

Discrete Time Signal Processing
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Lecture - 17
Introduction to DFT

I show one more example. If suppose, we have got things like this, some numerical polynomial, but denominator if you factorized, we have one factors say, which is occurring twice.

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First order pole at $z = \frac{1}{6}$
 Second " " at $z = \frac{1}{3}$

$$H(z) = \frac{1+z^{-1}}{(1-\frac{1}{3}z^{-1})^2(1-\frac{1}{6}z^{-1})}$$

$$= \frac{A}{(1-\frac{1}{3}z^{-1})} + \frac{B}{(1-\frac{1}{3}z^{-1})^2} + \frac{C}{(1-\frac{1}{6}z^{-1})}$$

$$= \frac{A[(1-\frac{1}{3}z^{-1})(1-\frac{1}{6}z^{-1})] + B[1-\frac{1}{6}z^{-1}] + C[(1-\frac{1}{3}z^{-1})^2]}{(1-\frac{1}{3}z^{-1})^2(1-\frac{1}{6}z^{-1})}$$

$$= \frac{A(1-\frac{1}{2}z^{-1}) + B(1-\frac{1}{6}z^{-1}) + C(1-\frac{2}{3}z^{-1} + \frac{1}{9}z^{-2})}{(1-\frac{1}{3}z^{-1})^2(1-\frac{1}{6}z^{-1})}$$

$C \cdot (\frac{1}{6})^n u(n)$
 $\rightarrow A \cdot (\frac{1}{3})^n u(n-1)$
 + ?

So, it is square is coming, another is say, this. Then we say, this has pole at z equal to $\frac{1}{3}$, but pole order of the pole is 2. It has a pole at z equal to $\frac{1}{6}$, whatever is the pole is 1, because this factor has a power 1, this factor has a power 2. So, pole at z equal to $\frac{1}{3}$, but that has order 2. Second order pole, at z equal to $\frac{1}{3}$. That makes a factor like this, $1 - \frac{1}{3}z^{-1}$, z inverse. Pole at z not at z equal to $\frac{1}{3}$, z equal to $\frac{1}{6}$ because, if inputs z equals $\frac{1}{3}$ it inverse of that, cancels with $\frac{1}{3}$, you get 1, $1 - 0$, division by 0, it is a pole, this is second part of pole, because the power factor is getting repeated. So, there is a power of 2, we call, we say there is a pole of $h(z)$, $h(z)$ has a pole at z equal to $\frac{1}{3}$, of order 2. Second order pole, it has a first order pole z equals to $\frac{1}{6}$.

First order, second order, this 2 factorized, you see, which have a by, as before 1 minus 3, z inverse, then b by, we have this again, why I will explain. This factor here, the factor is squared, and then c by the other factor. Why? Because if you do not have this, then denominator will be the product of 2, but here, we have got power of 2, this must be present. How about this? This denominator will be product of this, you will get this kind of form but, along with this 2, even if I have, a by the first order factor, still, denominator will be this product because, it is of the lcm of the 3 factors, 3 terms, so this, and square of this, this square of this, and then this. So, denominator will be this, into this, which is this. So, we have to have a provision for this also, this kind of term also, because these not enough. This, this kind of term of fixed possible to exist, because if we did just (Refer Time: 03:18) first order factor, here second order factor, the same factor, at this. When you are doing algebraic addition, denominator will be product of this 2 only.

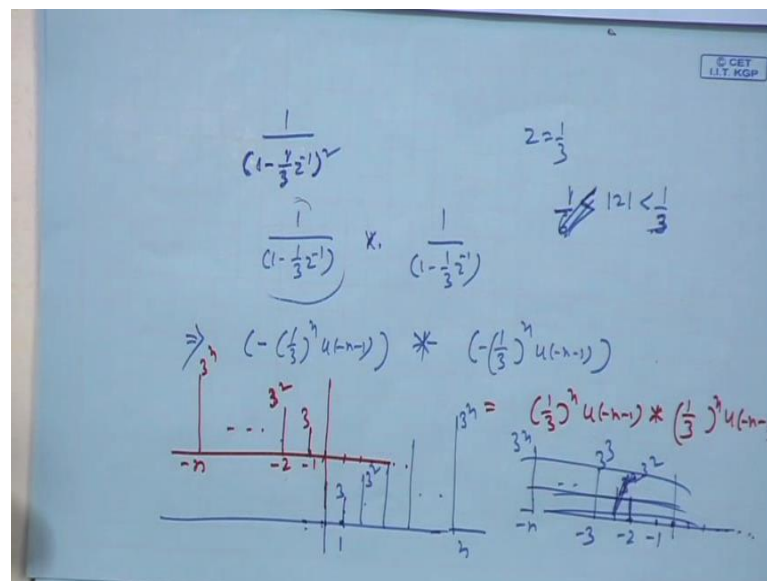
So, you can not rule out the possibility of a term, of this kind also, in this expansion. This is called partial factor expansion. If you add them, you know you will have, 1 by square. So, what will happen, 1 minus 1 minus 3, z inverse, you will take that out, you will be getting a into, then b, if you take this out, it is just, and c, if you take out, c into, now if you simplify, you will see, this will have a second order term z inverse 2, this first order z inverse, this will have z inverse 2, z inverse, here also z inverse. So, what are the 2 will be say, polynomial, where there will be z inverse (Refer Time: 04:43), z inverse 2 (Refer Time: 04:43), then constant (Refer Time: 04:44), that you, can equate with 1 plus z inverse.

