

# The Sampling Theorem

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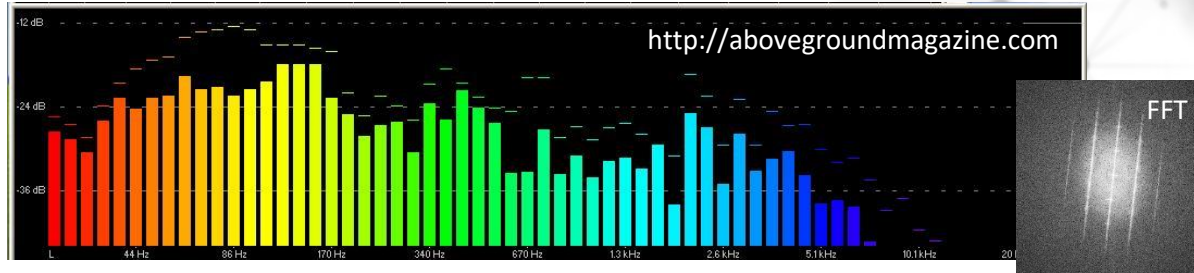
Radeon™ RX 5700 XT



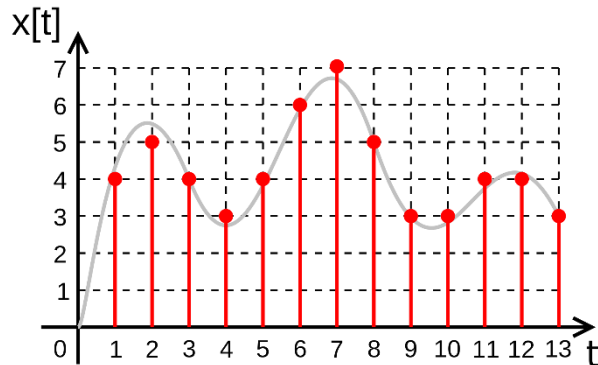


The central question for the digital acquisition of a measurement signal is the following: **Can I restore the original signal from the digitized measurement signal or not?** In other words: How large must the minimum **sampling frequency** be so that I can reconstruct the original signal from the digital values?

# Analog-Digital-Converter



In electronics, an **analog-to-digital converter** (ADC, A/D, or **A-to-D**) is a system that converts an analog signal, such as a sound picked up by a microphone or light entering a digital camera, into a digital signal.

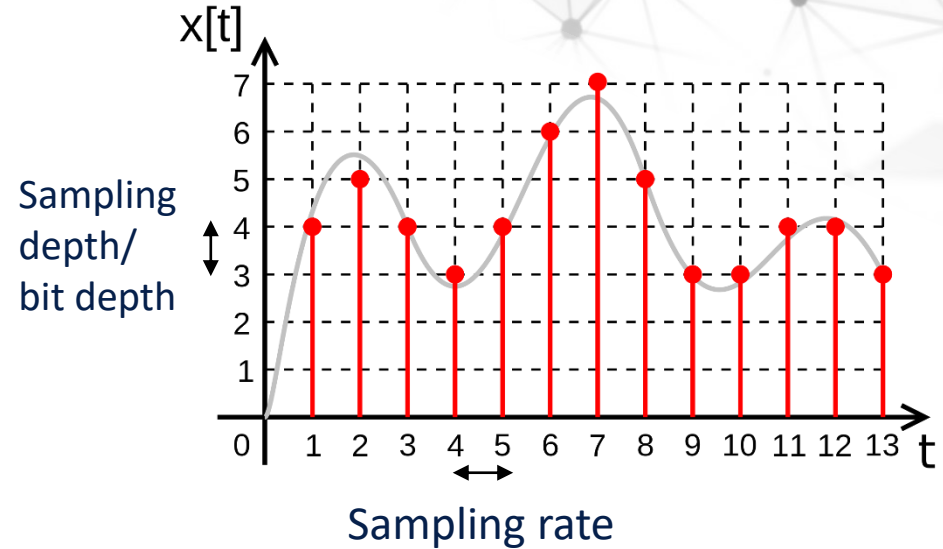


[wikipedia.com]

# Sampling Depth and Rate

In signal processing, the **sampling depth/bit depth** is the accuracy with which the amplitude of an analog signal (also known as a time-continuous signal) can be reconstructed.

