Chapter 5 APPLICATION OF TRANSFORM THEORY TO SYSTEMS 5.5.4 Aliasing

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> > July 10, 2018

Frame # 1 Slide # 1

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♦ When a continuous-time signal that contains frequencies outside the baseband -ω_s/2 < ω < ω_s/2 is sampled, a phenomenon known as *aliasing* will arise whereby frequencies outside the baseband impersonate frequencies within the baseband.

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- This presentation explores the nature of aliasing in DSP.

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- Aliasing is objectionable in practice and it must be prevented from occurring.
- This presentation explores the nature of aliasing in DSP.
- Aliasing can occur in other types of systems where sampled signals are involved, for example, in videos and movies, as will be demonstrated.

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Aliasing in DSP

Consider a continuous-time sinusoidal signal with frequency $\omega + \omega_s$ rad/s, i.e.,

$$x(t) = \sin[(\omega + \omega_s)t]$$

where $0 < \omega < \omega_s/2$.

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$$x(t) = \sin[(\omega + \omega_s)t]$$

where $0 < \omega < \omega_s/2$.

• By sampling the signal using a sampling frequency of ω_s rad/s, a discrete-time sinusoidal signal with frequency $\omega + \omega_s$ rad/s, i.e.,

$$x(nT) = \sin[(\omega + \omega_s)nT]$$

will be generated.

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$$x(nT) = \sin[(\omega + \omega_s)nT]$$

• Signal x(nT) can be expressed as

$$\begin{aligned} x(nT) &= \sin \omega nT \cos \omega_s nT + \cos \omega nT \sin \omega_s nT \\ &= \sin \omega nT \cos \left(\frac{2\pi}{T} \cdot nT\right) + \cos \omega nT \sin \left(\frac{2\pi}{T} \cdot nT\right) \\ &= \sin \omega nT \cos 2n\pi + \cos \omega nT \sin 2n\pi \\ &= \sin \omega nT \end{aligned}$$

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Evidently, sampling a sinusoidal signal of frequency ω + ω_s will produce a discrete-time signal which is numerically identical to the discrete-time signal obtained by sampling a sinusoidal signal of frequency ω.

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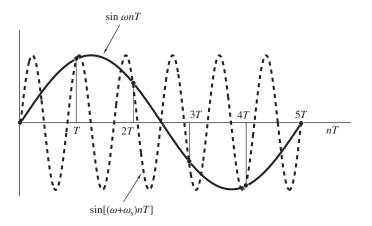
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- Evidently, sampling a sinusoidal signal of frequency ω + ω_s will produce a discrete-time signal which is numerically identical to the discrete-time signal obtained by sampling a sinusoidal signal of frequency ω.
- In effect, the sampled version of signal sin[(ω + ω_s)t] will be aliased to the sampled version of sin(ω)t or frequency ω + ω_s will be aliased to ω.



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• Now consider a sinusoidal signal

$$x(nT) = \sin[(\omega_s - \omega)nT]$$

where $0 < \omega < \omega_s/2$.

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$$x(nT) = \sin[(\omega_s - \omega)nT]$$

where $0 < \omega < \omega_s/2$.

As before, we can write

$$\begin{aligned} x(nT) &= \sin(\omega_s - \omega)nT \\ &= \sin\omega_s nT \cos\omega nT - \cos\omega_s nT \sin\omega nT \\ &= \sin\left(\frac{2\pi}{T} \cdot nT\right) \cos\omega nT - \cos\left(\frac{2\pi}{T} \cdot nT\right) \sin\omega nT \\ &= \sin 2n\pi \cos\omega nT - \cos 2n\pi \sin\omega nT \\ &= -\sin\omega nT = \sin(-\omega nT) \end{aligned}$$

Frame **# 6** Slide **#** 13

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• In this case, frequency $\omega_s - \omega$ will be aliased to frequency $-\omega$.

Frame # 6 Slide # 14

 Aliasing has occurred in the sinusoidal signals considered because the frequencies of the signals were outside the baseband −ω_s/2 < ω < ω_s/2.

