

$$j = \sqrt{-1}$$



Oscillations are everywhere!



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Let's start with a little warning. To make the most of this lecture, you have to be familiar with the notation e to the power of jX , where j is the imaginary unit. If you're not, perhaps a little review of your complex algebra textbook is in order. We have said that in nature oscillations are everywhere from the heartbeat to engines to waves to musical instruments.

Notes

Summary



0m 00s

- ▶ sustainable dynamic systems exhibit oscillatory behavior
- ▶ intuitively: things that don't move in circles can't last:
 - bombs
 - rockets
 - human beings...

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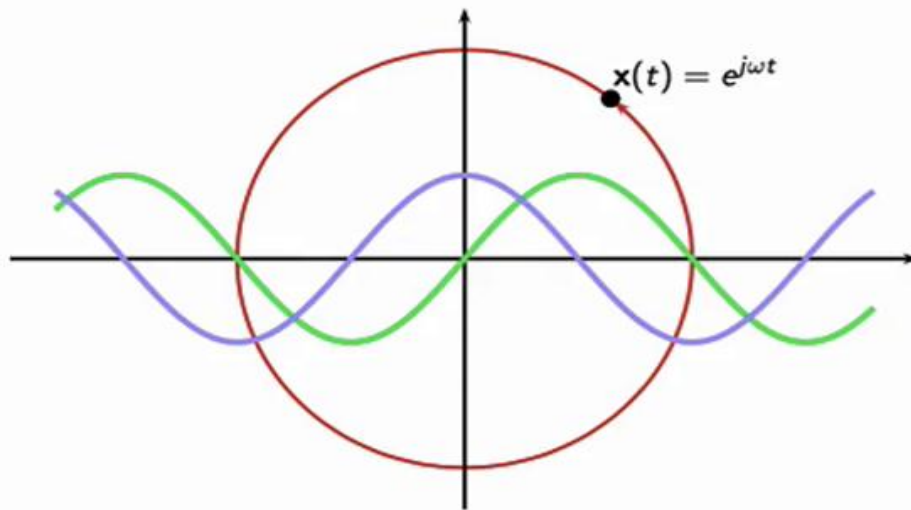
The fact is, the sustainable dynamic systems must exhibit an oscillatory behaviour. Somehow you have to have something that comes back to its initial state, because things that don't move in circle cannot really last for a long time. So for instance, a bomb has a lot of energy, but the release of energy is unidirectional and so not sustainable. Rockets same way, and unfortunately, human beings as well. Although many parts inside our bodies do work in circular patterns.

Notes

Summary



0m 24s



4

An oscillation is the product of a rotation. You take a point on the plane, you make it go around in a circle, you create an oscillatory behaviour. If you put a coordinate systems around the centre of the oscillation you can describe the vertical and horizontal displacement of this point as it goes around the circle with a cosine and a sine function. So you always have two trigonometric functions that work together to describe the position of something that turns around in circles. Perhaps it's easier to use a complex reference system centred on the origin of the oscillation and use a complex exponential to describe the position of the point on the plane. So we will say that the position of the point is described by a complex exponential $e^{j\omega t}$, where ω is the rotation frequency. So here we are in standard algebraic terms where t is a real variable that indicates time.

Notes

Summary



0m 53s

The discrete-time oscillatory heartbeat



Ingredients:

- ▶ a frequency ω (units: radians)
- ▶ an initial phase ϕ (units: radians)
- ▶ an amplitude A

$$\begin{aligned}x[n] &= \underline{Ae^{j(\omega n + \phi)}} \\ &= A[\cos(\omega n + \phi) + j \sin(\omega n + \phi)]\end{aligned}$$

5

In discrete time, things are a little bit different. The discrete time oscillatory heartbeat has three fundamental ingredients a frequency ω , where the units are radians and not radians over seconds because our "time variable is a dimensional, it has an initial phase ϕ and an amplitude A ," and the discrete time sequence is a times e to the j ωn plus ϕ . We can use Euler's formula to decompose this into a real and imaginary part, and so we have a times cosine of ωn plus ϕ plus j sin of ωn plus ϕ .

Notes

Summary



1m 48s

Why complex exponentials?



- ▶ we can use complex numbers in digital systems, so why not?
- ▶ it makes sense: every sinusoid can always be written as a sum of sine and cosine
- ▶ math is simpler: trigonometry becomes algebra

6

Why use complex exponentials instead of explicit sin and cosine functions? Well, first of all, we're all building our own digital signal processing world. We said we can use complex numbers in digital systems, so why not? But it makes sense, because every circular motion is always a sine and cosine intertwined and Euler's formula compactly brings them together in one single function. It makes math simpler because trigonometry becomes simple algebra.

Notes

Summary



2m 29s

Example: change the phase of a cosine the "old-school" way

$$\cos(\omega n + \phi) = a \cos(\omega n) - b \sin(\omega n), \quad a = \cos \phi, \quad b = \sin \phi$$

- ▶ we have to remember complex trigonometric formulas
- ▶ we have to carry more terms in our equations

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For instance, let's try and change the phase of a cosine in the old school trigonometric way. So if we have cosine of omega n plus phi, then we have to remember the trigonometric identities for the sum of angles and we know that the result will be something like A times the cosine of the first term plus b times the sin of the first term. But do we remember if it's plus or minus? Or do we remember the values for a and b and so on and so forth? So it's kind of a mess and very much error prone.