In signal processing, the **sampling rate** is the frequency with which an analog signal is sampled in a given time.

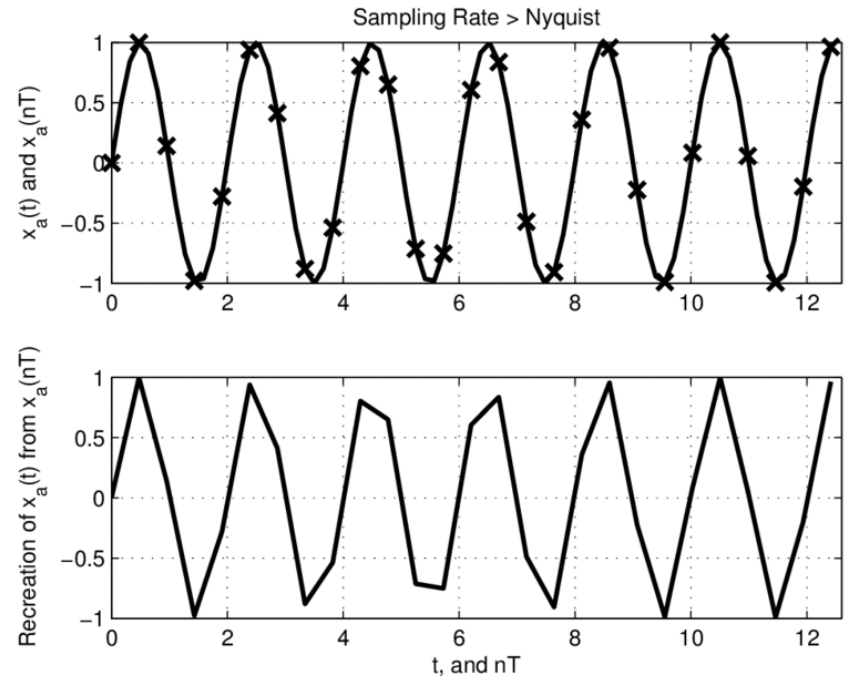
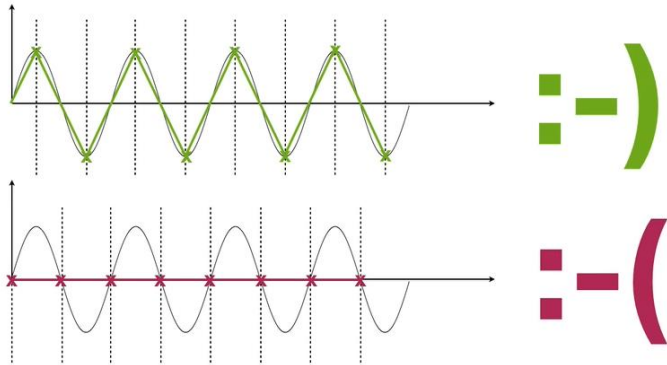


[wikipedia.com]

# Nyquist-Shannon Sampling Theorem

The sampling theorem states that a signal band limited to  $f_{\max}$  can **be reconstructed exactly** from a sequence of equidistant samples if it has been sampled at a frequency greater than  $2 \cdot f_{\max}$ .

$$f_{\text{sampling}} > 2f_{\max}$$



[youtube: sonic-vision.tv; Research gate: John Crassidis]

