different from you can see that
difference operators and differential operators are not really Identical, even for very
simple operations most elementary derivatives here also the difference operator Is giving
something which Is not really the same as the as the differential operator.

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Common differentiation operations

Next we consider the result obtained when a difference operator is applied to the members of a sequence $(w_0, w_1, w_2, \dots, w_n)$ and the result is summed:

$$(w_1 - w_0) + (w_2 - w_1) + (w_3 - w_2) + \dots + (w_n - w_{n-1}) = w_n - w_0$$

But the left hand side = $\sum_{n=0}^{N-1} \Delta w_n$. Hence $\sum_{n=0}^{N-1} \Delta w_n = w_n - w_0$

If $w_n = u_n v_n$ then $\sum_{n=0}^{N-1} \Delta(u_n v_n) = u_N v_N - u_0 v_0$

From (*) $\Delta(u_n v_n) = u_n(v_{n+1} - v_n) + (u_{n+1} - u_n)v_{n+1} = u_n \Delta v_n + \Delta u_n v_{n+1}$

Hence, $\sum_{n=0}^{N-1} \Delta(u_n v_n) = \sum_{n=0}^{N-1} u_n \Delta v_n + \sum_{n=0}^{N-1} \Delta u_n v_{n+1} = u_N v_N - u_0 v_0$

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Next we consider the result obtained when a difference operator is applied to the members of a sequence $w_0, w_1, w_2, \dots, w_n$ and there should be, there it is, it means w_3, w_4, \dots, w_n sorry I missed the ellipsis and the result is sum, So, If I operate or with a difference operator on this sequence. If I operate on the first term I am going to get Δw_0 which is going to give me $w_1 - w_0$ plus and then I am adding the result and the result is sum then I operate with a difference operator on w_1 , I get $w_2 - w_1$ operate with a difference operator on w_2 I get $w_3 - w_2$ and so on and so forth $w_n - w_{n-1}$ I get this and you can see that If I add them together I am left with $w_n - w_0$ but, the left hand side is nothing but, $\sum_{n=0}^{N-1} \Delta w_n = w_n - w_0$ why because, this Δw_0 which is this term plus Δw_1 which is that term and then Δw_{n-1} which is this term which is this actually should be small n this should be small n which is that term.

So, the left hand side is actually this and the hand side is $w_n - w_0$. Now, we assume that w_n is actually given by the product of 2 terms $u_n v_n$ so each term in the sequence w_0 is given by the product of $u_n v_n$. So, w_0 is equal to $u_0 v_0$, w_1 equal to $u_1 v_1$ and so on and so forth. So, w_n so let us assume that w_n is equal to $u_n v_n$ then what do I get the left hand side become $\sum_{n=0}^{N-1} \Delta(u_n v_n)$ and that must be that by definition that by no so that is equal to $w_n - w_0$ is equal to $u_n v_n - u_0 v_0$ equal to $u_n v_n$ but, by definition $\Delta(u_n v_n)$ is equal to not by definition but, just from my previous result which used the definition.

Let us look at the previous result. That is this $\sum_{n=0}^{N-1} u_n \Delta v_n$ is equal to $u_N v_N - u_0 v_0 - \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$. So, that is that $\sum_{n=0}^{N-1} u_n \Delta v_n + \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$ is equal to $u_N v_N - u_0 v_0$. So, we can write $\sum_{n=0}^{N-1} u_n \Delta v_n = u_N v_N - u_0 v_0 - \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$. So I am just taking the summation and then I am replacing this by that $\sum_{n=0}^{N-1} u_n \Delta v_n + \sum_{n=0}^{N-1} \Delta u_n v_{n+1} = u_N v_N - u_0 v_0$ and I know that this must be equal to this $\sum_{n=0}^{N-1} u_n \Delta v_n + \sum_{n=0}^{N-1} \Delta u_n v_{n+1} = u_N v_N - u_0 v_0$. Now, I am going to collect terms from the above we get $\sum_{n=0}^{N-1} u_n \Delta v_n$ this term is equal to $u_N v_N - u_0 v_0 - \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$ and then I bring this term to the minus $\sum_{n=0}^{N-1} \Delta u_n v_{n+1} = u_N v_N - u_0 v_0 - \sum_{n=0}^{N-1} u_n \Delta v_n$.