Notes

Summary



3m 01s

Example: change the phase of a pure cosine with complex exponentials

$$\cos(\omega n + \phi) = \operatorname{Re}\{e^{j(\omega n + \phi)}\} = \operatorname{Re}\{e^{j\omega n} e^{j\phi}\}$$

- ▶ sine and cosine "live" together
- ▶ phase shift is simple multiplication
- ▶ notation is simpler

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Conversely, if we try and change the phase using complex algebra, we have the cosine of $\omega n + \phi$ is simply the real part of $e^{j(\omega n + \phi)}$. Now we can decompose this complex exponential into the product of two complex exponentials. We have no problem performing the multiplication of two complex numbers when we separate the real imaginary parts and then we get the result without any mnemonic effort. So sine and cosines live together, phase shift becomes simple multiplication and the notation is way simpler. Okay, so the complex exponential is our friend, let's get to know it a little bit better.

Notes

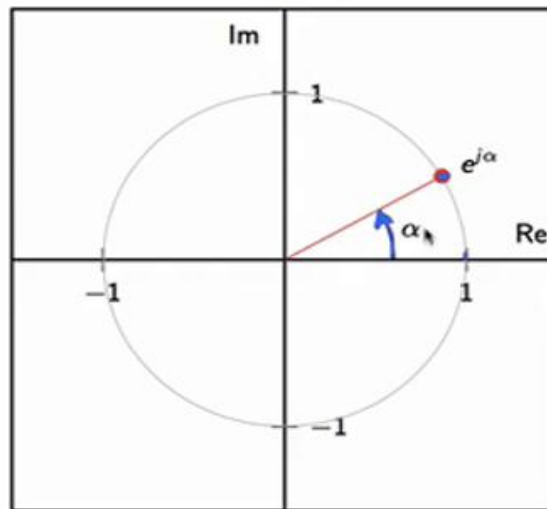
Summary



3m 31s

$$e^{j\alpha} = \cos \alpha + j \sin \alpha$$

$$|e^{j\alpha}| = 1$$



9

The complex number $e^{j\alpha}$ is a complex number with real part cosine of α and imaginary part sine of α . In magnitude $e^{j\alpha}$ is always equal to one. So the point $e^{j\alpha}$ always lives on the unit circle. How we find this point? Well, we travel along the unit circle counterclockwise until we reach an angle equal to α where α is expressing radian and that is the position of our complex exponential.

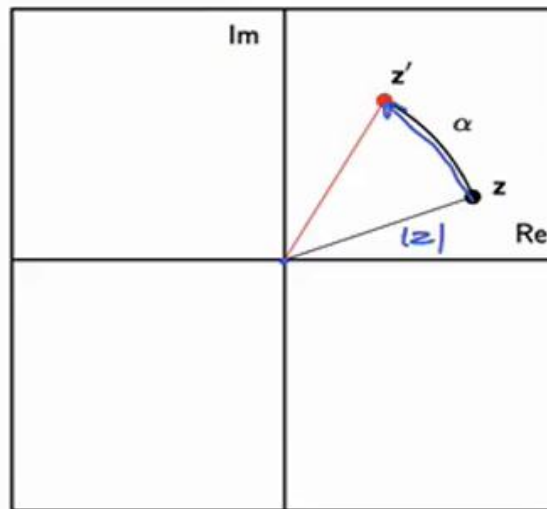
Notes

Summary



4m 12s

rotation: $z' = z e^{j\alpha}$



10

If we have any point on the complex plane and we multiply this point by $e^{j\alpha}$, we are rotating this point counterclockwise by an angle α on a circle centred in the origin and with radius equal to the magnitude of z . So we can use multiplication by a complex exponential to rotate any point on the complex plane.

Notes

Summary

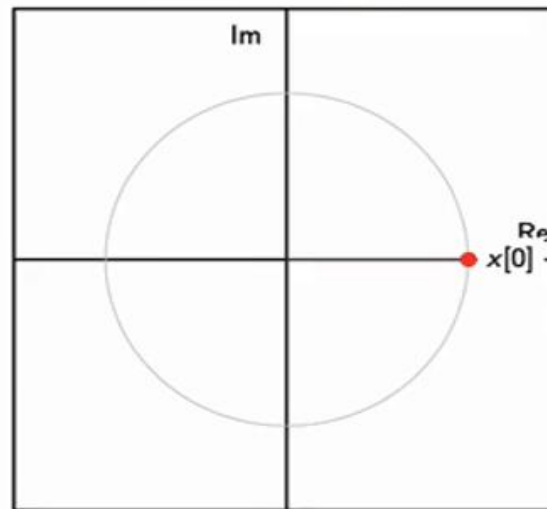


4m 41s

The complex exponential generating machine



$$x[n] = e^{j\omega n}; \quad x[n+1] = e^{j\omega} x[n]$$



$$x[0] = 1$$

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This is actually at the heart of the complex exponential generating machine that will create all these complex exponential signals that we will use in the future. So a sequence like x of n equal to e to the j omega n , where omega is the frequency of the complex exponential sequence, can be obtained at each step by multiplying the previous point in the sequence by e to the j omega. So this is how we recursively generate a complex exponential sequence. If we plot the sequence of points on the plane, it would all start at one location. So let's assume that x is zero is equal to one and so the next step will be one times e to the j omega and we will have moved here by an angle omega counterclockwise around the unit circle.

