

Lecture 4 Part 2 Sampling and Aliasing

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Notes by Jenna May

Cellular Generations: 5G, 6G, etc

- New “G” every 10 years (1990 2G, 2000 3G, 2010 4G, 2020 5G, etc.)
- Each “G” should be 10x faster in peak & average bit rates to the user equipment (phone)
- How to get there?
 - Increase the transmission bandwidth
 - Increase the number of antennas at the basestation and user equipment (phone)

Review Of Last Lecture

- Helicopter demo
 - Helicopter lifts off from a helipad on the coast with blades rotating at a certain rate (e.g. 8 revolutions/s)
 - Video camera is taking a video using a fixed frame rate
 - Helicopter blades appear to be still during flight because frame rate causes blades to alias and appear still.
 - Blade frequency (revolutions/s) must be an integer multiple of the frame rate for the blades to appear still in the video
 - Consider taking a picture and then the blade makes one full rotation at the time of the second picture. It appears that the blade hasn't moved.
 - Consider taking a picture and then the blade makes two full rotations at the time of the second picture. It appears that the blade hasn't moved....
 - <https://www.youtube.com/watch?v=yr3ngmRuGUc>

Checked Ball Demo

- Checkerboard textures on the surfaces of the spheres show places of jagged lines where the black and white squares meet
- Picture left of the vertical line is not filtered, where the picture to the right of the vertical line is filtered by a lowpass filter to smooth the jagged lines
- Divide between black and white squares are sharper – reduces spatial aliasing
- <https://www.shadertoy.com/view/XlcSz2>

Sampling

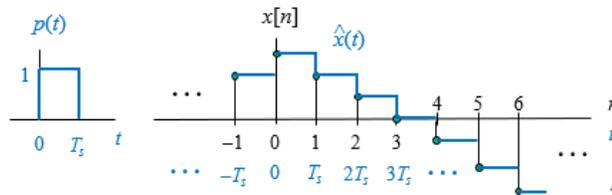
- Use lowpass filter to remove frequencies at and above $\frac{1}{2} f_s$ which will alias after sampling by sampling rate f_s
- Model sampling as multiplication by impulse train as in Homework Problem 0.3
- FT of impulse train whose impulses are separated by the sampling time T_s is an impulse train whose impulses are separated by the sampling rate (f_s in Hz or $2\pi f_s$ in rad/s for continuous time or angular frequency, respectively)
- Resulting FT of sampled signal will include replicas of FT of signal at offsets that are integer multiples of f_s
- Lowpass filter to remove replicas

Sampling Theorem

- Frequencies above $\frac{1}{2} f_s$ cannot be reconstructed
- Unrealistic to assume signal $x(t)$ has no frequency content above $\frac{1}{2} f_s$, so use lowpass filter to attenuate frequencies above $\frac{1}{2} f_s$
- Remark: transition band of LPF is $\sim 10\%$ of passband bandwidth in positive frequencies
- What happens to $f = \frac{1}{2} f_s$? It's the maximum DT frequency
 - Aliasing now depends on the phase of the sinusoidal signal
$$x(t) = \cos(2\pi f_{\max} t)$$
$$x[n] = \cos\left(2\pi \frac{f_{\max}}{f_s} n\right) = \cos(\pi n) = (-1)^n$$
$$y(t) = \sin(2\pi f_{\max} t) \text{ gives } y[n] = \sin(\pi n) = 0$$
 - $x(t)$ and $y(t)$ are separated by a phase shift of $\pi/2$ which leads to $x[n]$ and $y[n]$ separated by a phase shift of π
 - $x[n]$ is max DT frequency π , whereas $y[n]$ aliases to 0

Reconstruction

- Want to reconstruct CT signal from DT signal
- Sample and hold
 - Hold amplitude until next sample arrives
 - Equivalent to convolving $x[n]$ with rectangular pulse $p(t)$
 - Frequency response of rectangular pulse is infinite two-sided sinc