So, here the z inverse 2 terms is absent. So, corresponding coefficient is equal to 0, coefficient corresponding to z inverse, you will equate with 1, the constant you equate with 1. You solve for ABC, you will get the coefficient, and we have this expansion. That I am not doing, that I am not doing, but that is 1 we are doing it. We will expand it, you write this, numerator expression collect the terms for z inverse. So, the corresponding coefficient you equate with 1, collect the terms for z inverse 2, corresponding coefficient is equal to 0, correct the terms for the constant, equate with 1, solve, you get ABC. So, you will get these factors; let them be as it is. The question is I have got the same roc as before. So, as per this term is constant, this term is constant, I know what they will be. Here the roc is, pole is z equal to 1 by 3, either mod greater than

1 by 3, or less than 1 by 3. I am giving less than 1 by 3. So, I will take roc to be mod z, less than 1 by 3 here.

So, this will give raise to capital A, a to the power, a is 1 by 3. So, capital A, 1 by 3 (Refer Time: 06:13) sequence, sorry. Let us start with this, c by 1 minus 6 z inverse, here, roc will be, because roc can not contain in the pole, z equals 1 by 6. So, either mod z greater than 1 by 6, or mod z 1 by 6, we have to take mod z greater than 1 by 6. So, this will give raise to c into, a to the power n, u n, because it is a right sided sequence, we have seen already. c constant, 1 by 1 minus z inverse, mod z greater than mod a, mod a is same as mod 1 by 6, there is, on by 6 itself. So, from our previous exercise, you get this term. In the case, of this a into, it will be minus a to the power n, that is 1 by 3 to the power n minus u minus n, minus 1. ABC you already found out, but there is 1 more term, this, this will be what? This is the question.

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So this, I will give you answer now. I will come back to that. If you had an expression like this, or; obviously, this has a pole, secondary pole, z equal to 1 by 3. So, this cannot be part of the roc, of this part, this fraction. So, either mod z less than 1 by 3, or mod z greater than 1 by 3, we are giving mod z less than 1 by 3.

So, this 1 this is what was given, mod z less than 1 by 3, greater than 1 by 6, we have to take mod z, less than 1 by 3, for the roc. That means, you can write this also as, 1 system in to another. So, if one gets transformed into another, this has roc, mod z less than 1 by

3, because total was giving to me mod z less than 1 by 3 greater than 1 by 6. So, as I told you, roc for each of them, is either mod z greater than 1 by 3, or less than 1 by 3, but we are giving mod z less than 1 by 3, greater than 1 by 6 for the overall. So, we have to take mod z less than 1 by 3 only, to conform to that.