Notes

Summary

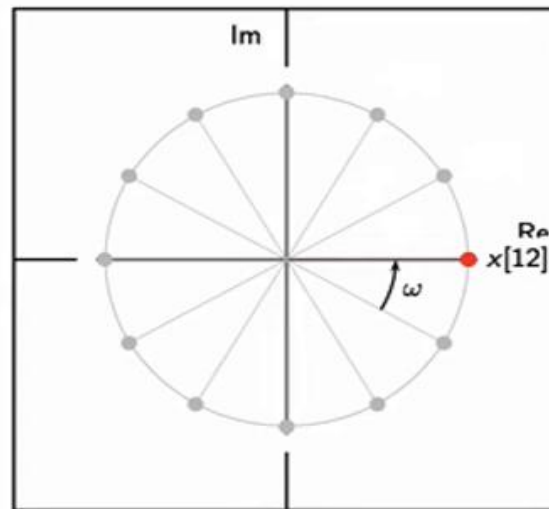


5m 10s

The complex exponential generating machine



$$x[n] = e^{j\omega n}; \quad x[n+1] = e^{j\omega} x[n]$$



$$\omega = \frac{2\pi}{12}$$

11

Then the next step, we will move by another angle ω and so on and so forth. That's how we generate a complex exponential signal. Here in this example you see that after 12 steps we go back to the original point. So clearly we can say that ω is equal to 2π divided by 12, because in 12 steps we have gone back to the starting point. After going around the circle, the sequence repeats.

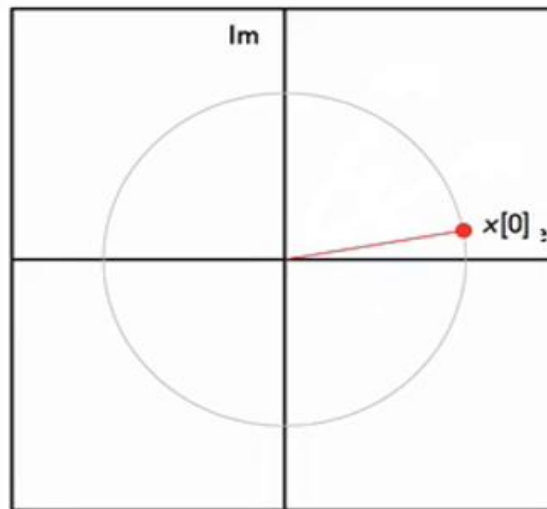
Notes

Summary



6m 01s

$$x[n] = e^{j(\omega n + \phi)}; \quad x[n+1] = e^{j\omega} x[n], \quad x[0] = e^{j\phi}$$



12

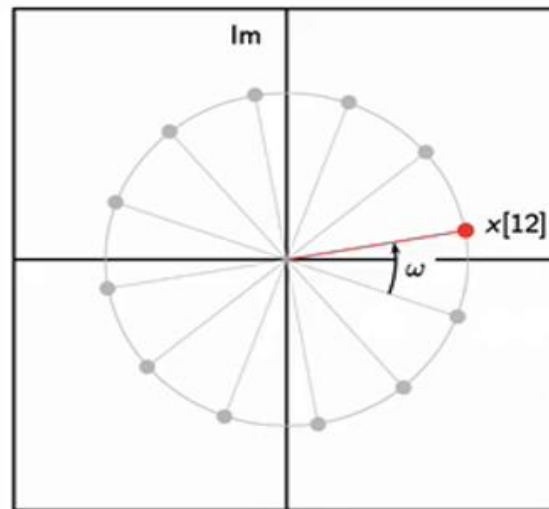
Of course, the initial point need not be one. We can start at any arbitrary point on the complex plane and the complex exponential sequence will proceed exactly in the same way where we advance counterclockwise by an angle ω at each step.

Notes

Summary



$$x[n] = e^{j(\omega n + \phi)}; \quad x[n+1] = e^{j\omega} x[n], \quad x[0] = e^{j\phi}$$



12

Here, for instance, we keep the same frequency of two pi over 12 and so we will repeat the pattern once again every 12 steps.

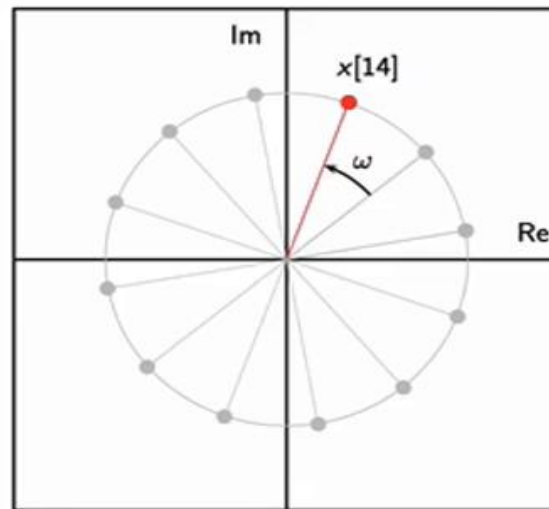
Notes

Summary



6m 45s

$$x[n] = e^{j(\omega n + \phi)}; \quad x[n+1] = e^{j\omega} x[n], \quad x[0] = e^{j\phi}$$



12

Now, so far there haven't been any surprises with respect to standard complex algebra. But here is one key fact about discrete time complex exponentials.