# Nyquist Frequency

$$f_{\text{nyquist}} = \frac{1}{2} f_{\text{sampling}}$$

$$f_{\text{signal}} < f_{\text{nyquist}}$$

=

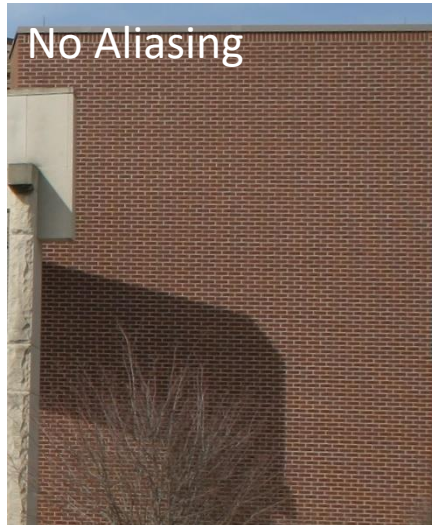
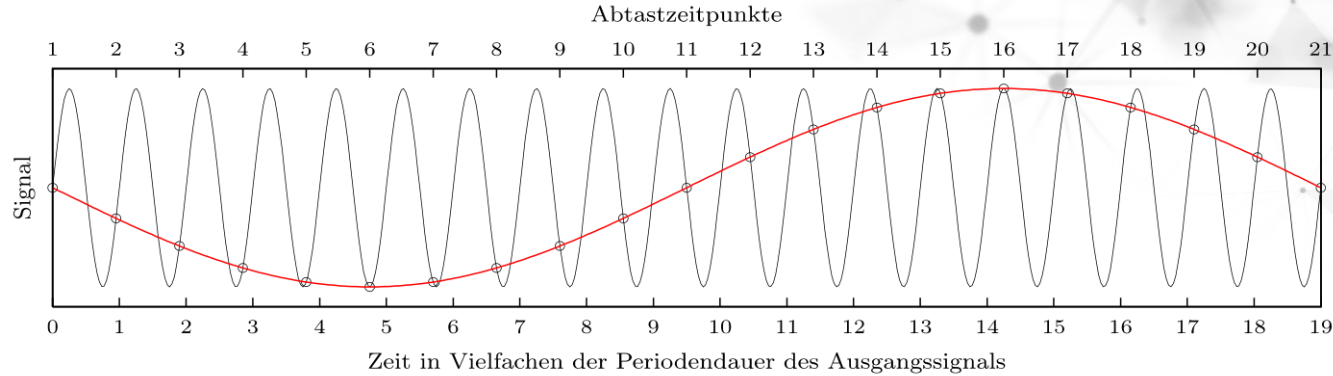
$$f_{\text{sampling}} > 2f_{\text{signal}}$$

1889-1976



[wikipedia.com]

# Under-Sampling / Aliasing



Alias effect occurs if frequencies are present that are larger than the **Nyquist frequency**.

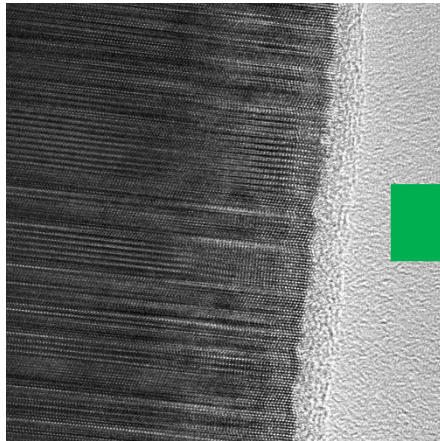
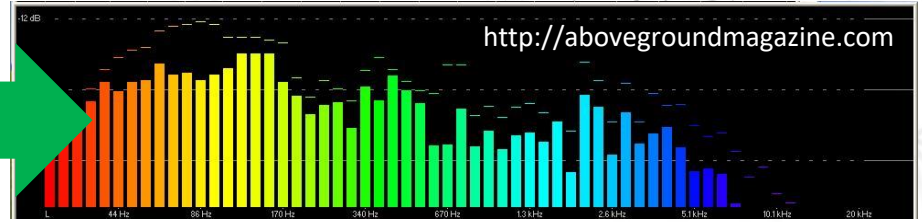
[wikipedia.com]



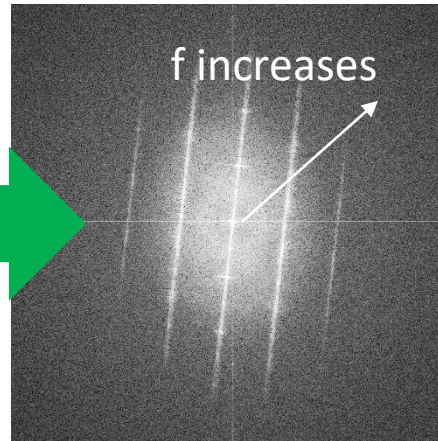
# Fourier Transformation



Fourier Trans.



