

Numerical Methods in Civil Engineering
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Lecture - 34
Orthogonal Polynomials-III

In lecture 34 of our series on numerical methods in civil engineering, we will continue with our discussion on orthogonal polynomials and hopefully we will wrap it up and next class, we will move on to something else, which uses orthogonal polynomials.

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Existence of solution for orthogonal basis functions

$$(\phi_0, \phi_0)c_0' + (\phi_1, \phi_0)c_1' + \dots + (\phi_{n-1}, \phi_0)c_{n-1}' = (\phi_0, f)$$

$$(\phi_0, \phi_1)c_0' + (\phi_1, \phi_1)c_1' + \dots + (\phi_{n-1}, \phi_1)c_{n-1}' = (\phi_1, f) \quad (*)$$

.....

$$(\phi_0, \phi_{n-1})c_0' + (\phi_1, \phi_{n-1})c_1' + \dots + (\phi_{n-1}, \phi_{n-1})c_{n-1}' = (\phi_{n-1}, f)$$

This linear system of size $(n-1) \times (n-1)$ for the unknown coefficients $c_0', c_1', \dots, c_{n-1}'$ becomes a diagonal system if the ϕ_j are orthogonal, when all off-diagonal terms vanish. Then the above equations yield the solution $c_j' = \frac{(\phi_j, f)}{(\phi_j, \phi_j)} = \frac{(\phi_j, f)}{\|\phi_j\|^2}$ which exists since $\|\phi_j\|^2 \neq 0$ if $\phi_j \neq 0$

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Last time, we ended our lecture talking about the solutions for orthogonal basis functions where, my polynomials, when I have a series of polynomials and each member of the series is orthogonal to the two other members of that series and we showed that for such a series for such an orthogonal series of polynomials are the solution to the best fit problem always exist. The solution to the best fit problem always exist and recall finding the solution to the best fit problem means, finding these coefficients c star, c star. I goes from 1 to n and we showed that for an orthogonal polynomial the this left hand side, it becomes a diagonal system all the off-diagonal terms cancel each other out because, this polynomials are orthogonal to each other.

So, we have a diagonal system and we can solve that diagonal system, we can invert that diagonal matrix to find these coefficient matrices like this and this is always going to

have a solution, because norm of ϕ_j square is always going to be different for greater than 0. So, in that case, we always get a solution. What about the situation, we end of the lecture talking about linearly independent systems, we did not go into detail but, what about the situation when instead, where, instead of the polynomials being orthogonal to each other, all we know is that, they form a linearly independent basis a set of functions, which are linearly independent but, not necessarily orthogonal in that case are we assure that our solution to the best fit problem exists.

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Existence for Linear independence

If the ϕ_j are not orthogonal but are linearly independent only, even then the solution to the system (*) exists

For the solution of the linear system (*) to exist, the determinant of the coefficient matrix has to be non zero.

If the determinant is zero, then the homogeneous system

$$\sum_{j=0}^{n-1} (\phi_j, \phi_k) c_j = 0 \quad (k=0,1,\dots,n-1) \quad (**)$$

has a non trivial solution i.e. a solution with not all $c_j, j=0,1,\dots,n-1$ equal to zero

But this implies that $\left| \sum_{j=0}^{n-1} c_j^2 \phi_j \right|^2 = \left(\sum_{j=0}^{n-1} c_j^2 \phi_j, \sum_{k=0}^{n-1} c_k^2 \phi_k \right) = \sum_{j=0}^{n-1} \sum_{k=0}^{n-1} (\phi_j, \phi_k) c_j^2 c_k^2$

$$= \sum_{j=0}^{n-1} \sum_{k=0}^{n-1} (\phi_j, \phi_k) c_j^2 c_k^2 = \sum_{k=0}^{n-1} (0) c_k^2 \quad (\text{from } (**)) = 0$$

So, if the ϕ_j is not orthogonal then the solution to the problem also exists and it can be proved like this for the solution of the linear system to exist the determinant of the coefficient matrix has to be non-zero.

That is this coefficient matrix, that determinant has got to be non-zero. So, if the determinant is 0, suppose it is 0, if the requirement has to be non-zero but, suppose that is 0, we will show that, if it is 0 then, we get a result which is not possible, which means that it cannot be 0. So, if the determinant is 0 then, the homogeneous system has a non-trivial solution. So, if the determinant is 0 this thing is equal to 0 then, this system has got a non-trivial solution. So, if this equal to 0, if we try to solve that system, if the determinant is equal to 0 then, we can find values of $c_j, j=0$ to $n-1$ where, not all the c_j 's are 0 and not all the c_j 's are 0. So, has a non-trivial

solution, that is a solution with not all c_j , j is equal to 0, 1 through $n-1$ equal to 0.

So, what does this imply? Let us see what it implies. So, $\sum_{j=0}^{n-1} c_j \phi_j$ if I take the L^2 square norm of that I can represent. It is an inner product $\sum_{j=0}^{n-1} c_j \phi_j$ inner product with $\sum_{k=0}^{n-1} c_k \phi_k$, where I have instead of using j twice, I have replaced j with k in the 2 term in the inner product and then I pull out the summation signs outside, my inner product and I have inner product of ϕ_j times $c_j c_k$ and then, I change the order of the summations. So, this I can write, I replace, I put $\sum_{k=0}^{n-1}$ first. So, I just interchange the order of the summations and I get this and then, I look at this term the $\sum_{j=0}^{n-1} \phi_j \phi_k c_j$.

I look at these two, I look at the summation involving these two and this t has got to be equal to 0, because that was our assumption, that is the determinant is 0 then, the homogeneous system has a non-trivial solution and the homogeneous system is just this. So, if this is equal to 0 then, I have $\sum_{k=0}^{n-1} c_k$ which is got to be equal to 0. So, I have this equal to 0. So, what does that mean?

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The slide is titled "Existence for linear independence". It contains the following text and equations:

But $\left\| \sum_{j=0}^{n-1} c_j \phi_j \right\|^2 = 0 \Rightarrow \sum_{j=0}^{n-1} c_j \phi_j = 0$

We know that c_j are not all equal to zero. Then $\sum_{j=0}^{n-1} c_j \phi_j = 0$ implies that ϕ_j are not linearly independent.