Notes

Summary

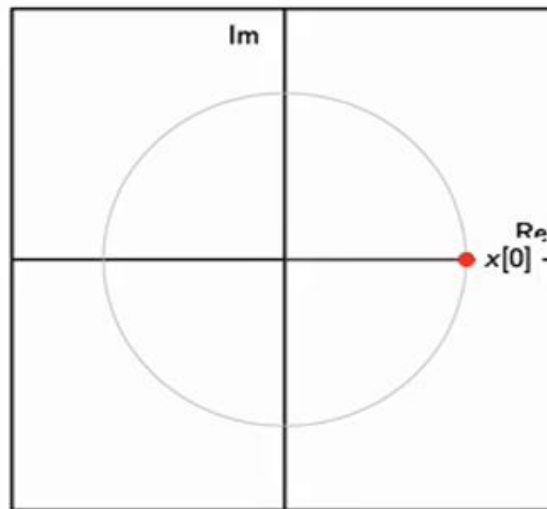


6m 53s

Careful: not every sinusoid is periodic in discrete time



$$x[n] = e^{j\omega n}; \quad x[n+1] = e^{j\omega} x[n]$$



13

In discrete time, not every sinusoid is periodic.

Notes

Summary

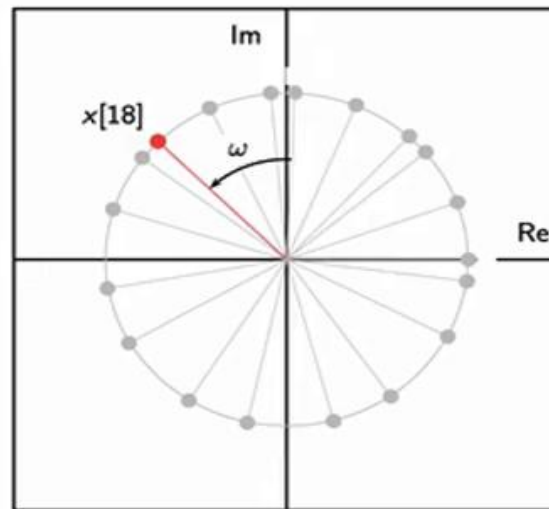


7m 03s

Careful: not every sinusoid is periodic in discrete time



$$x[n] = e^{j\omega n}; \quad x[n+1] = e^{j\omega} x[n]$$



13

As a matter of fact, if you choose an arbitrary ω , there's a high probability that you will never end up on any of the previous points in your complex exponential sequence, as you can see in this picture here.

Notes

Summary



7m 07s

$$e^{j\omega n} \text{ periodic in } n \iff \omega = \underbrace{\frac{M}{N} 2\pi}_{\text{blue bracket and arrow}}, M, N \in \mathbb{N}$$

14

What happens in fact is that the complex exponential is periodic in n only if the frequency is a rational multiple of two pi. So it is of the form of a fraction a ratio of two integers times two pi.

Notes

Summary



$$\begin{aligned}
 x[n] &= x[n + N] \\
 e^{j(\omega n + \phi)} &= e^{j(\omega(n+N) + \phi)} \\
 e^{j\omega n} e^{j\phi} &= e^{j\omega n} e^{j\omega N} e^{j\phi} \\
 e^{j\omega N} &= 1 \\
 \omega N &= 2M\pi, \quad M \in \mathbb{Z} \\
 \omega &= \underbrace{\frac{M}{N}}_{\text{rational}} 2\pi
 \end{aligned}$$

It is rather easy to see why it must be so. Remember, the condition for periodicity for a discrete time sequence is the following $x[n] = x[n + N]$, where N is an integer indicating the period of the sequence. If we now use complex exponential sequences explicitly, we have $e^{j(\omega n + \phi)} = e^{j(\omega(n+N) + \phi)}$. So ω and ϕ arbitrary frequencies and phase. We can now dismantle this equation by splitting the complex exponentials into products of individual terms like in this line here. If we now simplify the terms that are left and right, we obtain that the condition of periodicity is simply $e^{j\omega N} = 1$. This poses a condition on ω , because this expression is true only when ωN is a multiple of 2π . That's when the complex exponential hits the unit on the complex plane. So we can rewrite this as $\omega N = 2M\pi$ with M an integer again. We obtain finally the condition on the frequency for the complex exponential which is what we said, a rational multiple of 2π .

Notes

Summary



$$\underbrace{e^{j\alpha}} = \underbrace{e^{j(\alpha+2k\pi)}} \quad \forall k \in \mathbb{Z}$$

15

Now let's go back to an arbitrary point on the unit circle $e^{j\alpha}$. It is clear that we can add any multiple of two pi, positive or negative two alpha, and land exactly in the same position.