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Summation by parts

From the above we get a summation by parts formula involving differences (similar to integration by parts):

$$\sum_{n=0}^{N-1} u_n \Delta v_n = (u_N v_N - u_0 v_0) - \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$$

Compare this with the rule for integration by parts:

$$\int_a^b u dv = uv \Big|_a^b - \int_a^b v du$$

Next we introduce a result which formally establishes the relationship between the difference and derivative operator:

$\Delta^k f(x) = h^k f^{(k)}(\xi)$ where $\xi \in [x, x+h]$ assuming that all the derivatives of f upto order k are continuous" (+)

So, I just brought 1 term to the and I get this thing, So, $\sum_{n=0}^{N-1} u_n \Delta v_n$ is equal to $u_N v_N - u_0 v_0 - \sum_{n=0}^{N-1} \Delta u_n v_{n+1}$ compare this with the Integration by parts. So, as I Integrate $\int_a^b u dv$ within the limits a b then the Integration by parts rule tells me that this is uv evaluated at v n a difference between b and a minus $\int_a^b v du$ look at this is very similar, So, this is $\sum_{n=0}^{N-1} u_n \Delta v_n$ If you think of Δ as d , So, $\sum_{n=0}^{N-1} u_n \Delta v_n = \int_a^b u dv$ is equal to uv evaluated at the other end of the Integral minus uv evaluated at the first at the first point In the Interval minus $\int_a^b v du$.

Very similar except for that difference that is v n $plus 1$ and here I have v , So, If It had to be exactly analogous this should have been v n , this should have been v n but, It Is similar, So, next we Introduce a result which formally establishes the relationship

between the difference and the differential operator and the derivative operator, so what is that result. That result says tells me that if I operate on the function f of x k times with the difference operator then I get h to the power k h being the size of my step size times the function f the k th derivative of the function f but, that k th derivative is not evaluated at x It is evaluated at x_i which is very important.

It tells me that If I operate on the function f k times I am going to get something very similar to that k th derivative of f I am going to get something very similar to the k th derivative of f but, the k th derivative of f not evaluated at x the point at which I am taking the difference but, at some other point x_i and how what is the range of x_i what is x_i where x_i can be can be any point which belongs to the interval x to x plus $k h$ x_i can be any point which belongs to the interval x plus $k h$. Of course, this assumes that the k th derivative exists. So, that the function is k derivatives up to order continuous derivatives up to order k .

So, this is very important It tells me that well, If you take k differences you are going to get something like the k th derivative but, not at the same point It is evaluated at a point which is shifted which may be shifted from the original point and the extent of the shift is of course, going to depend on the your step size, It is going to depend first on the step size and also in the order of the derivative the higher the order.

If I take the same step size and I look at higher and higher differences so the shift the range of the shift becomes larger because, It is getting multiplied by k so for the first derivative the point the exact that the derivative is will be evaluated at will belong to any interval between x and x plus h , for the second derivative It is can belong to any interval between x and x plus $2 h$. So, as you take more and more derivatives the range becomes larger.

But, If you reduce the step size again the range becomes smaller, So, as you increase the derivative the range becomes larger as you reduce the step size the range becomes smaller, So, for k equal to 1 this means that $\Delta f(x)$ is equal to h of f' of x_i . Let us go back and take a look so $\Delta f(x)$ $\Delta f(x)$ is equal to h times f' where the first derivative of f evaluated x_i . So, It is not equal to $h f(x)$ that is very important.