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- Aliasing has occurred in the sinusoidal signals considered because the frequencies of the signals were outside the baseband −ω_s/2 < ω < ω_s/2.
- If a signal has several frequency components outside the baseband, then all the frequencies beyond the Nyquist frequency will be aliased and a rather serious type of signal distortion will occur, which is known as aliasing distortion.

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- If a signal has several frequency components outside the baseband, then all the frequencies beyond the Nyquist frequency will be aliased and a rather serious type of signal distortion will occur, which is known as aliasing distortion.
- Aliasing can be prevented by *filtering out* all frequency components outside the baseband using a lowpass filter.

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- If a signal has several frequency components outside the baseband, then all the frequencies beyond the Nyquist frequency will be aliased and a rather serious type of signal distortion will occur, which is known as aliasing distortion.
- Aliasing can be prevented by *filtering out* all frequency components outside the baseband using a lowpass filter.
- Filtering out the high-frequency content of the signal with a lowpass filter will, of course, distort the signal but the distortion introduced is less serious than aliasing distortion (see Chap. 6).

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Aliasing at the Movies

 Aliasing can occur in other types of systems that rely on sampling.

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Aliasing at the Movies

- Aliasing can occur in other types of systems that rely on sampling.
- A movie is a sequence of still photographs which constitutes a sampled signal.

If the sampling rate (frames/second) is not fast enough to deal with the images projected, funny things can happen.

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Aliasing at the Movies

- Aliasing can occur in other types of systems that rely on sampling.
- A movie is a sequence of still photographs which constitutes a sampled signal.

If the sampling rate (frames/second) is not fast enough to deal with the images projected, funny things can happen.

For example, as the cowboy wagon accelerates into the sunset, the wheels of the wagon appear to accelerate in the forward direction, then reverse, slow down, stop momentarily, and after that they accelerate again in the forward direction. This is what should be seen, it's not an illusion!

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Aliasing at the Movies Cont'd

The slides that follow show a wagon wheel with a black dot.

 The number of wheel revolutions per second is analogous to frequency, say, ω.

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Aliasing at the Movies Cont'd

The slides that follow show a wagon wheel with a black dot.

- The number of wheel revolutions per second is analogous to frequency, say, ω.
- The number of film frames per second, N, times the number of wheel revolutions per second is analogous to the sampling frequency ω_s, i.e.,

$$\omega_{s} = N\omega$$
 or $\omega = \omega_{s}/N$

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Aliasing at the Movies Cont'd

The slides that follow show a wagon wheel with a black dot.

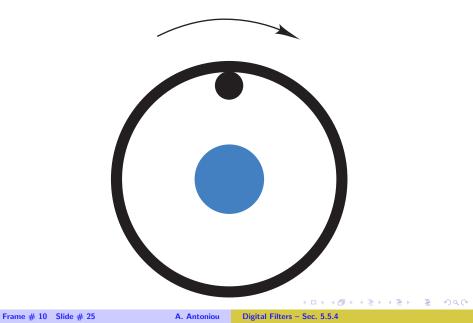
- The number of wheel revolutions per second is analogous to frequency, say, ω.
- The number of film frames per second, N, times the number of wheel revolutions per second is analogous to the sampling frequency ω_s, i.e.,

$$\omega_s = N\omega$$
 or $\omega = \omega_s/N$

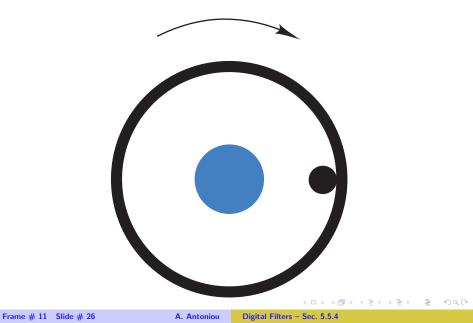
 Rotation in the clockwise or counterclockwise direction is analogous to positive or negative frequency.