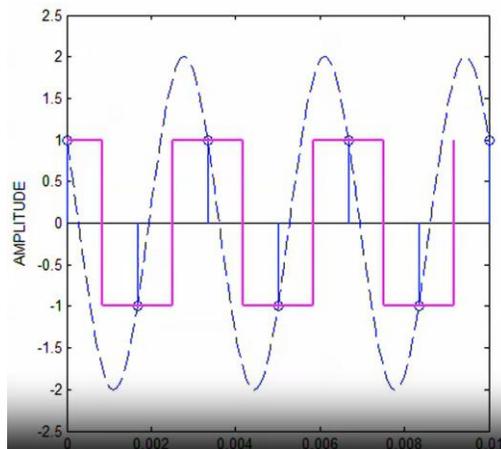


- Not great reconstruction
- Effectively adding scaled and shifted rectangular pulses
- Introduces lots of high frequency content due to the frequency response of $p(t)$ being a two-sided infinite-duration sinc pulse
- Can apply a LPF to remove high frequency components => remove sharp edges

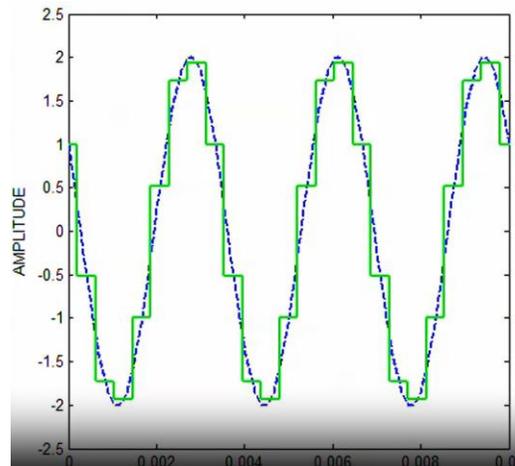
Demos

- All reconstruction filters are lowpass FIR filters with different impulse responses—rectangular pulse, triangular pulse and truncated sinc pulse
- Rectangular pulse/zero order hold
 - Sampling rate is greater than $2 f_0$ where f_0 is the cosine frequency
 - Reconstruction using a rectangular pulse looks like square wave, but if we were to observe the reconstruction for a longer period of time, the “square” wave would vary in minimum and maximum amplitude
 - Captures fundamental frequency => zero crossings. The distance between two zero crossings is half of the cosine period.

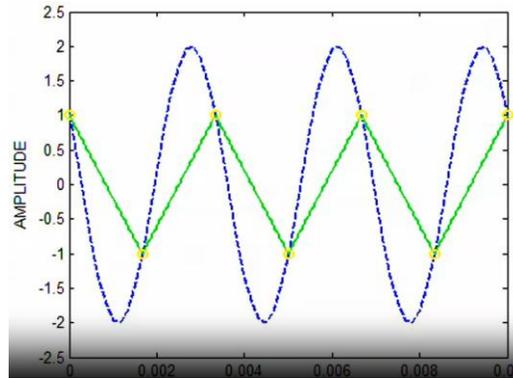
- The location of the zero crossings of the reconstructed signal does not match original CT signal
 - When not sampling exactly at peaks/valleys



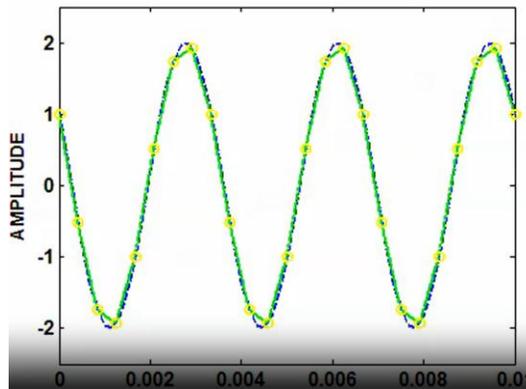
- As the sampling rate increases, the reconstructed signal has
 - peaks/valleys closer in value to the original signal
 - locations of the zero crossings closer to those in the original signal
 - run-time implementation complexity increasing linearly with sampling rate
 - improved signal quality (at some point, signal quality will show negligible improvement as the sampling rate increases: “diminishing returns”)