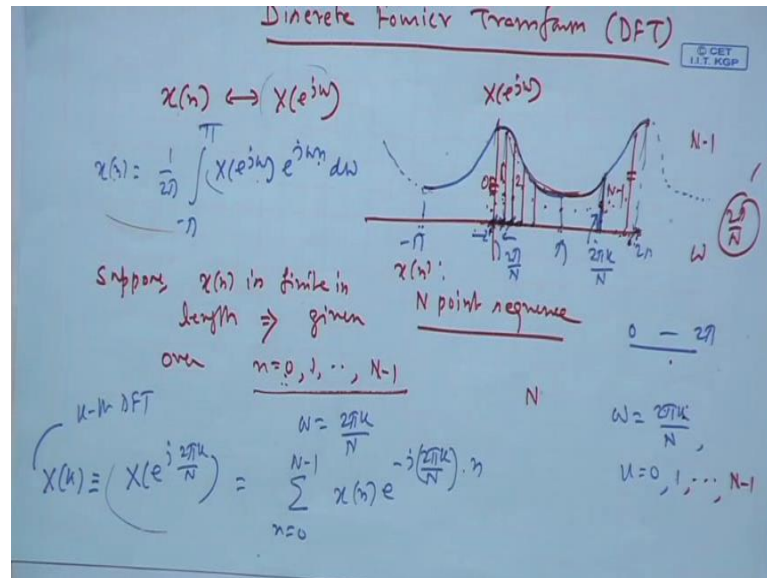
So, therefore, this has mod z less than 1 by 3, this has mod z less than 1 by 3. So, this will rise to, a sequence minus, 1 by 3 to the power n , u minus n , minus 1. And this will give raise to same thing, minus 1 by 3 n , convolution, because z transforms if you, if you are multiplying with z domain, it is called convolution in time domain. This convolution you work out, these convolution if you work out, you will get the result. What is this function? This function starts like this, 1, because minus and minus plus, you can forget the minus, it is same as, 1 by 3 whole to the power n , this minus is for all samples, minus is for all samples, minus, minus plus, forget all minus, same thing.

So, it is starts at n equals minus 1 onwards, n equal to minus 1 it will be, 1 by 3 to the power minus 1, that is 3. 1 by 3 to the power minus 1, then, 1 by 3 to the power minus 2, to 3 square, dot, dot, dot at minus n th, it will be 3 to the power n . This sequence then this side is 0, 0, 0, 0, 0, 0, this have to convolute with itself. If you want to convolute with itself, you have to flip it first, if you flip it, this will go here, then here, then here, like this, dot, dot, dot at 1, it will be 3, then 3 square dot, dot, dot, 3 to the power n , at n . You will flip it, then if you do not shift just multiply term wise, you get 0, because 0 into 0, this into 0, this into 0. So, at convolution result, at origin will be 0. If you shift it further to the right, there will be no overlap, this will. So, you continue to get 0 values.

If you shift into the left, this 0 comes here, this comes here, and still you get 0. So, if you shift into the left, up to minus 1, if you shift by minus 1, I will shift it to the left. So, this 0 comes here, and this comes here, still there is no overlap. So, you get 0, if you shift further, from minus 2, then 3 comes below this, say about 3 square, 3 cube, dot, dot, dot 3 square 3, cube 3. This 3 comes here, so 3 square, how many shift? 2 shift, where is it minus 2, you get 3 square, at minus 3, you get 3 cube dot, dot, dot minus n , you get 3 to the power n , you sum them, you get a value. Next time when you move, next time when you move, this 3 comes below 3 squares, c square comes below 3, just a minute. So, I will leave this exercise to you. You carry out this convolution and you get the result, convolution between that 2.

Let this be an exercise. May be I will put it in the assignment. So, that is all for inverse z transform calculation.

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I now move to the next topic, which is very, very powerful topic, very important topic. Discrete Fourier Transform, DFT. Discrete Fourier Transform, DFT it is not discrete time fourier transform, but lets start with discrete time fourier transform, originally I have $x(n)$, one sequence may be, infinitely long, from minus infinity to plus infinity, it has a DTFT, x to the power $j\Omega$ which is a complex function. So, as I told you if you have to really plot it, you should plot it magnitude versus Ω , and phase versus Ω , and it will be both, it will be periodic in both cases over Ω , or a period of 2π . But for our purpose, I just have 1 plot, and that will be enough to explain the points, but actually it is not a wrong, correct thing, because I should have a mod plot, and case plot, because this x is, is real. So, mod is real, phase is real, right, but this is a complex number, complex number cannot be shown by 1 axis, nevertheless, just to make my point, I am, just showing x , e to the power $j\Omega$.

The whole logic will be the same, if you separate the plots, 1 the magnitude mod x , e to the power $j\Omega$, versus Ω , and at the phase, this angle of this, what is Ω . Same logic will hold good. Just keep, take it that way. Now, this I know it will be a periodic function, right? It might be like this, from minus π to π . So, if you go to 2π , same period will continue, same thing will continue here, like this, and again here. Now

you see, $x[n]$ is a sequence, I have got the DTFT, either you take from the here to here, 1 period from $-\pi$ to π , or you take from here to here, 0 to 2π . For this topic chapter, we will consider 0 to 2π , because it is a periodic function, any period of duration 2π is fine. So, either you take from $-\pi$ to π , or you take from 0 to 2π , whatever you get, repeat it, again, again, again, you get the (Refer Time: 15:57) form, right? This part will go on repeating, or this [part/particular] part will go on repeating, if this is a period, you go on repeating it, if this is a period, you go on repeating; you get the same thing. Does not matter how you chose your period, period is 2π .