Thus for the solution not to exist, i.e. for the determinant of the coefficient matrix to be zero, the ϕ_j have to be linearly dependent.

Hence for ϕ_j linearly independent, the solution always exists.

Going back to the case of the orthogonal system, recall that the following expression for the coefficients c_j was obtained:

$$c_j = \frac{(\phi_j, f)}{(\phi_j, \phi_j)}$$

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That means, that $\sum_{j=0}^{n-1} c_j \phi_j$ equal to 0, because Inner product of this with itself is equal to 0 therefore, this itself must be equal to 0. So, then this is equal to 0 but, we know that all the c_j stars are not equal to 0, why because, my

homogeneous system has a non-trivial solution. So, all the c_j 's are not equal to 0 and now I am showing that $\sum_{j=0}^{n-1} c_j \phi_j$ is equal to 0, what does that mean. That is impossible, if all my ϕ_j 's are linearly independent. If this is satisfied as well as the fact that not all my c_j 's are equal to 0 is true, then not all the ϕ_j 's are linearly independent. The ϕ_j 's are not linearly independent. Thus, for the solution not to exist that is for the determinant of the coefficient matrix to be 0 in which, case only we get a non-trivial solution to the homogeneous system. The ϕ_j 's having to be linearly dependent, hence for ϕ_j linearly independent, the solution always exists.

For, why does the solution always exist, because the determinant cannot be equal to 0 we saw that, if the determinant is equal to 0, we get a result which implies that, they are not linearly independent. So, if they are not linearly independent determinant cannot be 0 and a solution has to exist. So, let us go back to the case of the orthogonal system and recall that, this was the expression we obtained for the coefficient c_j which we just saw couple of slides back and let us look at it closely again.

So, c_j is equal to inner product of ϕ_j comma f divided by inner product of ϕ_j comma ϕ_j . So, what does that mean? that means each of the coefficient c_j are do not depend only on quantities with index j and of course, on the function f they do not depend on other polynomials, they do not depend c_j does not depend on ϕ_k where, $k \neq j$ c_j , just depends on ϕ_j , it is just depends on the coefficient for the polynomial ϕ_j in the orthogonal expansion, just depends on the polynomial ϕ_j , it does not depend on ϕ_{j+1} or ϕ_{j-1} or any other polynomial. What does that mean?

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Independent coefficients

This implies that the coefficient for ϕ_j is independent of all the other $\phi_k, k = 0, 1, \dots, n-1, k \neq j$

This is extremely advantageous because it implies that one can increase the number of basis functions without having to recalculate the coefficients of the previous ones.

In fact, every continuous function can be associated with an orthogonal expansion which is an infinite series approximation to f in terms of the basis functions

$$\sum_{j=0}^{\infty} \tilde{c}_j \phi_j, \quad \tilde{c}_j = \frac{(f, \phi_j)}{(\phi_j, \phi_j)}, \quad f \approx \sum_{j=0}^{\infty} \tilde{c}_j \phi_j$$

For particular choices of orthogonal functions the series converges to f for most functions

That means that, these coefficients are independent of other ϕ_j 's and this is extremely advantageous, because it implies that, one can increase the number of basic functions without having to recalculate. The coefficients of the previous one suppose, I do an orthogonal expansion up to 5 members of the series and then, I find the error is still not sufficiently small, I need to reduce the error further and I know that, my series is convergent. We are going to talk about convergence slightly later but, if I know my series are convergent then, if I add more terms to that series I am certain, that I am going to get closer to the solution. So, I add more terms to that series and if I add more terms to that series. I need to evaluate those coefficients c_j for those additional terms but, when I evaluate the new coefficient c_j , I am assure that, I do not have to recalculate the coefficients of the polynomials, which I am already using, which makes it good, which makes it efficient.

So, in fact every continuous function can be associated with an orthogonal expansion which is at infinite series approximation to f in terms of the basic functions up till now, we have just taken a finite number of basic functions but, it is an every an any orthogonal series, we can take an infinite series is finite, because the function space is actually infinite-dimensional. So, the infinite-dimensional function space is going to have infinite number of basic functions orthogonal to each other. So, suppose we take such an expansion $c_j \star \phi_j$ and we evaluate this $c_j \star$ like this and we say f is approximately equal to $\sum_{j=0}^{\infty} c_j \star \phi_j$.

For most functions, it can be shown that, this orthogonal function, the series representation is convergent. It is going to if we take a sufficiently large number of terms, it is going to converge to f well, I said for most functions it should be obvious to give that, it cannot be true for all functions, what sort of functions will not even if I take an infinite number of terms in the series as still would not converge to the function, there are certain functions like that for instance functions, which have singularities, you cannot expect suppose, I have a delta function what even if I take an infinite number of terms in my series I am not going to converge to a delta function. So, given that my function is well behaved by well behaved I mean it possess sufficient degree of smoothness sufficiently high continuity requirements I can find a convergent infinite series to that comprising of orthogonal basis functions.

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Convergence

To look at convergence more closely we consider $f^* = \sum_{j=0}^{n-1} c_j \phi_j$

which is the best approximation to f

$$\|f - f^*\|^2 = (f - f, f - f) = (f - f, f) - (f - f, f^*)$$

Recall, $(f - f^*)$ is orthogonal to all $\phi_j, 0 \leq j \leq n-1$

Since f^* is a linear combination of ϕ_j 's, $(f - f^*)$ must be orthogonal to $\sum_{j=0}^{n-1} c_j \phi_j = f^*$. Hence $(f - f^*, f^*) = 0$

Therefore $\|f - f^*\|^2 = -(f - f^*, f) = -(f^*, f) + (f, f)$

$$= \|f\|^2 - (f^*, f) = \|f\|^2 - (f^*, f + f - f^*)$$

$$= \|f\|^2 - (f^*, f) - \underbrace{(f^*, f - f^*)}_0 = \|f\|^2 - \|f^*\|^2 = \|f\|^2 - \sum_{j=0}^{n-1} (c_j)^2 \|\phi_j\|^2 \quad (*)$$

So, to look at convergence more closely, let us consider f^* which is my best approximation to f which is my best approximation to f and let us look at the norm of the error the L two norm of the error f^* minus f norm of square, which I can represent as the product of as an f^* minus f , this I can rewrite as f^* minus f inner product with f^* minus, f^* minus f inner product with f . so, I just split it up.