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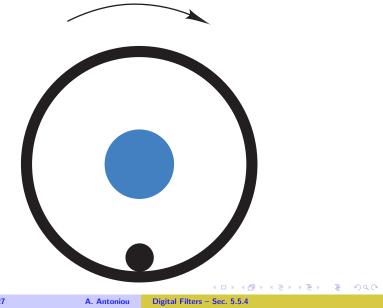
 $\omega = \omega_s/4$, Frame #1



 $\omega = \omega_s/4$, Frame #2

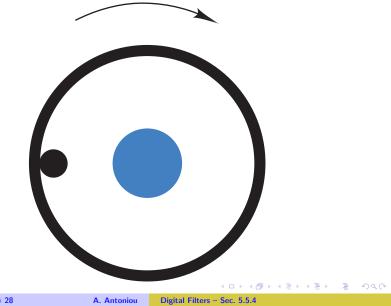


 $\omega = \omega_s/4$, Frame #3



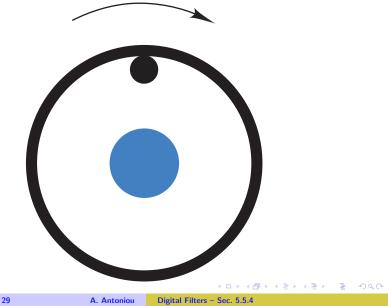
Frame # 12 Slide # 27

 $\omega = \omega_s/4$, Frame #4



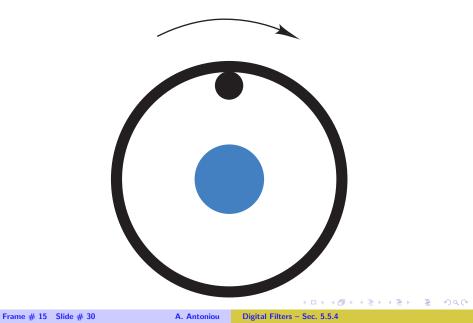
Frame # 13 Slide # 28

 $\omega = \omega_s/4$, Frame #5

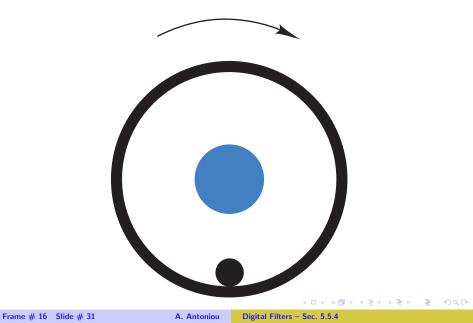


Frame # 14 Slide # 29

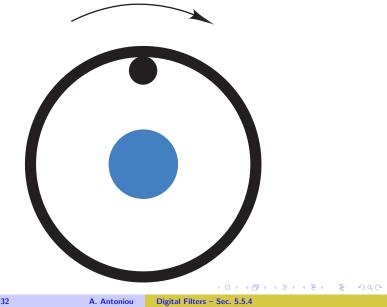
 $\omega = \omega_s/2$, Frame #1



 $\omega = \omega_s/2$, Frame #2