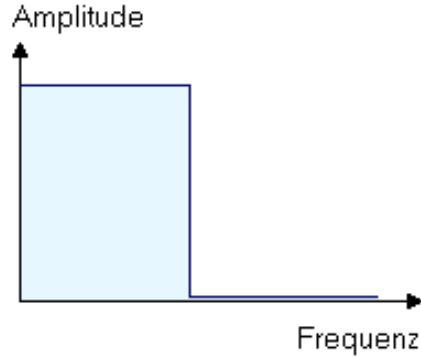
Fourier Trans.



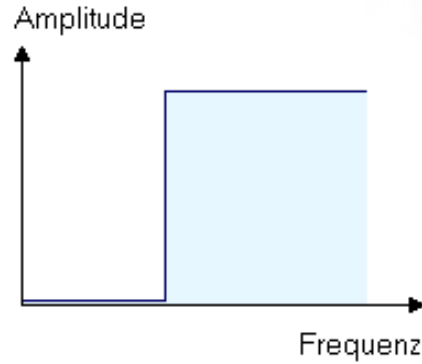


# Filter

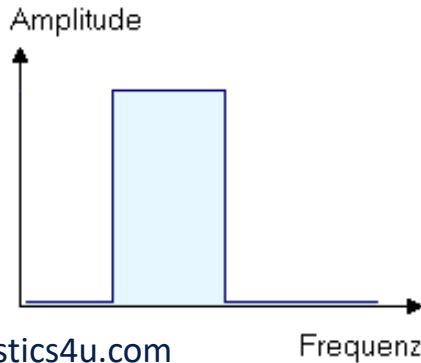
Tiefpassfilter



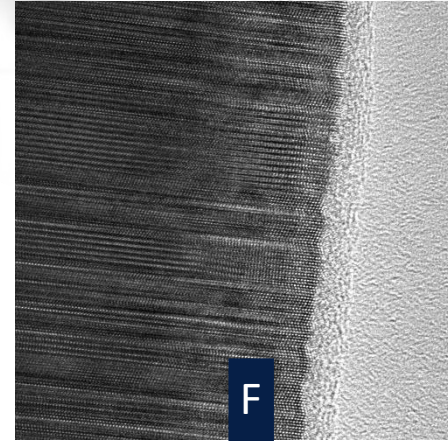
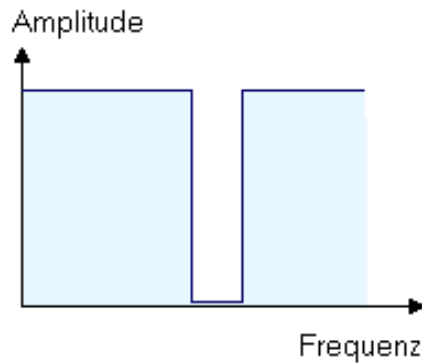
Hochpassfilter