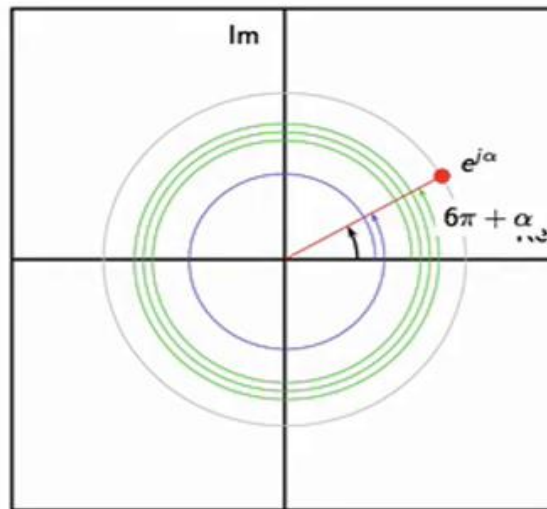
Notes

Summary



8m 57s

2π -periodicity: one point, many names



16

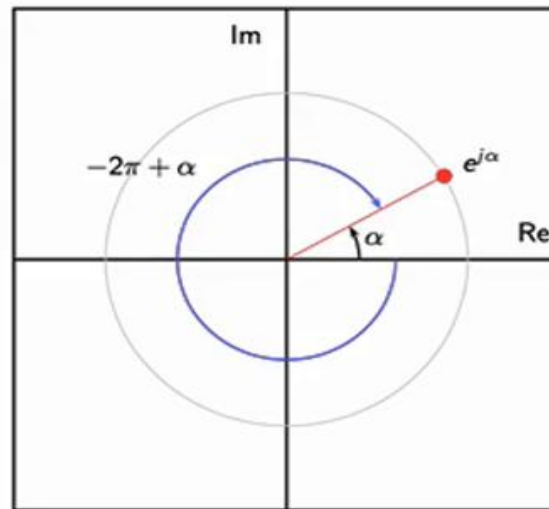
In other words, the same point on the unit circle can have many names. It could be $e^{j\alpha}$ or $e^{j(2\pi + \alpha)}$, or say $e^{j(6\pi + \alpha)}$.

Notes

Summary



9m 12s



17

Alternatively, it could be $e^{j(-2\pi + \alpha)}$, and so on and so forth. So one point many names, this we call aliasing. The consequence of aliasing the consequence of this natural property of the complex exponential is that in discrete time it puts a limit on how fast we can go around the unit circle with a discrete time signal. You may have experienced the consequences of this upper limit on the speed that we can achieve in discrete time when looking, say, at an old western movie, and you have a stage coach that rolls into the frame of the movie.

Notes

Summary



9m 26s

How “fast” can we go?



22

33

Although the stagecoach is moving in one direction, the wheels appear to be moving alternately backwards and forwards in a sort of unpredictable pattern, as in the example that we're playing right now.

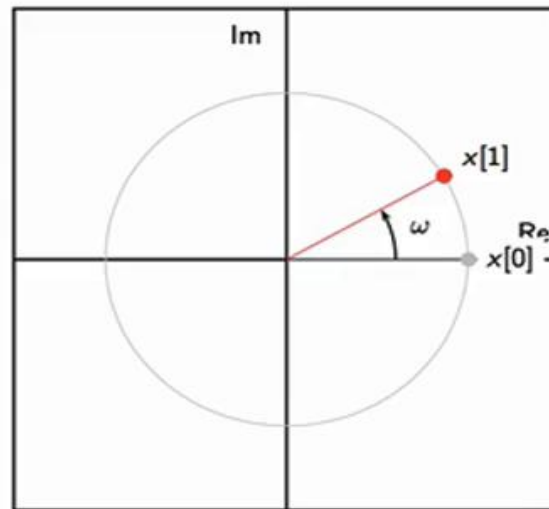
Notes

Summary



10m 03s

Remember the complex exponential generating machine



21

To see why this happens, let's go back to the concept of this complex exponential generating machine. It is rather intuitive to see that the frequency of this machine is restricted to the interval zero to two pi.

Notes

Summary



10m 17s

$$0 \leq \omega < 2\pi$$

20

If we try and use a frequency that is larger than two pi, what happens is we incur automatically into allusion.

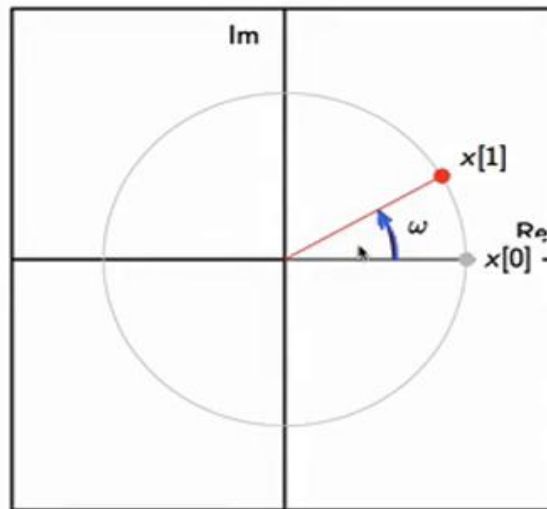
Notes

Summary



10m 31s

Remember the complex exponential generating machine



21

Remember, for instance, if at each step we're moving by an angle ω in creating the next sample, well, we would have exactly the same result if we use a step which is ω plus an arbitrary multiple of two π .

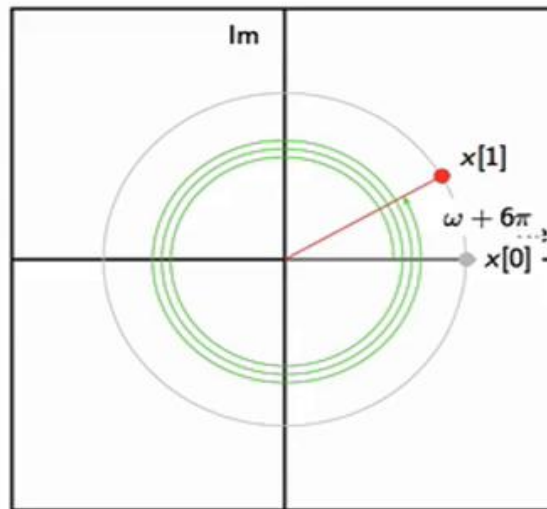
Notes

Summary

10m 39s



Remember the complex exponential generating machine



21

So whenever we go outside of the zero two pi range, because of the inherent two pi periodicity of the complex exponential, we fall back via a modular operation into the zero two pi range. But even within that range, we have to be careful about the backwards and forwards motions. So let's analyse this in more detail.