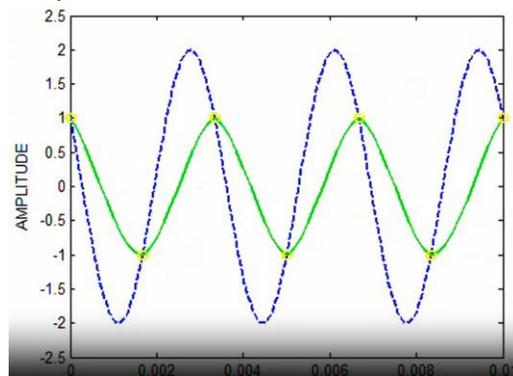
- Linear Interpolation
 - Pulse shape is triangle with width $2 \cdot T_s$
 - The reconstructed signal appears as lines drawn between sample values like one would do in a “connect the dots” puzzle
 - Sampling rate is greater than $2 f_0$
 - Captures correct number of zero crossings
 - Does not capture peaks/valleys and locations of zero crossings



- Sampling rate $> 2f_0$
 - Capture peaks/valleys better as sample rate increases
 - Zero crossings are close to CT signal as sample rate increases
 - Doubling sampling rate at least doubles run-time implementation complexity, so eventually get diminishing returns

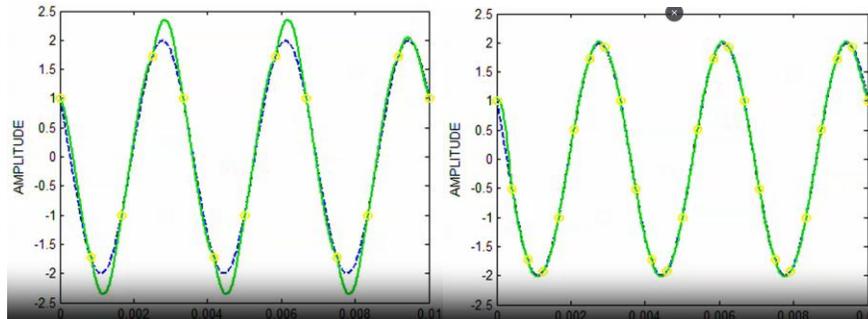


- Truncated Sinc
 - Ideal pulse shape is infinite sinc, cannot implement in practice
 - $-2T_s$ to $2T_s$
 - Sampling rate $> 2f_0$
 - Looks much smoother than similar sample rate for other pulse shapes
 - Double implementation complexity vs. using triangular pulse b/c pulse shape is twice width



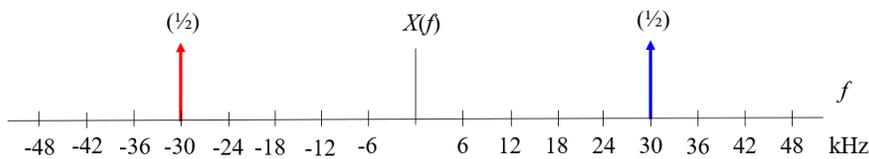
- Sampling rate $> 2f_0$

- Better tracking of zero crossings
- For lower sample rates, can overshoot peaks and valleys up to 2x
- Higher sampling rates track peaks/valleys and zero crossings better
- Also eventually see diminishing returns

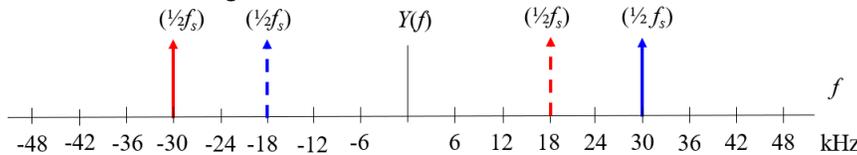


Aliasing

- $f_s=48\text{kHz}$, $x(t) = \cos(2 \pi f_0 t)$ where $f_0 = 30 \text{ kHz}$
- $X(f)$:



- Replicas of $X(f)$ centered at multiples of 48kHz will result in frequency content at $\pm 18\text{kHz} \Rightarrow$ aliasing



- Reconstruction only uses frequencies $-\frac{1}{2}f_s \leq f \leq \frac{1}{2}f_s \Rightarrow$ signal aliases to 18kHz

Supplemental: After Lecture. Circuit implementation of zero-order-hold:

Disclaimer: Prof. Evans' expertise is in embedded real-time digital systems, not analog circuits.