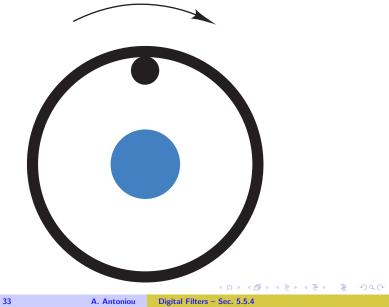


 $\omega = \omega_s/2$, Frame #3



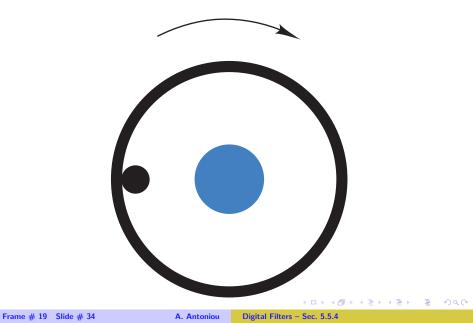
Frame # 17 Slide # 32

 $\omega = 3\omega_s/4$, Frame #1

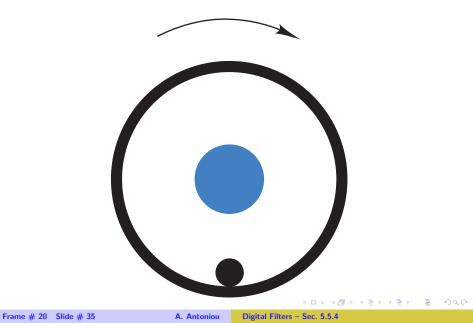


Frame # 18 Slide # 33

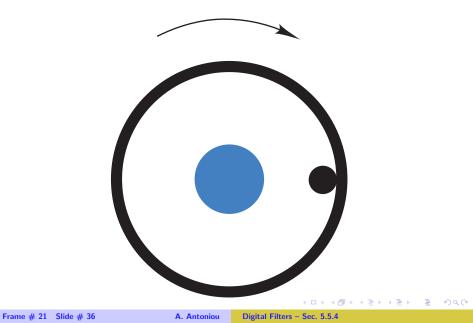
 $\omega = 3\omega_s/4$, Frame #2



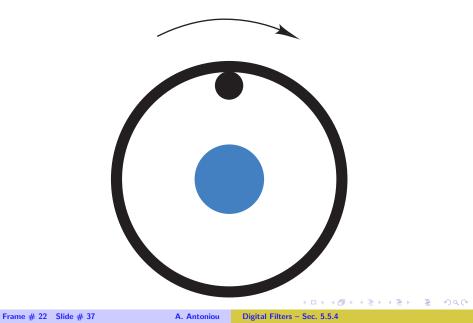
 $\omega = 3\omega_s/4$, Frame #3

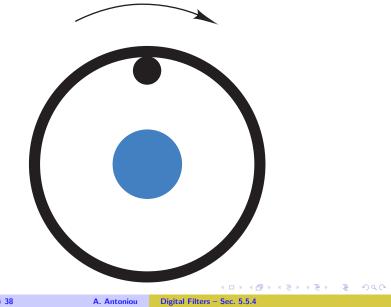


 $\omega = 3\omega_s/4$, Frame #4



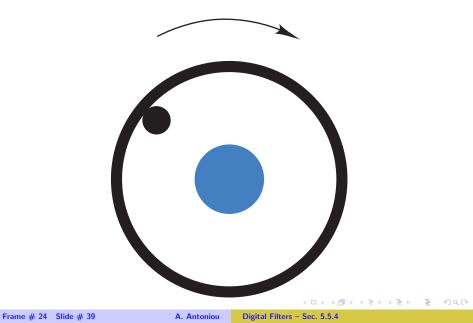
 $\omega = 3\omega_s/4$, Frame #5

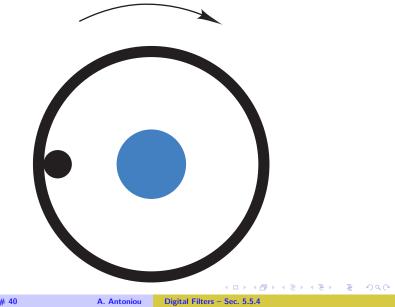




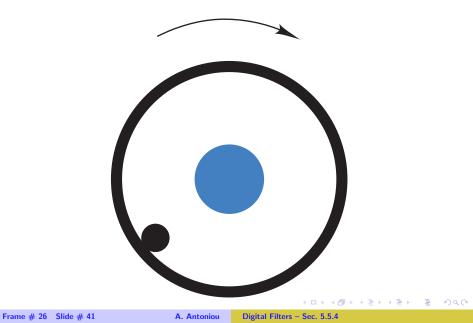