The count of the linearity of the inner product, I instead of writing f^* minus f here, I wrote as I split it up to f^* minus f here and let us recall that f^* minus f is orthogonal to all of ϕ_j why, because f^* is my best approximation and the best, if it

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Parseval's formula

This leads to the conclusion that $\sum_{j=0}^{n-1} (c_j')^2 \|\phi_j\|^2 = \|f\|^2 - \|f - f_n\|^2$ and hence $\sum_{j=0}^{\infty} (c_j')^2 \|\phi_j\|^2 \leq \|f\|^2$ when an infinite number of basis functions are considered. The above result is known as Bessel's inequality. If an infinite series is bounded it has to be convergent. Since $\sum_{j=0}^{\infty} (c_j')^2 \|\phi_j\|^2$ is bounded by $\|f\|^2$ it must therefore be convergent. From (*) it is clear that if $\|f - f_n\| \rightarrow 0$ as $n \rightarrow \infty$ then $\sum_{j=0}^{\infty} (c_j')^2 \|\phi_j\|^2 = \|f\|^2$.

The above result is known as Parseval's formula

Next we again consider the discrete case where the orthogonal functions are defined on a grid of size $m+1$ comprising points x_0, x_1, \dots, x_m .

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So, this is very important because, it tells us that sigma j equal to 0 to n minus 1 c j star norm of phi square is equal to norm of f square minus norm of f star square. So, this is equal to norm of f square minus norm of f star square, is that clear? So, I have that. So, what does this means that, this is always less than norm of f square. So, the best approximation is always lesser than or equal to norm of f square. So, this is true for n minus 1 is also going to be true, if a when you have infinity.

So, c j star square norm of phi j square is going to be lesser than or equal to norm of f square, when an infinite number of basic functions are considered and this above result is known as Bessel's inequality this is known as Bessel's inequality. So, this is an infinite series you can see this is an infinite series and it says that, this is lesser than or equal to norm of f square. So, when infinite series is bounded if an infinite series is bounded, it is always got to be convergent. It is convergent and since sigma c j square norm of phi j square is bounded by norm of f square. It must be therefore, be convergent and from this, is that clear? In that case, what are we going to get that norm of f star minus f is going to 0 as n goes to infinity. In that case, this is going to be equal to that, if this is going to be equal to that.

That means, this thing is going to be equal to 0 therefore, norm of f star minus f is going to go to 0 as n goes to infinity. And this result is known as Parseval's formula. So, this was about the continuous case, when I had these phi j's defined, when these phi j's are

basically continuous functions in the interval, in the domain, in which they are defined, they are continuous functions in the domain. However, let us now look at the case when, we have orthogonal functions, which are non continuous that is the discrete case, when these orthogonal functions are defined on a grid of size $m + 1$ comprising points x_0, x_1 through x_m can we say anything similarly, interesting in that case.

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Discrete Case

It was seen earlier that at most $m+1$ linearly independent basis functions $\phi_j, j=0,1,\dots,m$ can be constructed on this grid.

If we wish to determine the coefficients $c_j, j=0,1,\dots,m$ such that $\sum_{j=0}^m c_j \phi_j$ is equal to the given function values at every grid point, then we have to solve the following system to find the c_j 's

$$c_0 \phi_0(x_0) + c_1 \phi_1(x_0) + \dots + c_m \phi_m(x_0) = f_0$$

$$c_0 \phi_0(x_1) + c_1 \phi_1(x_1) + \dots + c_m \phi_m(x_1) = f_1$$

.....

$$c_0 \phi_0(x_m) + c_1 \phi_1(x_m) + \dots + c_m \phi_m(x_m) = f_m$$

There are $m+1$ equations and $m+1$ unknowns.

It was seen earlier, that in case we have a grid with $m + 1$ points then, we have at most $m + 1$ linearly independent basis functions ϕ_j, j is equal to $0, 1$ through m in that case, there is no possibility of having infinite number of basic functions because, we have a finite number of grid points and on a finite number of grid points. We have seen earlier that, we can have at best the same number of independent basis functions, same number of independent basis functions.

o, if we wish to determine the coefficient c_j, j is equal to 0 through 1 to m such that $\sum_{j=0}^m c_j \phi_j$ is equal to the function values at every grid point then, we know that, we have to solve the following system of equations to find the c_j 's basically, I say that at each grid point my series must give me the function value. So, at x_0 this is going to be $c_0 \phi_0(x_0) + c_1 \phi_1(x_0) + \dots + c_m \phi_m(x_0) = f_0$. Similarly, at x_1 it has to satisfy that condition and at x_m , it has to satisfy that condition. So, we are interested in finding

the $m + 1$ coefficient c . So, there are $m + 1$ unknown and there are $m + 1$ equation, but this coefficient matrix.

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Uniqueness for Discrete Case

Since $\phi_0, \phi_1, \dots, \phi_m$ are linearly independent on the grid, the matrix

$$\begin{bmatrix} \phi_0(x_0) & \phi_1(x_0) & \dots & \phi_m(x_0) \\ \phi_0(x_1) & \phi_1(x_1) & \dots & \phi_m(x_1) \\ \dots & \dots & \dots & \dots \\ \phi_0(x_n) & \phi_1(x_n) & \dots & \phi_m(x_n) \end{bmatrix}$$

has full rank and can be inverted.

Thus unique solutions c_0, c_1, \dots, c_m exist

If the $\phi_0, \phi_1, \dots, \phi_m$ are orthogonal, the coefficients c_j can be obtained as shown before, with the inner products evaluated at the grid points

$$c_j = \frac{\sum_{i=0}^n f(x_i) \phi_j(x_i)}{\sum_{i=0}^n \phi_i(x_i) \phi_j(x_i)}$$

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So, then my coefficient matrix is $\phi_0 \times 0 \phi_1 \times 0, \phi_m \times 0, \phi_0 \times 1$ through $\phi_m \times 1$. So that is my coefficient matrix, we know that coefficient matrix if it is linearly independent. In that case we are going to get solutions. We are going to get unique solutions for my coefficients c_0 through c_m and we know that coefficient matrix is going to be non-singular why because, it has got full rank why does it have full rank because, all my vectors $\phi_0 \phi_1$ through ϕ_m are linearly independent. It has got full rank and can be inverted and therefore, you have, I have unique solutions $c_0 c_1$ through c_m .