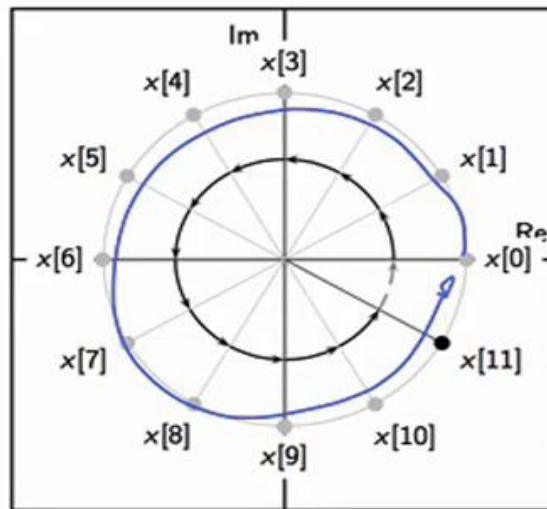
Notes

Summary



10m 54s

$$\omega = 2\pi/12$$



19

Here in the picture you have the first 12 samples of a discrete time complex exponential at a frequency two pi over 12. This sequence takes 12 samples to go one full revolution around the unit circle.

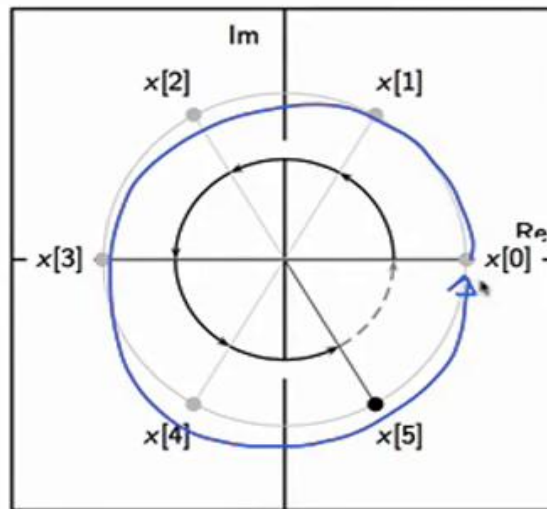
Notes

Summary



11m 16s

$$\omega = 2\pi/6$$



20

If we want to go faster, then we have to choose a faster frequency. So for instance, if we pick omega equal to two pi over six, it will only take six steps to complete a full revolution. Let's go even faster.

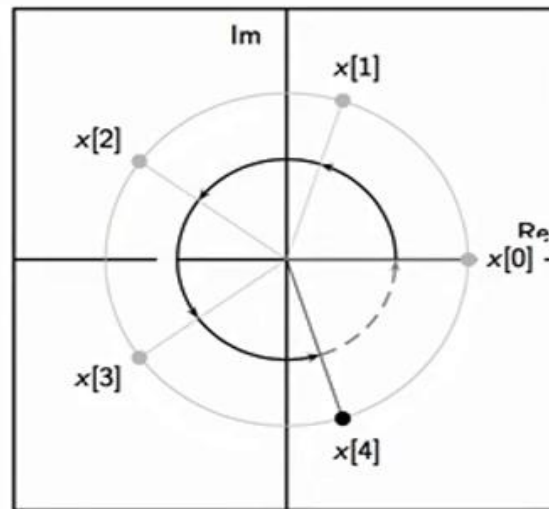
Notes

Summary



11m 30s

$$\omega = 2\pi/5$$



21

Two phiover five will require five steps.

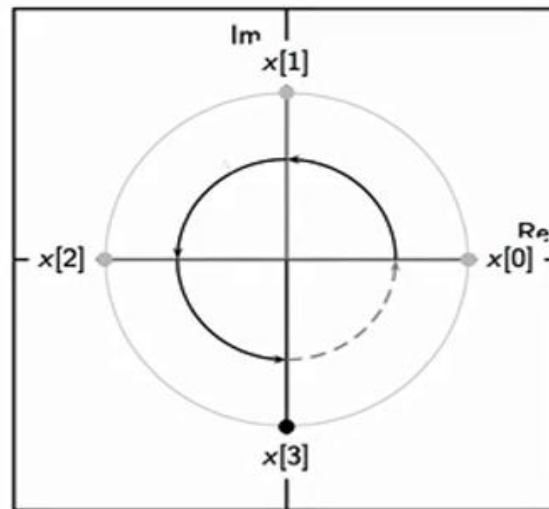
Notes

Summary



11m 44s

$$\omega = 2\pi/4$$



22

Two phiover four will require four steps.

Notes

Summary

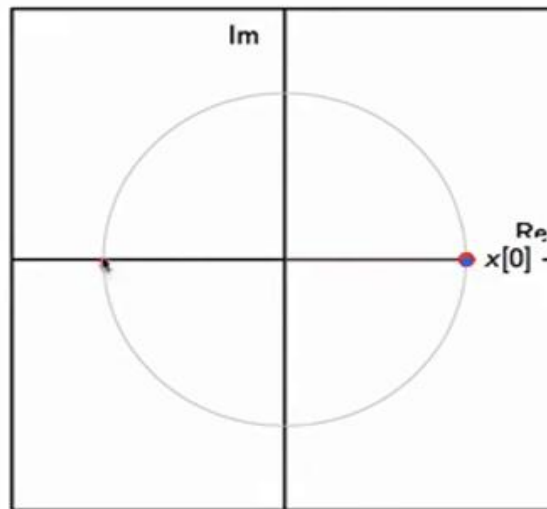


11m 46s

How "fast" can we go?



$$\omega = 2\pi/2 = \pi$$



24

Two phiover three, three steps and finally, if we take a frequency of two phiover two equal to pi, we have a rotation that is not really a rotation. We're just oscillating between this point and this point.