So, I may chose this, but whether you chose this, or this, one thing, this entire wave form envelope is required, for instance, inverse DFT, $x[n]$ is there, to get $x[n]$ back, what was the DTFT? That is, $x[n]$ was, if you from $-\pi$ to π , if you follow this $-\pi$ to π , integrate n is your choice, you want to find out sample at particular n , carry out the integration overall Ω , from $-\pi$ to π . So, you need this entire wave form full wave form, from $-\pi$ to π , then only 3 integral will be, you can carry out, you can get $x[n]$, is it not? That is what we have studied so far. Now I will make a claim, that suppose, $x[n]$ is finite in length, that is, is given over, say, n equal to 0, 1, up to this. We call it capital N point, capital N point sequence, $x[n]$; That means, this given over this zone, outside this zone, it is all 0. We also call it f i r sequence, because you know, I mean, if you, if it is an impulse response, of any system linear (Refer Time: 17:46) system impulse response (Refer Time: 17:47) sample response. There is finite in length, there is called f i r sequence, finite impulse response, f i r sequence, n point sequence, f i r sequence, it all means, that is length is finite, outside that window, from 0 to capital N minus 1, outside that is all 0. Using this window only, you have got non 0 values of $x[n]$.

Suppose $x[n]$ is given to me of that kind, this is not infinitely long; it is only finitely long over this region 0 to capital N minus 1, for some capital N . So, length is capital N , you are counting from 0, 0, 1, up to n minus 1. So, total length is capital N points. We call it n point sequence. For this also, we have the same DTFT expression, only thing is that summation will go from n equal to 0 to capital N minus 1, not from minus infinity to infinity, because outside that zone all samples are 0, but still it will be DTFT, to get that back, we should have this impulse DTFT.

So the entire wave form of DTFT is required, apparently, but now I will make a claim, that if this is given, it will not require this entire wave form. Just some samples of this,

will be enough. Not all the entire wave form. That is I do not, I mean, in order store the entire wave form, I need infinite memory, because all values how many values, from here to here, if you go continuously, infinite values, right? Omega, infinite values of Omega, from this ranges 0 to 2π , but if I say that, if the sequence is given to finite in length, then, I am saying, that I will not require this entire wave form, I will require only it is samples, some samples, because you taken appropriately and my claim is this samples are good enough, if I have capital N number of samples we will see, that, those samples are good enough for me, to get that back, get that x_n . I do not need the entire wave form. So, I need only to store some samples, actually capital N number of samples that is a claim I am making.

So let, I will have to justify the claim, but the claim I am making is this, this total zone, 0 to 2π right? This I will define in to, some sampling points, this period of sampling point, period, will be 2π by n. So, 0 to π by n, point π by n, 6π by n, dot, dot, dot. kth sample, kth will be a $2\pi k$ by n. So, this is a kth sample. This will be Omega equal to $2\pi k$ by n. So, if k is 0, Omega equal to $2\pi k$ by n. And k can be 0, if k is 0, Omega is here. If k is 1, 2π by n, I am here, if k is 2, 4π by n, I am here, and dot, dot, dot, for any k, it is here. So, I am just sampling, like this how many samples can I get? n minus, n samples, 0 samples, first sample, second sample like that, but if the last sample here. This has the $2\pi k$, it is the last sample. Last sample will be, n minus 1s sample, 0 sample, first sample, because I have divided the range 2π into n.

So, 2π by n, 2π by n, 2π by n, how many 2π by ns? This period's n times right. So, this is 2π by n, before the 0th sample. Next 2π by n, first sample, next 2π by n, second sample. So, capital Nth, 2π by n period, before that will be n minus 1th sample. 0th sample 1, 2π by n, first sample, another 2π by n, 2 second, sample 3 times 2π by n. So, n minus 1 sample, n times to π by n. Understand? I repeat it again, 0th sample, you go ahead 2π by n, first sample, you go ahead further, 2 into 2π by n, second sample, you go ahead further, 3 into 2π by n, then n minus 1th sample, you go ahead further, you cover this entire zone, n into 2π by n, that is 2π . That is why if you count, it will be n minus 1, 0th, first, 0th sample, first sample, second sample, dot, dot, dot, n minus 1th sample.