So that is in case, it is linearly independent in case, it is orthogonal that, we can obtain the coefficients in a very similar manner to the way we obtained the coefficients for the continuous case and instead of having an inner product. I just have a sum in the instead of having a inner product in the numerator and inner product in the denominator. I just have a sum in the numerator and a sum in the denominator and that sum is over the grid points. So, I have f at evaluated at the grid points, my function value are evaluated at the grid points divide that by this sum, I get my coefficients.

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General recursion formula

While considering Chebyshev polynomials it was seen that Chebyshev polynomials of higher order could be generated from Chebyshev polynomials of lower order by using a recursion formula:

$$T_{n+1}(x) = 2xT_n(x) - T_{n-1}(x) \quad n \geq 1$$

This is true for orthogonal polynomials in general. For $n \geq 1$ all families of orthogonal polynomials satisfy a three term recursion formula which allows a new member of the family, $\phi_{n+1}(x)$ to be generated from existing members $\phi_n(x)$ and $\phi_{n-1}(x)$.

The recursion formula enables $\phi_{n+1}(x)$ to be determined uniquely, up to an arbitrary constant α_n which relates the leading coefficient of $\phi_{n+1}(x)$, γ_{n+1} to the leading coefficient of $\phi_n(x)$, γ_n .

The recursion relation can be obtained by induction.

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So, when we were, that is enough about finding the coefficients for an orthogonal system. Now, we are going to talk about the Recursion formula. Recursion formula is very useful because, if some of these as you can see some of these polynomials they may be complicated. So, they may have complicated coefficients, they may be higher powers of x it is very complicated coefficients which are not, which can be basically any real numbers. So, it is not possible for us to remember them but, if we have a Recursion formula as we said in case of the Chebyshev polynomials, where if we know some terms in the series it is possible for us to generate other terms in the series.

We saw that, for the Chebyshev polynomials if we know the first 2 terms in the Chebyshev polynomials, we can generate all the terms in the Chebyshev polynomials all the higher order Chebyshev polynomials are using the Recursion formula. It turns out that for all orthogonal polynomials, it is possible to get write a Recursion formula and that Recursion formula has a standard form, the form is the same for all orthogonal polynomials, whether they may be Legendre polynomials, Gram polynomials, any polynomials, any set of orthogonal polynomials if we know the first two terms in that series, it is possible for us to generate the other terms in that series and that is because, they have a general Recursion formula for n greater than or equal to 1, all families of orthogonal polynomials satisfy a 3 term Recursion formula, which allows a new member of the family $\phi_{n+1}(x)$ to be generated from existing members $\phi_n(x)$ and $\phi_{n-1}(x)$.

The Recursion formula enables $\phi_{n+1}(x)$ to be determined uniquely, that is up to an arbitrary constant α_n , we know it up to an arbitrary constant, which relates the leading and that arbitrary constant relates the leading coefficient of $\phi_{n+1}(x)$, which is going to involve a term x to the power $n+1$, it relates that to the leading coefficient of $\phi_n(x)$. So, I am calling the leading coefficient of $\phi_{n+1}(x)$ γ_{n+1} and we can obtain the Recursion relationship by induction. So, let us quickly look at that. So, suppose we know the polynomials up to order j in an orthogonal series, we know the polynomials up to order j . So, I know ϕ_0, ϕ_1, ϕ_2 up to ϕ_j and I am interested in finding the next higher order member of that series or suppose, I said n suppose I know up to n .

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Splitting into two parts

Suppose the polynomials up to order n have already been constructed
i.e. $\phi_j, 0 \leq j \leq n, \phi_j \neq 0$ exist

We want to construct ϕ_{n+1} such that ϕ_{n+1} is orthogonal to $\phi_0, \phi_1, \dots, \phi_n$ and
 $\gamma_{n+1} = \alpha_n \gamma_n$

Since $\phi_j, 0 \leq j \leq n$ form a basis for the $(n+1)$ dimensional subspace of the infinite dimensional function space, any $(n+1)$ degree polynomial can be expressed as a linear combination of $\phi_j, 0 \leq j \leq n$

The polynomial ϕ_{n+1} is a $(n+1)$ degree polynomial and comprises two parts - a leading order term in x^{n+1} and a polynomial of order n

The second part of ϕ_{n+1} , being a polynomial of order n , can be written as

$$\sum_{j=0}^n c_j \phi_j$$

i.e. a linear combination of the basis functions $\phi_j, 0 \leq j \leq n$

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So, I am interested in finding ϕ_{n+1} and I have 2 conditions that I have to satisfy. My ϕ_{n+1} has to be orthogonal to all my previously generated ϕ 's. So, it has to be orthogonal to ϕ_0, ϕ_1 through ϕ_n and also, its leading order coefficient γ_{n+1} will be a scalar multiple of the leading order term in ϕ_n . So, these are the conditions, which under, which we can get the Recursion formula.

So, since ϕ_j forms a basis for the n dimensional subspace of the infinite-dimensional function space, I know ϕ_0 up to ϕ_n . So, I know n basis functions, I know the basic functions for my n dimensional subspace of my infinite-dimensional function space any

nth degree polynomial can be expressed as a linear combination of the ϕ_j 's from j equal to 0 to n . So, any n th degree polynomial can be expressed as a linear combination of my known basis functions for the n dimensional subspace function of the infinite-dimensional function space.