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Derivative and difference

For $k=1$ this means:

$$\Delta f(x) = hf'(\xi) \text{ But } \Delta f(x) = f(x+h) - f(x)$$

Thus we have $f(x+h) - f(x) = hf'(\xi)$ which is just the mean value theorem

To prove the result for $k=2$ we use Taylor's formula to expand $f(a+h)$ and $f(a-h)$:

$$f(a+h) = f(a) + hf'(a) + \frac{1}{2}h^2 f''(\xi_1) \dots (*)$$

$$f(a-h) = f(a) - hf'(a) + \frac{1}{2}h^2 f''(\xi_2) \dots (**)$$

$a < \xi_1 < a+h, a-h < \xi_2 < a$

$f(a) = x+h, x+h \leq \xi_1 \leq x+2h, x \leq \xi_2 \leq x+h$

Combining the two bounds we have: $x \leq \xi_1 \leq x+2h$

But, recall the delta $f(x)$ is equal to $f(x+h) - f(x)$ therefore, we have $f(x+h) - f(x) = hf'(\xi)$ and I know that ξ must belong to the interval x to $x+h$ which is nothing but, my mean value theorem which is nothing but, my mean value theorem. So, to prove the result for $k=2$ we use Taylor's formula to expand $f(a+h)$ and $f(a-h)$ and we will define a in terms of x later on but, for the time being let us look at $f(a+h)$ and $f(a-h)$. If I use Taylor's formula on $f(a+h)$ I get $f(a) + hf'(a) + \frac{1}{2}h^2 f''(\xi_1) + \dots$ this remained term whether ξ_1 belongs to the interval a and $a+h$ because, I am evaluating it about ξ_1 belongs to the interval a to $a+h$ and let us look at $f(a-h)$ it is equal to this term plus, this term and ξ_2 must belong to the interval $a-h$ to a .

So, we have ξ_1 belonging to a and $a+h$ and ξ_2 belonging to $a-h$ to a . Now, if I define a is equal to $x+h$ then I get ξ_1 is lesser than or equal to a which is equal to $x+h$ lesser than or equal to $a+h$ which is equal to $x+2h$ similarly, ξ_2 is greater than $a-h$ $a-h$ is nothing but, x and ξ_2 is less than a which is equal to $x+h$. So, this tells me that ξ_1 must lie in this range ξ_2 lies in this range. If I combine these 2 bounds what do I get for ξ_1 as well as ξ_2 so if I do this makes a statement about ξ_1 about the bounds in ξ_1 this makes a statement about the bounds in ξ_2 . If I want to make a combined statement on bound; So, I want to calculate bounds on

both ξ_1 and ξ_2 , So, I take the lowest value which is x and the highest value which is $x + 2h$, So, both ξ_1 and ξ_2 must lie between x and $x + 2h$.

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Derivative and difference

Next adding (*) and (**) we get:

$$f(a+h) - 2f(a) + f(a-h) = \frac{1}{2}h^2 [f''(\xi_1) + f''(\xi_2)]$$

Since $f''(\xi)$ is continuous the mean of $f''(\xi_1)$ and $f''(\xi_2)$ must be equal to the value of f'' evaluated at some point between ξ_1 and ξ_2 i.e. $\xi \in [x, x+2h] = [a-h, a+h]$

Recall also $f(a+h) - 2f(a) + f(a-h) = \Delta^2 f(a-h) = \Delta^2 f(x)$

Therefore we have:

$$\Delta^2 f(x) = h^2 f''(\xi) \quad \xi \in [x, x+2h]$$

Similar proofs can be obtained for $k > 2$

So, then that what do we do? We add these two. So, I add these two I add these 2 so I get $f(a+h) + f(a-h) - 2f(a)$ then I get $f(a+h) + f(a-h) - 2f(a)$ that gives me $2f(a)$ this term cancels out. So, I have $f(a+h) + f(a-h) - 2f(a)$ as if I bring that to the left hand side. That is this and that is equal to $\frac{1}{2}h^2 [f''(\xi_1) + f''(\xi_2)]$. So, that is equal to this plus this $\frac{1}{2}h^2 f''(\xi_1) + \frac{1}{2}h^2 f''(\xi_2)$.