k will be 0, for zero th sample, k will be 1, for one th sample, dot, dot, dot, up to n minus 1. If you make k equal to n, it will be n, n canceling, Omega into 2π , and 2π means

this sample is same as original sample, because a periodicity, this is same as this. This is will not go out n th; it will go to n minus 1th sample. So, total will be 0 to n minus 1, which will be n sample. So, here generate sample, at Ω equal to $2\pi k$ by n , how much is the value that is DTFT? At this, this much Ω there is? That DTFT will be, $x[n]$ to the power $j\Omega n$ instead of Ω , it is $2\pi k$ by n .

So, by DTFT formula it will be $x[n] e^{j\Omega n}$, $j\Omega n$, but Ω is this. So, $2\pi k$ by n , this much is Ω , into small n , and small n will be what the range, but range is not from minus infinity to infinity, range is only for this, the instead of writing it as capital X , to the power $j 2\pi k$ by n , in short, just write it as a function of k . So, in the k th sample, that is called k th DFT of $x[n]$, DFT means, Discrete Fourier Transform, that is $x[n]$ is give sequence, a finite length sequence, of length capital N . I am sampling the DTFT at capital N number of point, not less than capital N , what is capital N ? It was a length of original time sequence.

If the length is capital N , that many at least that many, if I could take more, but at this that many samples is required of this envelop. If I take more, that will be in that finite length sequence, has further, and has more length larger than capital N , with extra zeros brought in. For instance, if I, suppose, instead of taking capital N number of sample, I take capital N plus 1 number of samples, there is 2π by capital N plus 1, is the period. Then it means, I am considering the time sequence to be of length, not capital N , but from capital N plus 1, that is 0 to capital N , not n minus 1, with a last sample as a 0.

So, it will not change to the DTFT summation. So, DTFT will remain same, but it will be like length n plus 1 sequence. Anyway to start with assume, that given sequence is length capital N , and I am sampling the envelop, there is a DTFT, at capital N point, which means the gap, sampling period is 2π by n , and 0 is sample, first sample, second sample k th, up to n minus 1 n th, is back to this. So, k th sample is called the k th DFT, which is by the DTFT formula simply this fine.

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$$= \sum_{\substack{n=0 \\ n \neq N}}^{N-1} x(n) \sum_{k=0}^{N-1} e^{j \frac{2\pi k}{N} (n-1)} + \underbrace{N x(N)}_0$$

But what is the big deal about it? So, my point is, giving this capital X_k , I will be able to get back my x_n , for n equal to 0, n equal to 1, upto capital N minus 1. Which means, this samples are good enough for me, to reconstruct x_n , I do not need the entire envelop, and the integral calculation to get back x_n . So, for that we see this, this is given, x_k , I am rewriting the same expression.

So, now suppose instead of n , I make it r , it is local index, does not matter, r . I want to find out, x_n , n can be 0, where n can be either 0, 1, dot, dot, dot, n minus 1, because that is the range of this sequence. So, sequence is located from n equal to 0, 1, up to capital N minus 1, outside this window, this fellow is 0. So, I am trying to find out x_n , n th sample, where n will be any of them, but if you fix n , of your choice, from this range, once if you fix, that is fixed. My question is how to get that x_n , fine. So, once n is known, left hand side, I multiply by, e to the power j , $2\pi k$, n by capital N . This k , same k I put, right hand side also, e to the power j , and this 2, e to the power combine, j $2\pi k$ by n , $2\pi k$ by n , it is small n , it is small n , it is minus r , minus r .

I am just multiplying both sides, capital X_k , for a particular k , this is the summation it is $\sum_{j=1}^n x_{j,n}$, by capital N , what is small n ? You want to find out, the n th sample, x_n , n is in this range. So, that when you put on this. So, right hand side, also multiply by the same thing, take that inside the summation, combine that to exponential, you will get this. Then what you do, I sum this over k , keeping n fixed. So, here also, this

after all, if you sum, it is sum over r . So, it is a function of n also, k also. So, I sum it over k . So, this becomes a function of n only, because after summing over k , k goes, the function of n this, also function of n , because inner summation was with respect to r .