The polynomial ϕ_{n+1} is a $n+1$ th degree polynomial and it comprises two parts, another $n+1$ th degree polynomial must have a term, which involves powers of x where, x is my independent variable x raised to the power $n+1$ and it must have other terms which, I can represent as a n th degree polynomial. So, it is an n th degree polynomial plus a term which is to the power $n+1$ and comprises 2 parts a leading order term in x^{n+1} and a polynomial of order n the 2 part of ϕ_{n+1} being a polynomial of order n can be written in terms of my known basis functions, which I know up to order n . So, I can write it as $\sum_{i=0}^n c_i \phi_i$, that is a linear combination of the basic functions ϕ_j , j greater than or equal to 0 lesser than or equal to n . So, ϕ_{n+1} comprises 2 parts, 1 part can be written as a linear combination of the basic functions ϕ_0 through ϕ_n and it also involves another part, which is a power which is x to the power $n+1$ times some coefficient.

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Leading order term

Since the leading order term of ϕ_{n+1} has a coefficient which is a scalar multiple of the coefficient of the leading order term of ϕ_n ($\gamma_{n+1} = \alpha_n \gamma_n$), the first part of ϕ_{n+1} must be the first term in the polynomial $\gamma_{n+1} \frac{\phi_n}{\gamma_n} x = \alpha_n x \phi_n$.

The polynomial $\alpha_n x \phi_n$ also contains terms like $x^0, x^1, x^2, \dots, 1$ but those terms can be thought of as included in the second part

$$\sum_{i=0}^n c_i \phi_i$$

Thus by writing $\phi_{n+1} = \alpha_n x \phi_n + \sum_{i=0}^n c_i \phi_i$ we ensure that the leading order term of ϕ_{n+1} is a scalar multiple of the leading order term of ϕ_n .

but the requirement is that $(\phi_{n+1}, \phi_j) = 0$ for $j = 0, \dots, n$ i.e. the

orthogonality requirement

Since the leading order term of ϕ_{n+1} has a coefficient which is a scalar, this is our 2nd condition, which is a scalar multiple of the coefficient of the leading order term of ϕ_n that is γ_{n+1} is the coefficient of x^{n+1} in ϕ_{n+1} γ_n is the

coefficient of x^n in ϕ_n and I know that γ_{n+1} can be written as α_n times γ_n . The first part of ϕ_{n+1} must be the first term in this polynomial. Suppose, I generate another polynomial ϕ_n , I take my original polynomial ϕ_n , I divide every term in that polynomial by γ_n the coefficient of its leading order term and then I multiply it by x . I multiply it by x and I scale it by γ_{n+1} . So, this is going to be a $(n+1)$ th order polynomial. ϕ_n is n th polynomial, I multiply each term by x . So, this is going to be a $(n+1)$ th order polynomial. I am dividing each term in that polynomial by the leading order by the coefficient of the leading order term of ϕ_n and I am multiplying each term also by γ_{n+1} . So that means, the first term of this polynomial is going to be $\gamma_{n+1} x^{n+1}$ is that clear.

The first term of this polynomial must be the first term of ϕ_{n+1} and this polynomial I can write as $\gamma_{n+1} \phi_n$ which is equal to $\alpha_n \phi_n$. So, $\alpha_n \phi_n$, the polynomial $\alpha_n \phi_n$ also contains terms like $x^{n-1}, x^{n-2}, \dots, 1$. It also contains the term $\phi_n x^n$ to the power n because, there is $x \phi_n$ it also contains terms like this but, these terms can be thought of these terms are part of my these are all part, these are all, these can also all be included in a polynomial of order n .

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Splitting into two parts

Suppose the polynomials up to order n have already been constructed
i.e. $\phi_j, 0 \leq j \leq n, \phi_j \neq 0$ exist

We want to construct ϕ_{n+1} such that ϕ_{n+1} is orthogonal to $\phi_0, \phi_1, \dots, \phi_n$ and
 $\gamma_{n+1} = \alpha_n \gamma_n$

Since $\phi_j, 0 \leq j \leq n$ form a basis for the $(n+1)$ dimensional subspace of the infinite dimensional function space, any $(n+1)$ degree polynomial can be expressed as a linear combination of $\phi_j, 0 \leq j \leq n$

The polynomial ϕ_{n+1} is a $(n+1)$ th degree polynomial and comprises two parts - a leading order term in x^{n+1} and a polynomial of order n

The second part of ϕ_{n+1} , being a polynomial of order n , can be written as

$$\sum_{j=0}^n c_j \phi_j$$

i.e. a linear combination of the basis functions $\phi_j, 0 \leq j \leq n$

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So, these can be thought of as part of my two terms. These are part of my two terms. So, I have a leading order term which is given by the first term in this series, first term in this

polynomial and then I have this part. So, we can write, if we write ϕ_{n+1} is equal to $\alpha_n x \phi_n$ minus $\sum_{i=0}^n c_{ni} \phi_i$, we are going to ensure that, the leading order term of ϕ_{n+1} is a scalar multiple of the leading order term of ϕ_n , why because, the term which involves x^{n+1} is nothing but, $\alpha_n \gamma_n$ times x^{n+1} . So, the leading order term is a scalar multiple of the leading order term of ϕ_n , we have ensured that if we write it like this. The term which involves x^{n+1} in this expression can be obtained from my old expansion my last term ϕ_n , if I take the leading order term of ϕ_n divide it. It is coefficient and multiplies by this thing γ_n plus 1.

So that is and that is equal. So, and that is equal to $\alpha_n x \phi_n$. So, the first term can be obtained by taking a scalar multiple of the leading order term of ϕ_n and then, I have other terms which are all polynomials of order n which is a polynomial of order n . So, if this is my next term in my series, in my orthogonal series, it has to satisfy another very important condition and what is that condition? It has to be orthogonal to all my ϕ_j 's j equal to 0 to n all the lower terms in that series, it has to be orthogonal to that. So, this inner product has got to be satisfied. So, what does it mean if I have to satisfy the inner product well? Let us see.

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Orthogonality requirement

This condition will be fulfilled if:

$$\alpha_n(x\phi_n, \phi_j) - \sum_{i=0}^n c_{ni}(\phi_i, \phi_j) = 0, \quad j = 0, 1, \dots, n$$

But $(\phi_i, \phi_j) = 0 \quad \forall i \neq j$ and equal to $\|\phi_j\|^2$ if $i = j$

Hence to fulfil the orthogonality condition, $c_{nj} \|\phi_j\|^2 = \alpha_n(x\phi_n, \phi_j)$

which leads to $c_{nj} = \frac{\alpha_n(x\phi_n, \phi_j)}{\|\phi_j\|^2}$ (*)

This enables determination of all $c_{nj}, j = 0, 1, \dots, n$.