Notes

Summary

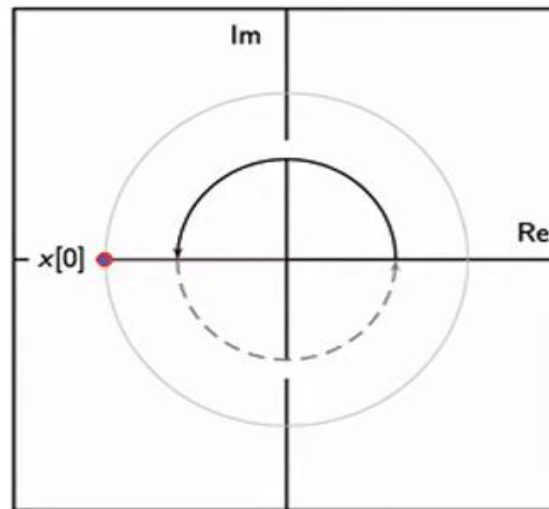


11m 49s

How "fast" can we go?



$$\omega = 2\pi/2 = \pi$$



24

So we're completing half of the circle at each step.

Notes

Summary

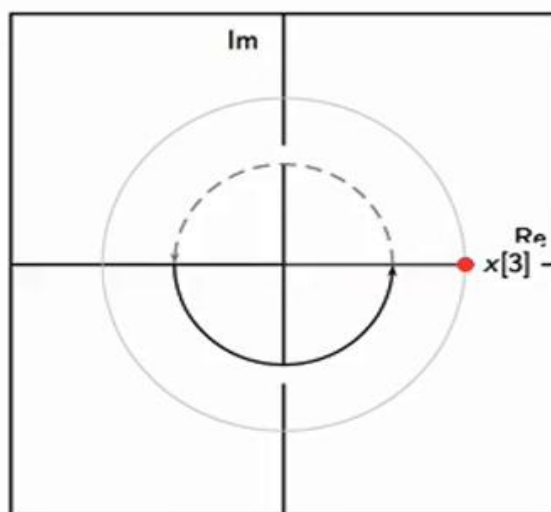
12m 02s



How "fast" can we go?



$$\omega = 2\pi/2 = \pi$$



24

Can we go any faster than that?

Notes

Summary

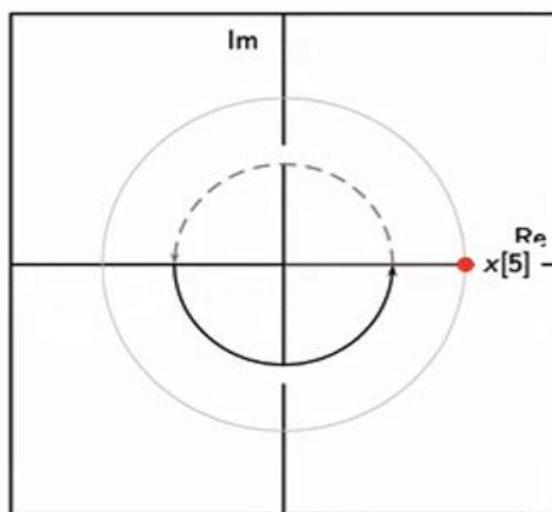


12m 05s

How “fast” can we go?



$$\omega = 2\pi/2 = \pi$$



24

Well, the answer is not really.

Notes

Summary

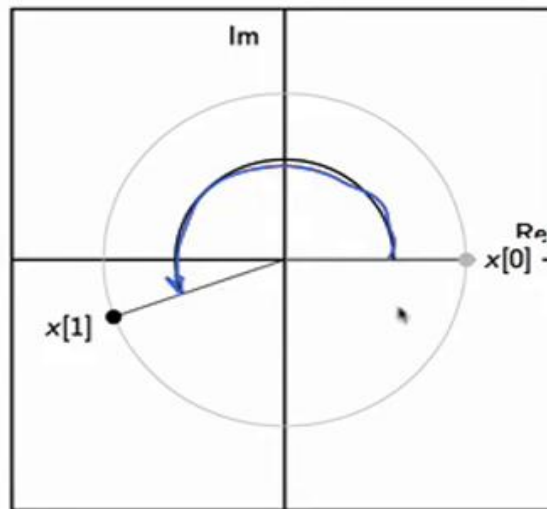


12m 08s

What if we go "faster"?



$$\pi < \omega < 2\pi$$



25

If we try to take a frequency that is bigger than π , so say ω bigger than π and less than 2π , we will be travelling more than half the circle in one step. But another way to look at this move, if you want, is that the point has travelled ω minus 2π in the clockwise direction instead.