So, summation, this becomes function of a then k , then you are summing further over k . So, if you become a function of n . But I know whenever there is double summation, the rule of thumb is, you should interchange the 2 summation. So, r will go out, x of r , it depends only on r so, I can happily keep it outside, k equal to 0 to n minus 1, e to the power $j, 2\pi k$, depends on k , which comes here, n minus r , all right? Now small n is your choice, you have fixed n in this range. r is varying over the same range, 0 to n minus 1. So, as r is going from 0 to capital N minus 1, r will become equal to small n , once, on another occasion, it is not equal to small n . So, I can write that right hand side, as r equal to 0 to n minus 1, but r not equal to small n , or equal to small n , in that case I will write it separately. So, then you have got $x r$, summation, k equal to 0 to n minus 1, e to the power $j, 2\pi k$, by n, n minus r as it is, but n, r is changing, and it is varying, but it is not equal to n . So, n minus r will be integer.

Positive, negative, does not matter, integer, it will not be 0. And r equal to n case, when r equal to n , it is $x n$, that case I am writing separately, if r equal to n , n minus n 0, it is got 0 n 1, you are adding capital N times, capital N times $x n$, this expression right? Now what happens to this series? It is a GP series, this is n minus r , or you can call it m , and it is, m is not 0, because r is not equal to n , in this summation. So, in this g p series, it will be 1 minus e to the power $j, 2\pi k$, not k , it is summed over $k, 2\pi m$ by n , and if you are summing 0 to capital N minus 1. So, n will come; divide by 1 minus e to the power $j 2\pi$.

Now look at the numerator, this cancels e to the power $j, 2\pi m$, m is an integer, positive negative integer does not matter, e to the power j to π to integer that is 1, 1 minus 1, 0. This is 0, but denominator, small m , by capital N , small m , is neither 0, and small n can not be equal to capital N , if it is capital N , then again e to the power $j 2\pi$, which is 1, 1 minus 1, 0, it will be 0 by 0, but that can not happen, because what is small n , small n was n minus r , right? n is varying from 0, 1, up to capital N minus 1, this n , and r also varying from 0, 1, dot, dot, dot, n minus 1.

So, n minus r , maximally can be, capital N minus 1. The difference can be, these minus 0, these minus 0, maximize. So, m , m can be maximally, capital N minus 1, or less than that, it can not be equal to capital N , it means, e to the power $j 2 \pi$ into this, this factor, can never be equal to 1, 1 minus 1, 0. 0 by 0 there will be case, does not exist, and arise. It will be something which will be non 0. Or it will be 0, it will require j , either m is 0, not possible, or m equal to capital N , that is not possible, because m is, n minus r , maximally, either maximum n or minimum r , or vice versa. Which is capital N minus 1 n minus 0, or 0 minus capital N minus 1, either case, it can not be equal to capital N , or minus capital N . So, therefore, this can not be 0. So, 0 by something non 0 is 0. So, this whole part disappears, which means I am left with n into x_n . So, what is n into x_n this summation.

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The image shows a whiteboard with handwritten mathematical formulas for the Discrete Fourier Transform (DFT) and its inverse. The forward DFT is given as $X(k) = \sum_{n=0}^{N-1} x(n) e^{-j 2 \pi k n / N}$ for $k = 0, 1, \dots, N-1$. The inverse DFT is given as $x(n) = \frac{1}{N} \sum_{k=0}^{N-1} X(k) e^{j 2 \pi k n / N}$ for $n = 0, 1, \dots, N-1$. The text "Inverse DFT" is written next to the second equation.

This part, I started with this, this are the correct, this is equal to n into x_n , which means x_n will be 1 by n , into this summation. This is called inverse DFT, that is, if this k sample, this samples, n number of sample of the DTFT, are available with b , capital X_k , capital X_0 , capital X_1 , capital X_2 , capital X minus 1, are available with b , I can write summation, where k is varying, so capital X_0 , capital X_1 , like that, and multiply by this factor, k is varying, n is your choice from outside.

So, this summation will give you a sample, original time data sample, at anything, next where n is, within the range. 0, 1, dot, dot, dot, n minus 1, which means, I can reconstruct

my finite line sequence, n point sequence, from this samples, capital X_0 , capital X_1 , up to capital X_{n-1} . That is, from this fellows only, I do not need the entire wave form, entire envelop. So, just I need storage for only n points. This is the fantastic result. So, what is x_k ? x_k is the called n point DFT. Here you are summing over n , k is fixed of your choice, k range was 0th sample, first sample, or up to $n-1$ sample. So, find this x_k s, DFTs, then using them, you can get your x_n this is inverse DFT. Please go through this, we will meet again in the class, but I need full clarity on this.

Thank you very much.