So, I have that term. Now, since $f''(\xi)$ is continuous f'' is a continuous function. So, the mean of $f''(\xi_1)$ and $f''(\xi_2)$ must be equal to the value of f'' evaluated at some point between ξ_1 and ξ_2 ; so f'' evaluated at some point between ξ_1 and ξ_2 and therefore, ξ must belong to the Interval. This as we know that both ξ_1 and ξ_2 belongs to this interval so the ξ must belong to the Interval. So, If the function ξ which is equal to the mean of these 2 the function I mean $f''(\xi)$ is the mean of this function that ξ must lie also In this interval is that clear that ξ must also lie In that Interval.

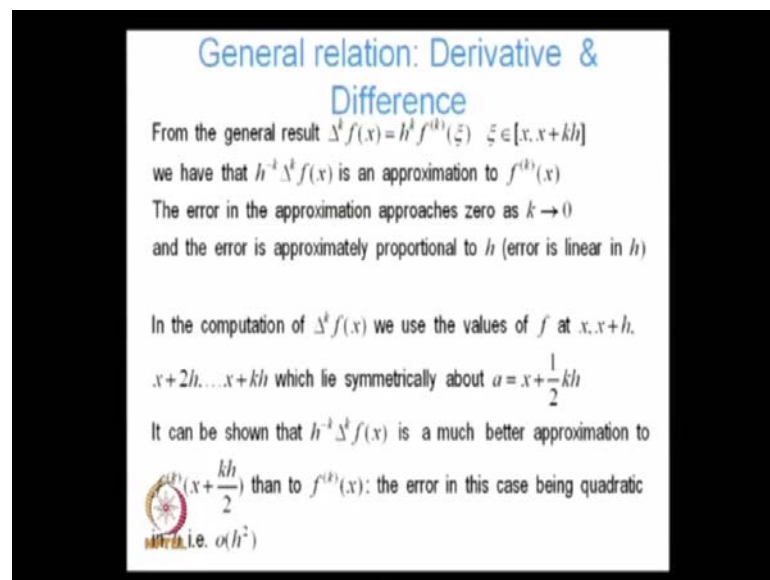
So, and this Interval again I am expressing In terms of a and h taking keeping in mind that x is equal to $a+h$, a is equal to $x-h$. So that, gives me $a-h$ and $a+h$ so ξ must belong to $a-h$ and $a+h$ recall also that $f(a+h) - 2f(a) + f(a-h) = \Delta^2 f(x)$

minus h is equal to $\Delta^2 f(x-h)$. We saw that before and where we saw it that we saw it sometime here, $\Delta^2 f(x-h)$ is equal to $f(x+h) - 2f(x) + f(x-h)$.

So, $f(x+h)$ this is equal to $\Delta^2 f(x-h)$ and $f(x-h)$ is equal to x , So, that is equal to $\Delta^2 f(x)$, So, what do I get finally, I get $\Delta^2 f(x)$ is equal to $h^2 f''(\xi)$ where $f''(\xi)$ is the mean of $f''(x-h)$ and $f''(x+h)$ and I know that ξ belongs to the interval $x-h$ to $x+h$. So, again we are getting a proof for $k=2$. Recall our original general expression.

$\Delta^k f(x)$ is equal to $h^k f^{(k)}(\xi)$, So, for $k=2$ also we have shown that this is true. So, $\Delta^2 f(x)$ is equal to $h^2 f''(\xi)$ where ξ again belongs to the interval $x-h$ to $x+h$ remember the interval, we said was $x-h$ to $x+h$. Now it is exactly x because, we are looking at the second difference. Similar proofs can be obtained for $k > 2$, so k this is the relation between the difference operator and the differential operator. So, It is equal to the difference of the result of the difference operation but, evaluated at a point which is not exactly at the same point.