Next, considering the inner product $(x\phi_n, \phi_j)$. Because of the symmetry of the inner product $[(f, g) = \int_a^b f(x)g(x)w(x)dx]$, this can be written as $(\phi_n, x\phi_j)$

So, in this if this inner product is to be fulfilled. What it must satisfy is $\alpha_n x \phi_n$ comma ϕ_j minus $\sum_{i=0}^n c_{ni} \phi_i$ comma ϕ_j has got to be equal to

0. So, this condition has to be satisfied. But, I know that $\phi_i \phi_j$ is equal to 0 for i not equal to j and is equal to norm of ϕ_j square if i is equal to j sorry, this is a typo. So, ϕ_i is equal to ϕ_j square is ϕ_i is equal to j hence in order to fulfill the orthogonality condition I know. So, only the term that is going to survive here, for each of this j 's for j equal to 0 to n is going to be $c_n \phi_j$ norm of ϕ_j square where, as all the other terms are going to be 0. So, $c_n \phi_j$ square must be equal to $\alpha_n \phi_n$ comma ϕ_j which tells me that $c_n \phi_j$ must be equal to that. So, if $c_n \phi_j$ satisfies that condition if my $c_n \phi_j$ is obtained like this then, my ϕ_{n+1} is a valid member of my series of my orthogonal series.

It turns out that, this many of these $c_n \phi_j$'s actually become 0, many of these $c_n \phi_j$'s become 0 why, well let us look at the inner product $x \phi_n$ comma ϕ_j , because of the symmetry of the inner product. I can write $x \phi_n$ comma ϕ_j as ϕ_n comma $x \phi_j$, because the inner product is actually an integral and within the integral I can change the order of that, the terms in the integrant. So, I can write $x \phi_n$ comma ϕ_j as ϕ_n comma $x \phi_j$.

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Expression for coefficients

But $x\phi_j$ is a polynomial of order $j+1$ which can be written as a linear combination of the first $j+1$ terms in the series $\phi_0, \phi_1, \dots, \phi_j, \phi_{j+1}$

Hence because of the orthogonality property $(\phi_n, x\phi_j) = 0 \quad \forall j+1 < n$

Thus all $c_m = 0, j+1 < n$ or $j < n-1$. Therefore:

$$\phi_{m+1} = \alpha_n x \phi_n - c_m \phi_n - c_{m+1} \phi_{n-1}$$

This gives the desired recursion formula. The coefficients c_m and c_{m+1} can be evaluated from (*) as:

$$c_m = \frac{\alpha_n (x\phi_n, \phi_m)}{\|\phi_m\|^2}, \quad c_{m+1} = \frac{\alpha_n (x\phi_n, \phi_{m+1})}{\|\phi_{m+1}\|^2}$$

The above recursion formula enables construction of a series of orthogonal polynomials in a unique fashion if the first two terms of the series are known.

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But, $x \phi_j$ is a polynomial of order j plus 1; ϕ_j is a polynomial of order j . So, $x \phi_j$ is a polynomial of order j plus 1 which can be written as a linear combination of the first any polynomial of order j plus 1 can be written in terms of my j plus 1 basis functions, in terms of my j plus 1 basis functions. So, this polynomial $x \phi_j$ which is a polynomial of

order $j + 1$ can be written in terms of the $j + 1$ term in the series $\phi_0 \phi_1 \phi_j$ through, ϕ_{j+1} .

Hence, because of the orthogonality property therefore, what do we get? We have $\phi_n \cdot \phi_j$. So, in this part, I can represent as a sum of $j + 1$ basis functions. So, if n is greater than $j + 1$ then, what do I have? Then, this inner products got to be 0, because if n is greater than $j + 1$ n contains $\phi_0 \phi_1$ through ϕ_{j+1} plus some additional basis functions and those additional basis functions are all orthogonal to the ϕ_0 through ϕ_{j+1} .

So, $\phi_n \cdot \phi_j$ is going to be equal to 0 for n greater than $j + 1$. For n greater than $j + 1$ this is going to be 0, thus all $c_n \cdot \phi_j$ is equal to 0 for $j + 1$ less than n or j less than $n + 1$ therefore, what do we have? Let us go back to our little series here. So, we have shown that this is true, this is my representation. Because all the terms in that sum all my c_n 's or my c_j 's are given by this inner product and I know that, this inner product is going to be 0 for all j less than $n - 1$. For all j less than 1, this inner product is going to be 0.

So, the only terms that is going to survive. The only $c_n \cdot \phi_j$'s that are going not going to be 0 are when j is equal to n and j is equal to $n - 1$, because for j less than $n - 1$ all these coefficients are going to 0. So, these are only non-zero coefficients are going to arise when, j is equal to $n - 1$ or j is equal to n . And therefore, my series I get rid of all the terms in that series up to 0 to $n - 2$ the only terms, which survive are $n - 1$ and n so I can write ϕ_{n+1} in terms of ϕ_n and ϕ_{n-1} and thus I get my recursion formula.

So, I can write ϕ_{n+1} is equal to $\alpha_n \cdot \phi_n - c_n \cdot \phi_{n-1}$ that tells me that, I can generate any new member in that series just from my last two members of the series using this recursion formula and this recursion formula is true is holds good for all orthogonal polynomials, whatever be the orthogonal polynomials, whatever be the type. It is true for all orthogonal polynomials; they are going to satisfy recursion formula like this.

And these c_n and c_{n-1} , we can evaluate from this formula from this formula.

So, we get c_n , n is equal to $\alpha_n \times \phi_n$ by norm of ϕ_n square and c_{n-1} is equal to $\alpha_{n-1} \times \phi_{n-1}$ by norm of ϕ_{n-1} square. So, the above recursion formula enables construction of a series of orthogonal polynomials in a unique fashion, if the first 2 terms of that series are known if we know the first 2 terms if I know ϕ_0 ϕ_1 I can generate ϕ_2 , if I know ϕ_1 ϕ_2 , I can generate ϕ_3 and so on and so forth.