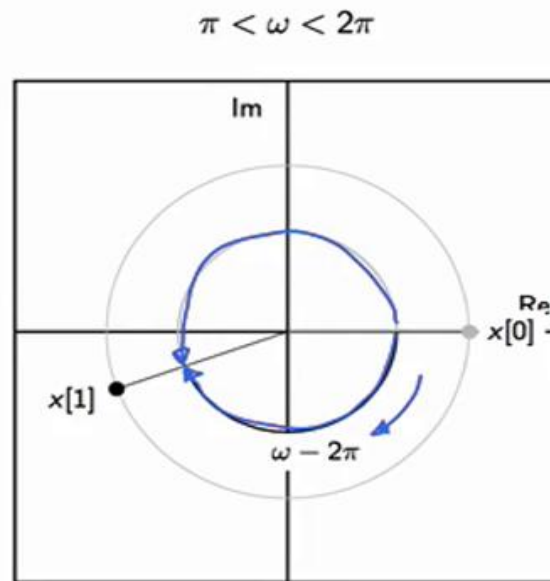
Notes

Summary



12m 09s

What if we go "faster"?



25

This angle is a magnitude smaller than this angle. So in a sense, trying to go faster than π at each step corresponds to going slower in the other direction.

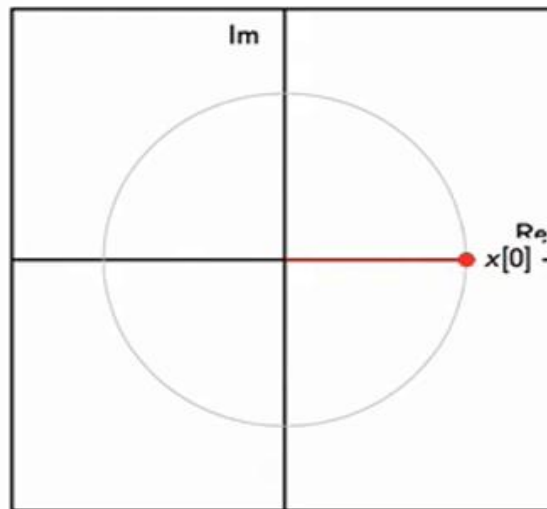
Notes

Summary



12m 31s

$$\omega = 2\pi - \alpha, \quad \alpha \text{ small}$$



26

The thing is exacerbated if we take frequency omega, which is equal to two pi minus alpha with alpha small. Now, at each step we're going almost a full circle.

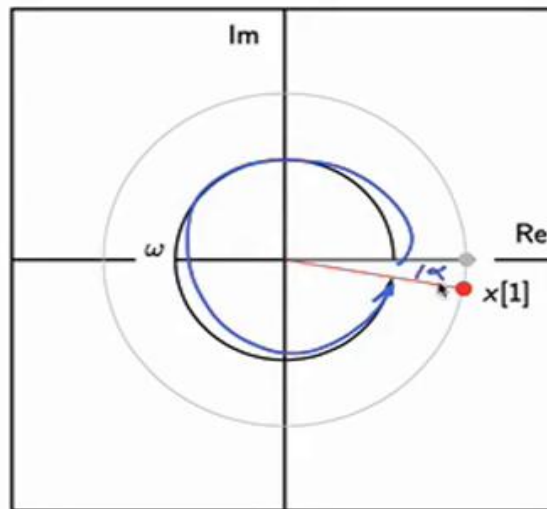
Notes

Summary



12m 45s

$$\omega = 2\pi - \alpha, \quad \alpha \text{ small}$$



26

The first step will be like so we go all the way around minus a little tiny alpha here, and then we continue.

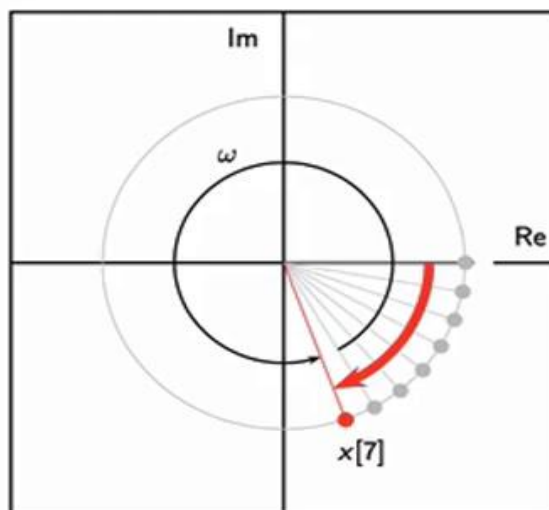
Notes

Summary

12m 56s



$$\omega = 2\pi - \alpha, \quad \alpha \text{ small}$$



26

At each step we repeat the same large movement. As we accumulate these angles, you can see that the apparent motion, even at the slow speed at which I'm changing the slides, correspond to a clockwise motion at the speed of alpha. Remember, alpha is very small. That's really what's happening to the wheels of the stage coach. They're moving too fast with respect to the frame rate of the film camera.

Notes

Summary



13m 03s

How "fast" can we go?

90.00



22

33

To illustrate Aliasing in more dramatic detail, here's a video obtained by artificially rotating the picture of a bicycle wheel with four spokes. This wheel has a fourfold symmetry, and the alloys and angles will alternate faster than if we had a single point rotating around the unit circle. As the angular velocity increases and the angular velocity is displayed in degrees per frame in the top left corner of the video, we can see that the motion alternates between a forward motion to a backwards motion and then a sense of stationarity as the angle is around 45 degrees, and then forward motion again, and so on and so forth. But if we look at the hub of the wheel, which is not perfectly symmetric in the picture, then we can see that the actual motion of the frames is always forward at an increasing angular speed.

Notes

Summary



13m 28s