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So, from the general result $\Delta^k f(x)$ is equal to $h^k f^{(k)}(\xi)$. ξ belongs to $x-h$ to $x+h$ we have that $h^{-k} \Delta^k f(x)$ is an approximation to $f^{(k)}(x)$ why is it an approximation; because, it is not evaluated at x . It is evaluated at ξ that is if it is not exact because, of this. So, It is just an approximation to $f^{(k)}(x)$ and the

approximation will be as good as the Interval as the Interval becomes smaller the approximation is going to become better and better, So, If x is very close to $x + kh$. Well, your derivative and differential operator are going to be close, If not they are going to be wrong or there will be errors and the error you can see is approximately proportional to the step size because, the error is like kh . So, it is proportional to the step size, So, It Is linear In h it is linear In h .

One more thing In the computation of $\Delta^k f(x)$, we use the values of f at $x + h$, $x + 2h$ up to $x + kh$ and you will note that these values this $x + h$, $x + 2h$, $x + kh$ lie symmetrically about $x + \frac{1}{2}kh$, So, all the, all the function values that I am evaluating at these different points they are symmetrical about $x + \frac{1}{2}kh$, the points at which I am evaluating the function are symmetrical about $x + \frac{1}{2}kh$; Now, it can be shown that $h^k \Delta^k f(x)$ is actually a much better approximation to $f^{(k)}$ evaluated at $x + \frac{1}{2}kh$ rather than at 1 end of the Interval at x , So, this operation this operation which I got after operating on $f^{(k)}$ times with the difference operator and If I divide that by the step size raise to the power k .

I know that is an approximation to the derivative evaluated at x and the error we know depends on this step size but, actually It is much closer that it is less of an approximation If I evaluate the If I look at the point $x + \frac{1}{2}kh$, It Is less of an approximation If I look at the point $x + \frac{1}{2}kh$ rather than looking at the point x .

So, I have the center of the Interval, If at the center of the Interval the difference the k th difference is much closer to the derivative than at the end of the Interval the derivative being evaluated at the center point, derivative being evaluated at the end. So, again let me repeat so If I look at the k th difference and I look at the derivative evaluated at the end of the Interval and I look at the derivative evaluated at the midpoint of the Interval the k th difference is much closer to the exact derivative of the function evaluated at the midpoint of the Interval rather than at 1 end of the Interval.

So, that is because, It turns out that the error in this case Instead of being linear with the step size is actually quadratic with the step size If I am evaluating it at the midpoint. So, the midpoint gives the difference is much closer to the derivative at the midpoint than at 1 end of the Interval.

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Improved accuracy at half step

This can be seen from the following example. Suppose

$$f(x) = e^x. \text{ With a step size } h = 1, h^{-1}\Delta f(0) = \frac{f(1) - f(0)}{h}$$
$$= \frac{e^1 - e^0}{1} = 1.05171. \text{ The actual value of the derivative of } f(x) \text{ at}$$

$x = 0$ is of course 1.0. At $x = 0.5$ (i.e. at $\frac{h}{2}$) the actual value of the derivative is $e^{0.5} = 1.05127$. Thus it is clear that $h^{-1}\Delta f(0)$ is a much better approximation to the actual derivative at $x = 0.5$ than at $x = 0$. This holds true for higher order differences and derivatives as well.

The difference operator Δ that we have so far talked about is actually the "forward difference operator".

So, we let us look at little example and show what whether this is true. So, In the example, we look at is the exponential function f of x is equal to E to the power x and suppose, we are going to evaluate differences with the step size of h Is equal to point 1 then if I look at Δf , Δf is going to be f evaluated at plus h minus f evaluated at and h Is point 1. So, f evaluated at point 1 minus f evaluated at divided by my step size h which is point 1; So, that is going to be E to the power point 1 minus E to the power divided by point 1 which is going to be 1 point, 5, 7, 1. How, closes then we want to look at how close this value is to the derivative of f evaluated at well, the derivative of f evaluated at is 1 derivative of E to power x is x .