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Recursion formula: Discrete Case

In the discrete case, on a grid with $m+1$ points $x_0, x_1, x_2, \dots, x_m$ this process holds for $n \leq m$ i.e. we can construct $\phi_2, \phi_3, \dots, \phi_{n+1}$ once ϕ_0 and ϕ_1 are known.

ϕ_{n+1} must be orthogonal to $\phi_0, \phi_1, \dots, \phi_n$. Thus we must be able to express ϕ_{n+1} as $A_{n+1}(x-x_0)(x-x_1)\dots(x-x_n)$ which ensures that ϕ_{n+1} is zero at all the grid points and thus is orthogonal to $\phi_0, \phi_1, \dots, \phi_n$ which are known at the grid points.

This basically means that $\|\phi_{n+1}\|$ is zero which implies that the term ϕ_{n+2} of the series cannot be constructed since it would require the evaluation of:

$$c_{n+1} = \frac{\alpha_{n+1}(\phi_{n+1}, \phi_{n+1})}{\|\phi_{n+1}\|^2}$$

as is evident from the recursion formula.

Thus the process stops for $j > m+1$.

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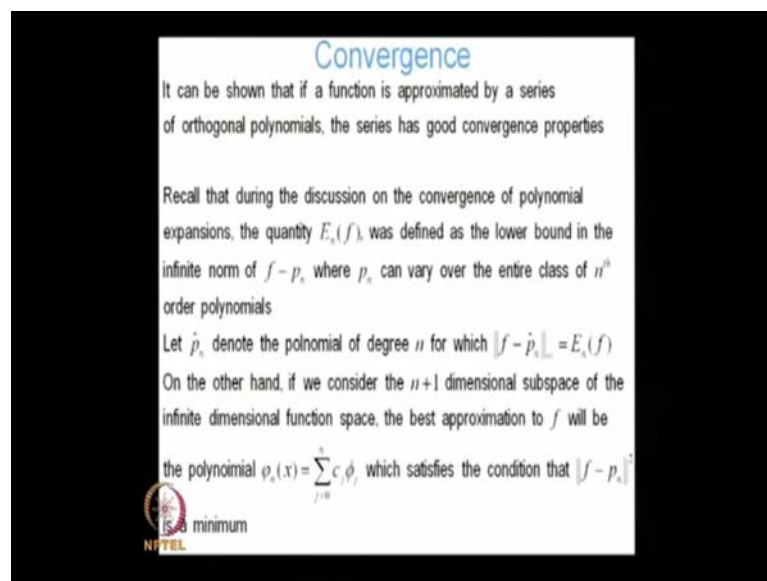
Similarly, for the discrete case also, this can be true in the discrete case on a grid with m plus 1 points x_0 through x_m this process holds for n lesser than or equal to m , that we can construct ϕ_2, ϕ_3 up to ϕ_m . This should be m plus 1 m plus but, once ϕ_0 and ϕ_1 are known once ϕ_0 and ϕ_1 are known, so ϕ_m . So, let us look at the last term in that series in a discrete set of polynomials orthogonal polynomials ϕ_{m+1} . So, ϕ_{m+1} has got to be orthogonal to ϕ_0, ϕ_1 through ϕ_m .

Thus, we must be able to express ϕ_{m+1} . So, because it has to be orthogonal to all those polynomials and has to be orthogonal to them at all the grid points that means, it has to be 0 at all the grid points. So, because of that ϕ_{m+1} has this form $(x-x_0)(x-x_1)\dots(x-x_m)$ which ensures, that ϕ_{m+1} is 0 at all the grid points and thus is orthogonal to ϕ_0, ϕ_1 through ϕ_m which are known at all the grid points, since ϕ_{m+1} is 0 at all the grid points. It basically, means that norm

of ϕ_{m+1} is 0. So, norm of ϕ_{m+1} is 0 so the last term the last term ϕ_{m+1} ϕ_{m+1} is got to be.

So, I had x_0, x_1 through x_n . So, I have $m+1$ point. I know that, I can only have $m+1$ linearly independent basis functions. So, ϕ_0, ϕ_1 through ϕ_n those are my $m+1$ basis functions and I find that ϕ_{m+1} is always going to be equal to 0. If ϕ_{m+1} is equal to 0, I cannot generate ϕ_{m+2} . Because, I have to evaluate this term norm of ϕ_{m+1} square, norm of ϕ_{m+1} square for orthogonal polynomials. So, this I have to divide and this becomes 0. I cannot evaluate the next term, is that clear? So, the process stops for j greater than $m+1$. So, even for the discrete case, it is possible to evaluate the coefficients recursively, once I know my first two coefficients, is that clear?

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So, it can be shown that if a function is approximated by a series of orthogonal polynomials the series has good convergence properties. So, recall when we are discussing convergence of polynomials not orthogonal polynomials, we came across this quantity $E_n f$, we came across this quantity $E_n f$, which was defined as the lower bound in the infinite norm of f minus p_n , p_n is my polynomial approximation to f of order n and I said that $E_n f$ is the lower bound over all the set of another order polynomial lower bound in the maximum norm $E_n f$ $E_n f$ is the lower bound in the maximum norm of maximum or infinite norm of this difference. So, I have a function f , I am trying to

approximate it by a polynomial of order n and I want to find the polynomial which gives me the lowest difference between f and itself throughout the interval, the lowest difference in the maximum norm and that difference, that quantity is known as $E_n f$.

We talked about that earlier lower bound in the infinite norm of f minus p_n , the lower bound value on this. We have seen that and let p . Now, let us say, that suppose \hat{p}_n denotes the polynomial of degree n for which $\|f - \hat{p}_n\|_\infty$ is equal to $E_n f$. So, we are trying to find the polynomial among all the set of another order polynomials which gives me the smallest value of f minus p_n throughout my interval and suppose that polynomial is p_n that then, $\|f - p_n\|_\infty$ is equal to $E_n f$.