Frame # 23 Slide # 38

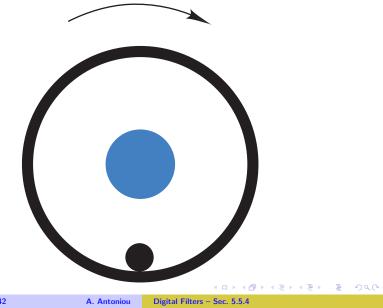
 $\omega = 7\omega_s/8$, Frame #2



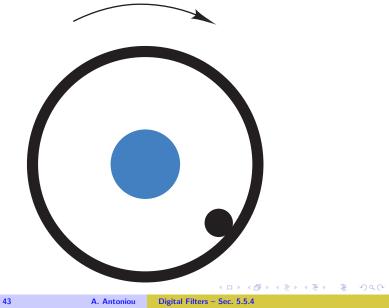


Frame # 25 Slide # 40

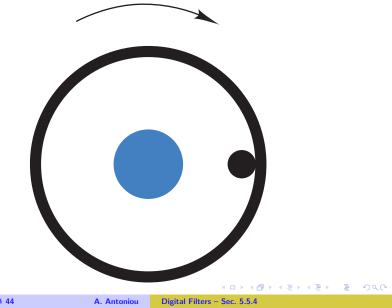




Frame # 27 Slide # 42

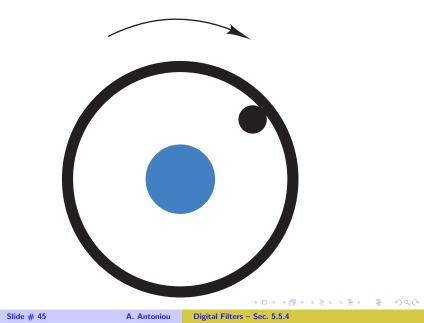


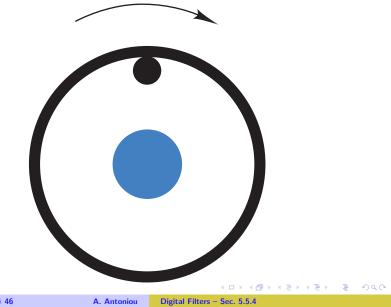
Frame # 28 Slide # 43



Frame # 29 Slide # 44

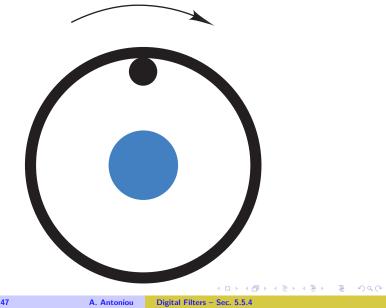
Frame # 30





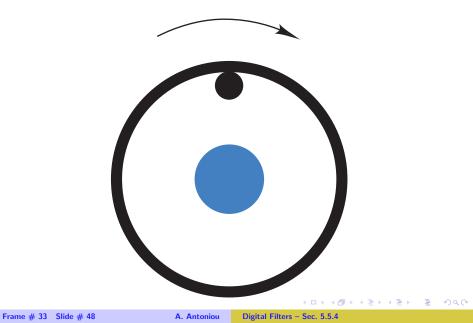
Frame # 31 Slide # 46

 $\omega = \omega_s$, Frame #1

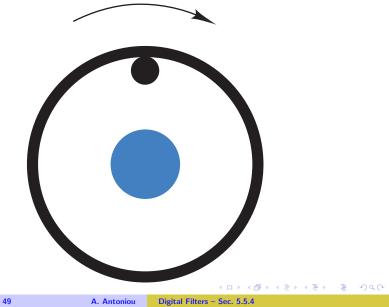


Frame # 32 Slide # 47

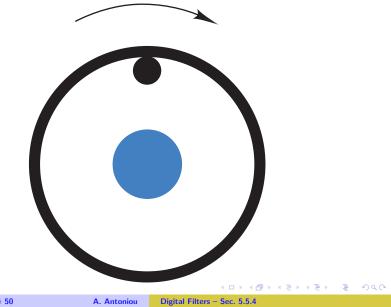