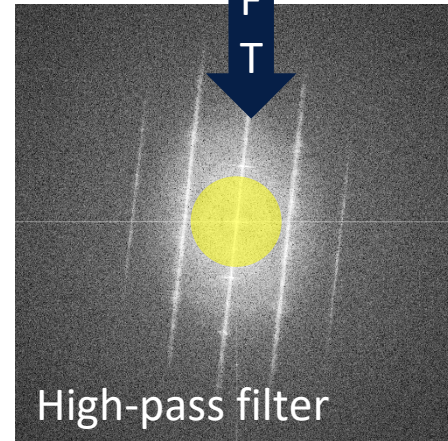
Bandpassfilter



Kerbfiler

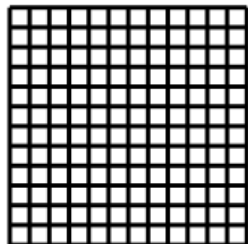


F  
F  
T



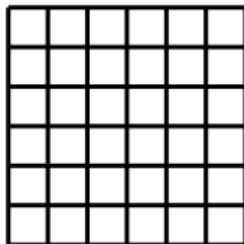
High-pass filter

# Binning

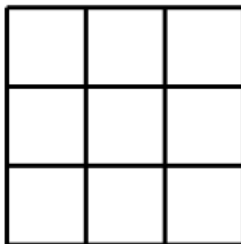


No binning  
(144 pixels)

eyerys.com

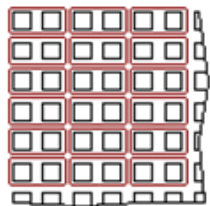


2x binning  
(36 pixels)



4x binning  
(9 pixels)

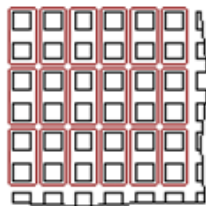
Horizontal  
Binning



Charges from adjacent pixels in the line are summed and reported out as a single pixel.

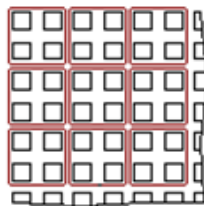
[baslerweb.com]

Vertical  
Binning



Charges from adjacent pixels in multiple lines are summed and reported out as a single pixel.

Full  
Binning



Charges from adjacent grouped pixels in both dimensions are summed and reported out as a single pixel.

In the context of image processing, binning is the procedure of **combining a cluster of pixels** into a single pixel. As such, in 2x2 binning, an array of 4 pixels becomes a single larger pixel, reducing the overall number of pixels.

