

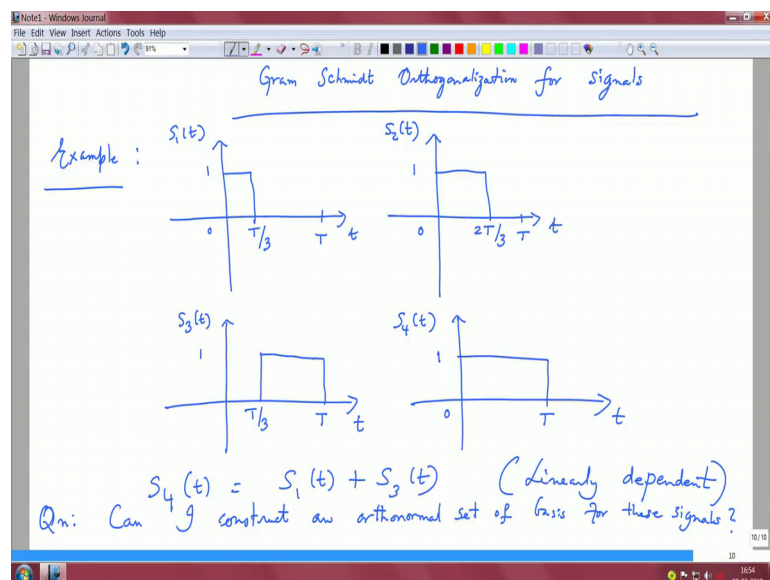
Mathematical Methods and Techniques in Signal Processing – I
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Lecture-21
Gram Schmidt orthogonalization of signals

Let us get started with the Gram Schmidt orthogonalization procedure for signals and that concept should basically lead us to basically treating signals as points in the signal space, right which is derived in the last module that the error in the reconstruction; the squared error in the reconstruction is basically the original energy in the signal minus the norm square of the signal whose components are basically these essays in the signal space.

So, we will basically first get how to get the basis is a first question right because once we get the basis then you can represent them and then you can compute how good your representation is. So, we will start with an example and I think you can now link the signals to vectors and basically invoke the same proof that you did for the Gram Schmidt orthogonalization procedure for vectors.

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Now, let us start with an example. Suppose, I think of these wave forms like this, S_1 of t is 1, for capital T by 3 seconds some time units, I have S_2 of t which is for two thirds of

this time, this is 1, it is 0, otherwise, S_3 of t is 1 between capital T by 3 to capital T . So, many units of time and we have S_2 of t which is one for capital T units of time.

So, if we just observe these signals under the definition of the inner product, in the interial sense, right, you can figure out easily that some of them are orthogonal pairwise, but are they you know or some of these linearly independent is another question that you might ask, but; obviously, for example, if you consider S_4 , this signal here right, S_4 is basically S_1 plus S_3 ; which means that in this signal set that I have S_1 , S_2 , S_3 and S_4 ; some of them are linearly dependent, right, the question is can I construct an orthonormal set for these signals.

And this type of you know rectangular pulses sometimes you know in power systems etcetera you find this its type of motors you find this step pulses coming through, right and I do not know if one can think about application of this signal representation problem in the power engineering space, but at least you can kind of relate to these type of wave forms that we see they are not unrealistic wave forms, ok.

So, let us see how we can apply Gram Schmidt orthogonalization procedure for signals exactly the same way that we did you start with the first basis.

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Let us apply G. S. O. for signals

$$f_1(t) = \frac{s_1(t)}{\|s_1(t)\|} = \frac{s_1(t)}{\sqrt{\int_0^T s_1^2(t) dt}} = \begin{cases} \sqrt{\frac{3}{T}} & 0 \leq t \leq \frac{T}{3} \\ 0 & \text{else} \end{cases}$$

$$\|1\| \rightarrow f_2(t) = \frac{s_2(t) - s_{21} f_1(t)}{\|s_2(t) - s_{21} f_1(t)\|} = \begin{cases} \sqrt{\frac{3}{T}} & \frac{T}{3} \leq t \leq \frac{2T}{3} \\ 0 & \text{else} \end{cases}$$

$$s_{2j} \triangleq \int_0^T s_2(t) f_j(t) dt \quad \|1\| \rightarrow f_3(t) = \begin{cases} \sqrt{\frac{3}{T}} & \frac{2T}{3} \leq t \leq T \\ 0 & \text{else} \end{cases}$$

$$s_{21} = \int_0^T s_2(t) f_1(t) dt$$

So, I have S_1 of t divided by the norm of S_1 of t , this norm is basically 1, right. So, at least I am setting this to norm 1. So, this is S_1 of t divided by square root of integral of S

$\frac{1}{\sqrt{3}}$ for $0 \leq t \leq T$, right. So, it is pretty straight forward that this is $\frac{1}{\sqrt{3}}$ for this duration of time and it is 0 else, right, you take the square root of 1 square. So, you just have $\frac{1}{\sqrt{3}}$ in the denominator and you just flip it out, it is $\sqrt{3}$ by t and S_1 is 1 basically and that one $\sqrt{3}$ by t times one for this intervals 0 else.

So, similarly f_2 of t is S_2 of t minus S_1 , this is basically the inner product of S_2 with f_1 on f_1 of t , right, in you have to remove that component out and if you want to normalize this; this is basically the norm of; now how do you compute. So, now, S_2 ; so, if you take the integral of S_2 with f_1 , you just with S_1 u dot it right S_2 with S_1 of t , S_2 with f_1 in the direction of f_1 is what we need to do, right, you can take the inner product, right.