So, the derivative of f evaluated at is 1, So, it is quite different I mean, It is not quite its 5 percent all; So, It is 1 point 5, 1, 7, 1 and here It is 1 but, Instead of evaluating It at if I evaluate the derivative at this should point 5, that is at h by 2 my step size is h ; So, evaluated at midpoint of the step size midpoint of the step size, So, remember for the linear for the first derivative the Interval size is x plus x 2 x plus h , So, I am evaluating it at the midpoint of the Interval my first point is my end point is point 1 I am evaluating it at half, that half, that at the midpoint of that Interval, So, I want evaluate It at point 5.

So, If I evaluate E to the power point 5, If I evaluate the derivative of E to the power x which is the same as E to the power x , if I have if I evaluated It at point 5, I get 1 point 1 5, 1, 2, 7 which is actually much closer to the difference than the derivative at x is equal

to thus. It is clear that h minus h the power minus 1 Δf is a much better approximation to the actual derivative at x is equal to point 5 than at x is equal to it is much better approximation the midpoint of the Interval rather than at the end point.

This holds true for we just showed it for the first difference on the first derivative It holds true for higher order, differences and higher order derivatives as well. Let us take a step back now and the difference operator that we have talked about the delta operator that we have talked about is actually 1 particular difference operator, there are many other difference operators this delta operator. This delta difference operator is known as the forward difference operator. Why is it called the forward difference operator because, delta operating on f at x is equal to $f(x+h)$ minus $f(x)$. So, I have to look forward by 1 step h and then I take the difference at f of x to calculate that difference operator but, there are other difference operators as well, for Instance we have things like the backward difference operator, the central difference operator the average difference operator and things like and all turns out that all these operators are related to each other so let us take a quick look.

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Types of difference operators

Other difference operators include the central difference operator, the average difference operator and the backward difference operator.

The central difference operator, denoted by δ operates on $f(x)$ to yield $f(x+\frac{1}{2}h) - f(x-\frac{1}{2}h)$.

The average difference operator μ operating on $f(x)$ yields,

$$\mu f(x) = \frac{1}{2} [f(x+\frac{1}{2}h) + f(x-\frac{1}{2}h)]$$

The backward difference operator is defined by:

$$\nabla f(x) = f(x) - f(x-h)$$

It is clear that $\Delta f(x-h) = \nabla f(x)$, $\Delta f(x-\frac{1}{2}h) = \delta f(x)$. Similar relationships exist between higher order difference operators as well.

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So, other difference operators include the central difference operator the average difference operator the backward difference this for Instance it we are going to denote by delta. The central the y the central difference operator, So, that is $f(x+\frac{1}{2}h)$, So, delta operating on f of x is equal to $f(x+\frac{1}{2}h)$ minus $f(x-\frac{1}{2}h)$ then there is a

average difference operator μ which operating on f of x yields half f of x plus h plus half f of x minus h , So. at x I look at I take half a step forward I take half a step back evaluate the functions at those locations, I take the average of that and I said that is the result of my average difference operator.

The backward difference operator on the other hand is $f(x) - f(x - h)$ so which I denoted by this nabla sign $f(x)$ is equal to $f(x - h)$. So, I am looking back now Instead of looking forward I am looking at $x - h$ Instead of looking at $x + h$ I am looking at $x - h$ and even by just cursory examination you can see that these difference operators are related to each other for Instance the forward difference operator operating on f evaluated at $x - h$, is equal to the backward difference operator operating on x . And similarly, you can relate the central difference operator to the similar relationships exist between higher order difference operators as well, So, we will continue with our discussion on difference operators in the next lecture.

Thank you.