 $\omega = \omega_s$, Frame #2



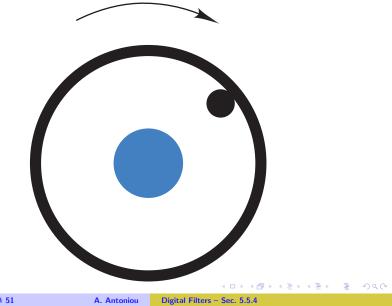
 $\omega = \omega_s$, Frame #3



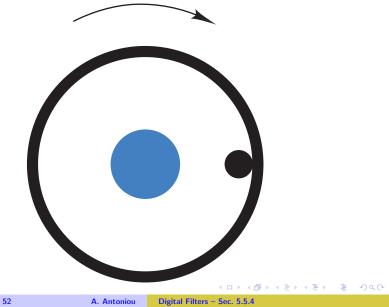
Frame # 34 Slide # 49



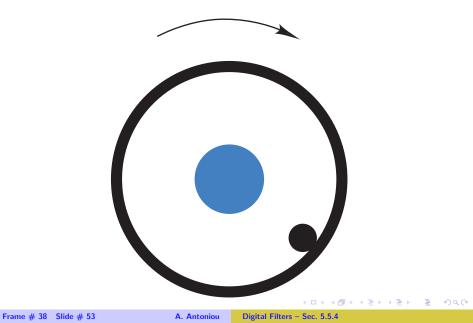
Frame # 35 Slide # 50

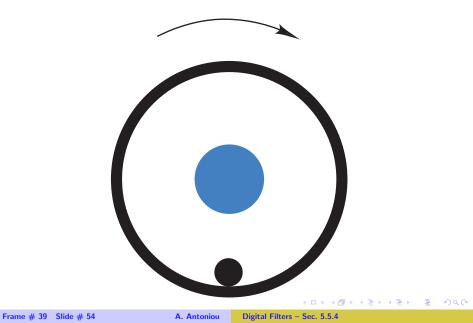


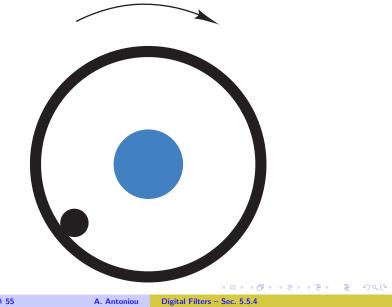
Frame # 36 Slide # 51



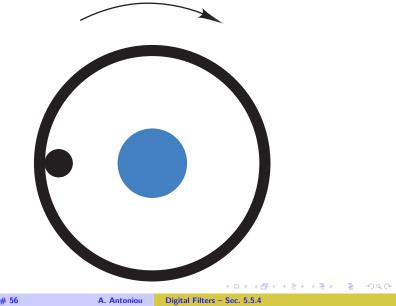
Frame # 37 Slide # 52



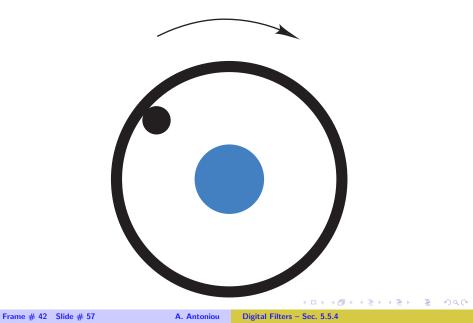


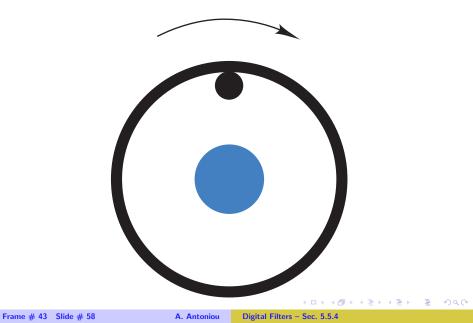


Frame # 40 Slide # 55



Frame # 41 Slide # 56





This slide concludes the presentation. Thank you for your attention.