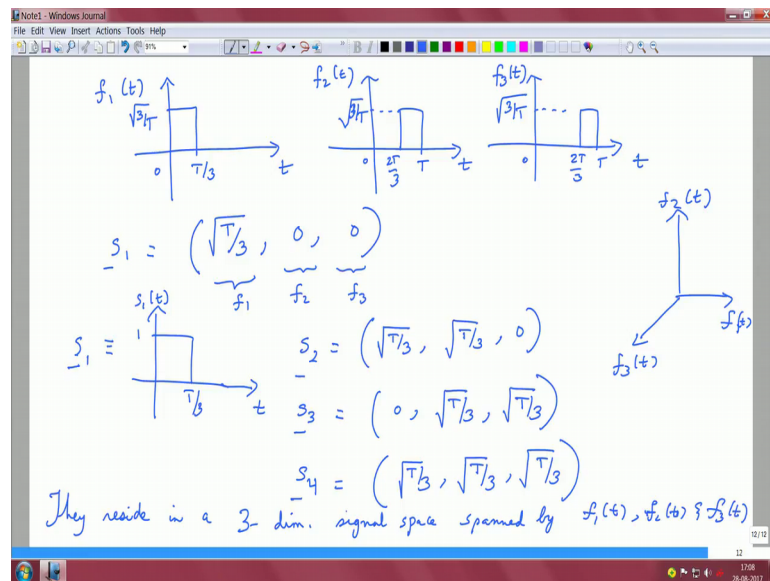
So, I would say S_{ij} here in general is basically. So, basically if it is S_2 is S_2 of t inner product of S_2 of t with f_1 of t under this norm under this; this definition, right, S_{ij} is S_i of t S_j of t and so, S_2 is S_2 with f_1 , right. So, if you if you carefully did this math. So, you just observe the signal when I take S_2 with S_1 , right, if you just observe this diagram when I take S_2 with f_1 , this exist only in 0 to t by $\sqrt{3}$ because from t by $\sqrt{3}$ to $2\sqrt{3}$ by t , it just does not exist, it the inner product is just going away.

So, what you are left with the π is basically this signal 0 to $\sqrt{3}$ by t defined from 0 to T by $\sqrt{3}$ right, 1 from 0 to T by $\sqrt{3}$ that is what you have for that π of the signal. So, basically when you subtract all these things and when you normalize, you will land up with $\sqrt{3}$ by t . So, basically now you can think about when you subtracted it, S_2 is basically a signal when you take the inner product is what you get when you subtract it, you will land up with basically the π from t by $\sqrt{3}$ to $2\sqrt{3}$ by t , right, is very straight forward line this example is very illustrative not much of math you have to do.

So, if you just see through the figures you can kind of imagine what they are. So, basically this is from one third of a time to two thirds. So, typically this T is a signal in period in terms of signals, I mean from communication signals or something called signal in period for these pulses and that is what it means in the signal processing sense, but you know for math, you do not have to worry about it from t seconds. So, this is 0 else and you do the math for f_3 , the same way take S_3 compute the inner product of S_3 with f_2 , then S_3 with f_1 , remove those components out and just normalize the signal is just routine trick you will have to do.

So, this is basically if you can guess; it is root 3 by t 2 t by 3 0, else.

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So, now, we have f_1 , f_2 and f_3 and let us see how they look. This is my f_1 by f_2 is from $2t$ by 3 to t and f_3 of t is from $2t$ by 3 into t this is root 3 upon t , right, this is how I have and if I want to represent my S_1 ; my S_1 is basically 1. So, S_1 , if you just recall is this way form which is one from 0 to t by 3 , right. So, this is $S_1 t$. Now this is basically if you want to express it in terms of f_1 . This is basically root t by 3 times root of t by 3 root t by 3 times root 3 by t gives you 1.

So, therefore, this is square root of t by 3 in terms of a coordinate on f_1 , 0 component on f_2 , 0 component on f_3 , right. So, you can think about this corresponds to f_1 , this corresponds to f_2 , this corresponds to f_3 , it makes sense because f_2 and f_3 have no components and in f_1 . It is root of t upon 3 of f_1 , right. This is the coordinate representation for the signal S_1 .

So, S_1 which is vector is basically sort of I would say, it is equivalent to this signal is basically this coordinate in this space and I think, it is very important to get this feel just by inspection if you observed, right, the support really there is no overlapping support for these f_1 , f_2 and f_3 , right; that means, f_1 and f_2 they are orthogonal mutually all these f_1 , f_2 , f_3 are orthogonal and they are normal as well I mean they are orthonormal and because they are normal you can write them in this in this coordinate form because you have to normalize the length; normalize.

So, therefore, normality is taking care this root t by 3 is this basically normalizing and it is very very important to normalize. So, now, you get a sense here. So, S_2 this vector can be is. So, S_2 is what? So, if we go through we have from 0 to t by 3 and then from t by 3 to $2t$ by 3. So, therefore, you have components from f_1 and f_2 as well, right. So, therefore, you have a root t by 3 a root t by 3 is 0. So, you can just do this and convince yourself, S_3 is basically 0, root t by 3, root t by 3 and S_4 has all these components.

So, we are done because this was the aim where we wanted to start within the beginning of module 1 where we wanted to write signals as vectors and indeed we have written the signals of vectors. So, now, these signals S_1, S_2, S_3, S_4 ; though I have given you 4 signals, they reside in a 3 dimensional signal space spanned by f_1, f_2 and f_3 and now, it is very easy, now for you to figure out, what is a angle between S_4 and S_3 ; what is the length of S_3 or S_4 everything you could easily figure out, right.

So, the length and the angle that they are used to in the vectors can be equivalently transformed or translated rather to the lengths and the angles for signals as well; so, the geometry of vectors can translate to the geometry of the signals in the signal space and now, since we have vectors; signal is transformed to a vector using this appropriate coordinate system a lot of linear algebra can be applied to signals, basically, it is now a vectors now. So, we are ending this module here.