# Binning: Size Effect

No binning, e.g. 1.0 s

GaAs; cropped STEM image;  
original image: 2k

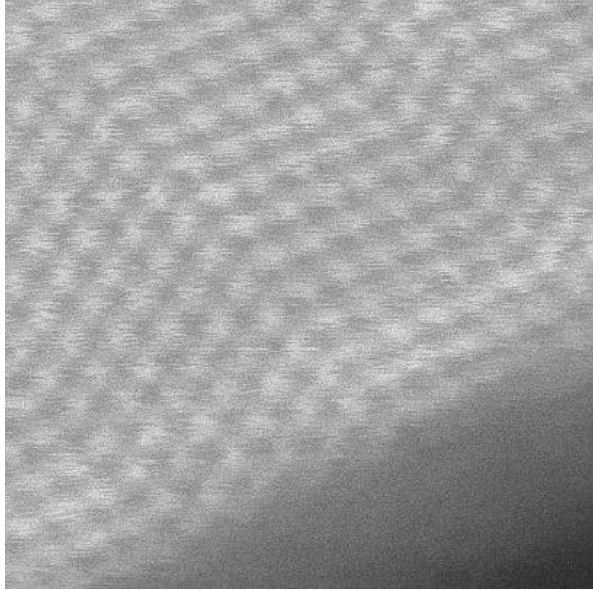
2x2 binning, 0.25 s

4x4 binning,  
0.0625 s

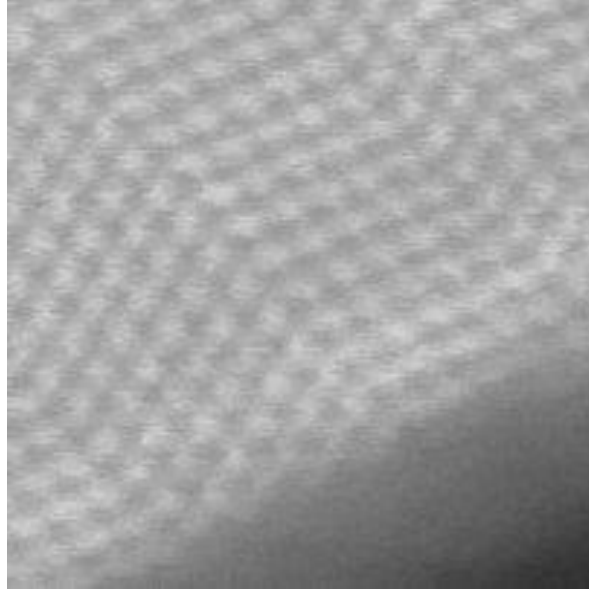
The **measurement time** (= dwell time) and **data size** also scale in a quadratic manner!

# Binning: Effect on Noise and Resolution

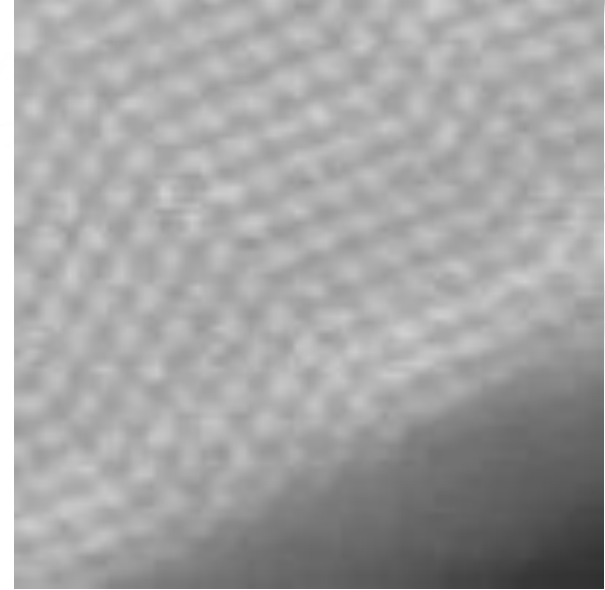
No binning



2x2 binning



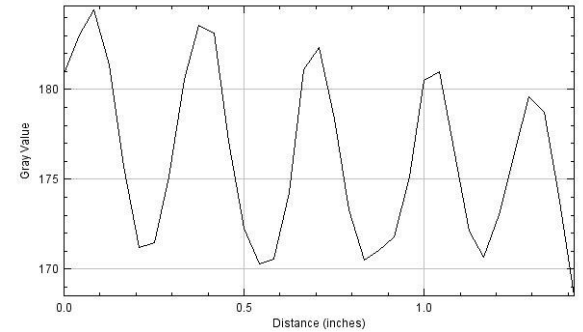
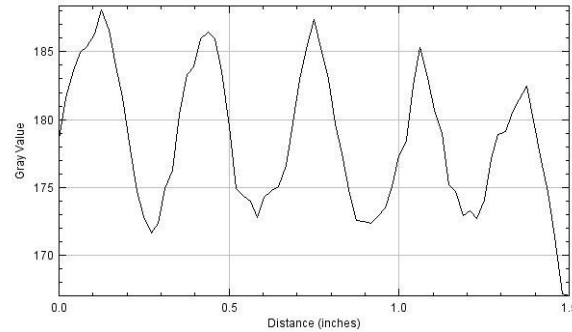
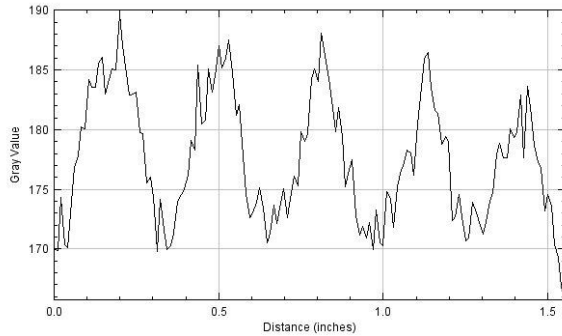
4x4 binning



Noise

Resolution

# Binning: Effect on Noise and Resolution



Noise

Resolution