On the other hand, we know if we consider the $n + 1$ dimensional subspace $m + 1$ dimensional function space. We know the best approximation to that function f has the smallest norm, smallest L_2 norm in that case the error has the smallest L_2 norm, $\|f - p_n\|_{L_2}$ is the smallest. So that is the best approximation in the L_2 norm, the best approximation in the L_2 norm may not be the same as \hat{p}_n because, \hat{p}_n is the gives me the best approximation in the infinite norm, it gives me that value of the function, that value of the another order polynomial, which gives me the maximum, the minimum error in the infinite norm.

But, ϕ_n which is obtained by taking a linear combination of the $n + 1$, basis functions of the $n + 1$ dimensional function space has the best fit. It has the lowest error but, that lowest error is in the L_2 norm, it is in the L_2 norm. So, what is the relationship between $E_n f$ and this function ϕ_n which is my best fit in the L_2 norm or what is the relationship between ϕ_n and \hat{p}_n that is what we are interested in finding.

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Convergence

Thus $\|f - p_n\|^2 = \int_a^b [f(x) - p_n(x)]^2 w(x) dx$

$$\leq \int_a^b [f(x) - \hat{p}_n(x)]^2 w(x) dx$$

Since $|f(x) - \hat{p}_n(x)|_{\max} = E_n(f)$ i.e. $E_n(f)$ is the largest absolute value of $f(x) - \hat{p}_n(x)$ in $[a, b]$,

$$\int_a^b [f(x) - \hat{p}_n(x)]^2 w(x) dx \leq E_n(f)^2 \int_a^b w(x) dx \quad (+)$$

This establishes a bound on $\|f - p_n\|^2$ in terms of $E_n(f)$

Pointwise, $|f - p_n|$ may exceed $E_n(f)$ but the L_2 norm of the error

$f - p_n$ is bounded by a constant $\left(\int_a^b w(x) dx \right)^{1/2}$ times $E_n(f)$

So, what to do that, we write norm of f minus p_n square in the L_2 norm, which I can write like this $\int_a^b [f(x) - p_n(x)]^2 w(x) dx$ in terms of the inner product, and this is going to be lesser than or equal to $\int_a^b [f(x) - \hat{p}_n(x)]^2 w(x) dx$, because I know that $f(x) - \hat{p}_n(x)$ is the smallest absolute value in the interval. So, if instead $\hat{p}_n(x) - f(x)$ has the smallest absolute value among all another order polynomials in that interval. So, this has got to be less than that, because $\hat{p}_n(x) - f(x)$ or $f(x) - \hat{p}_n(x)$ in the infinite norm is the lower bound. So, this has to be less than that but, since $f(x) - \hat{p}_n(x)$ the infinite norm is equal to $E_n(f)$ that is $E_n(f)$ is the largest should be the smallest I apologize is the smallest absolute value of $f(x) - \hat{p}_n(x)$ in $[a, b]$ so this has to be less than that. So, smallest, it is the minimum, it is the smallest absolute value $f(x) - \hat{p}_n(x)$ in $[a, b]$, that is why, this has got to be lesser than or equal to that.

Integral of $\int_a^b [f(x) - \hat{p}_n(x)]^2 w(x) dx$ is therefore, going to be lesser than or equal to $E_n(f)^2 \int_a^b w(x) dx$ where I have now. So, this is the lower bound, this is equal to $E_n(f)$ is the lower bound. So, this has always got to be less than that is that clear. So, $\int_a^b [f(x) - p_n(x)]^2 w(x) dx$ so this has got so I can. So, I can, if I bring out the bound, I can bring it outside. I am taking the maximum value. So, I can take that outside of the integral $E_n(f)^2 \int_a^b w(x) dx$. I can write it like that. So, this establishes a bound from norm of f minus p_n square in terms of $E_n(f)$ is establishes a bound on this in terms of $E_n(f)$.

So, what does this mean? this means that, a mod of $f - p_n$ look at this $f - p_n$ norm of p_n square is going to be lesser than or equal to E_n f square double integral a to b $w(x)$ that means point wise $f - p_n$ x might exceed E_n f why? because, this is p_n this is not \hat{p}_n if it for p_n had that would not no longer be the case but, since this is $f - p_n$, this may be greater than E_n f but, the L^2 norm of the error is bounded by this times E_n f .

So, point wise $f - p_n$ may be greater than E_n f at each point. if I look at points in that interval at any point this may greater than E_n f but, the if I take the integral of that difference, the squared norm if I take the square and I integrate it over the interval after weighing it with the proper weight function then, I know that, it has got be less than the weight function square, weight integral of the weight function half times E_n f . So, we were, we are going to continue with this because, it is important that, we go through this carefully.

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Bound on neglected terms

We recall that $\lim_{n \rightarrow \infty} E_n(f) = 0$. Hence $\lim_{n \rightarrow \infty} \|f - p_n\|_2 \rightarrow 0$ which means that if we construct p_n using orthogonal basis functions of the infinite dimensional function space we are guaranteed to converge

Recall also that if $p_n = \sum_{j=0}^n c_j \phi_j$, $\|p_n - f\|^2 = \|f\|^2 - \sum_{j=0}^n (c_j)^2 \|\phi_j\|^2$ (*)

But from above, $0 = \|p_n - f\|^2 = \|f\|^2 - \sum_{j=0}^n (c_j)^2 \|\phi_j\|^2$ (**)

By (**)-(*): $-\|p_n - f\|^2 = -\sum_{j=n+1}^{\infty} (c_j)^2 \|\phi_j\|^2$

From (+) therefore, $\sum_{j=n+1}^{\infty} (c_j)^2 \|\phi_j\|^2 = \|p_n - f\|^2 \leq E_n(f)^2 \int_a^b w(x) dx$

This gives a bound on the contribution of neglected terms when a finite dimensional approximation is constructed using orthogonal basis functions

So, we are going to continue with this, next class I was hoping, I would finish the orthogonal polynomials but, we will finish this little bit and then we are going to talk about spline functions, which I have very another very important approximation, another very important set of basic functions, which can be used for approximations and then after doing that, we are going to move on to using these orthogonal polynomials when, we talk about gale kin's method and weighted residual forms. Thank you.