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# Computer Graphics

- Antialiasing -

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# Overview

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- **So far:**
  - ...
  - Ray tracing, radiosity
  - Signal processing
- **Today:**
  - Antialiasing
    - Prefiltering
    - Supersampling
    - Adaptive Sampling
- **Soon:**
  - Color
  - Imaging
  - Animation

# Overview

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- **Continuous signal (2D/3D/4D with time)**

- Defined for all points



- **Sampling**

- Rays, pixel/texel, spectral values, frames, ...



- **Discrete image / image sequence**

- Defined at isolated points, not over surfaces



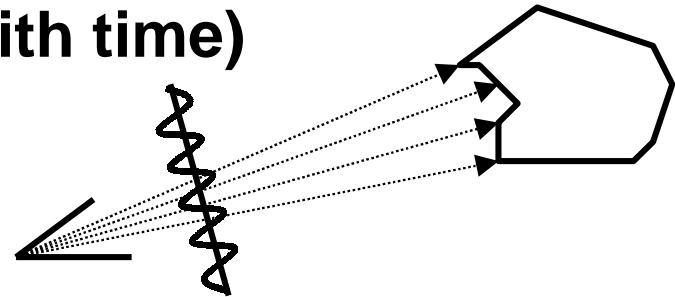
- **Reconstruction**

- Spot of electronic beam on screen and human visual system



- **Impression of a continuous signal**

- Should be similar to the original signal, no artefacts



# Fourier Transformation

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- **Spectral analysis**

- Decomposition of a signal in different frequency bands
- Representation of a function as weighted sum of sine and cosine functions (as orthonormal basis)
- Two representations
  - Spatial/temporal domain:  $f(x)$
  - Frequency domain:  $F(\omega)$ , spectral representation

- **Fourier transformation**

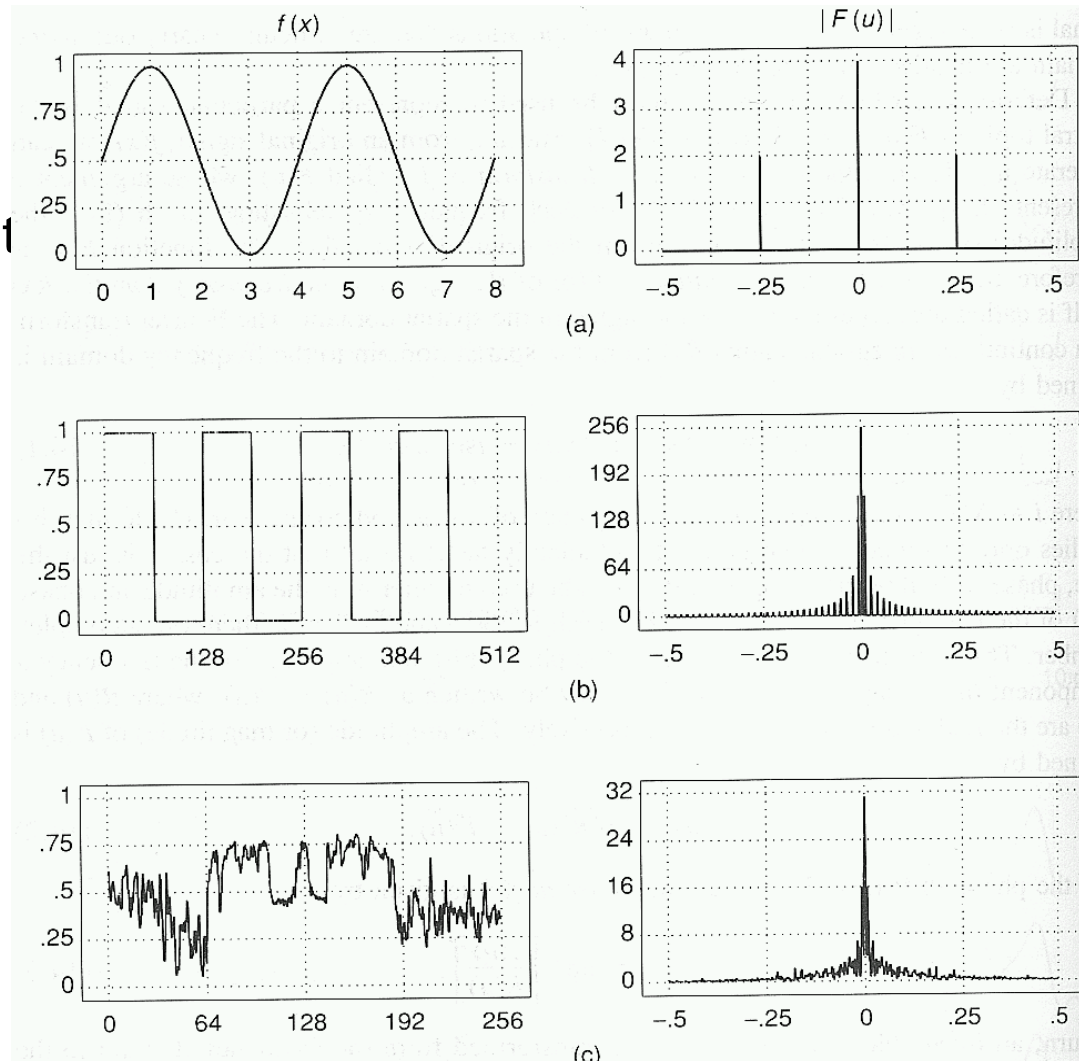
- Conversion between the two representations
- Functional: Convolution with complex exponential function
  - Corresponds to separate convolution with sine and cosine

$$F(\omega) = \int_{-\infty}^{\infty} f(x) e^{-i\omega x} dx, \quad \text{mit } e^{i\omega x} = \cos(\omega x) + i \sin(\omega x)$$

$$f(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} F(\omega) e^{i\omega x} dx$$

# Spatial and Frequency Domains

- **Examples** (pixel vs cycles per pixel)
  - Positive sine with DC (= direct current part)
  - Square wave
  - Scanline of an image



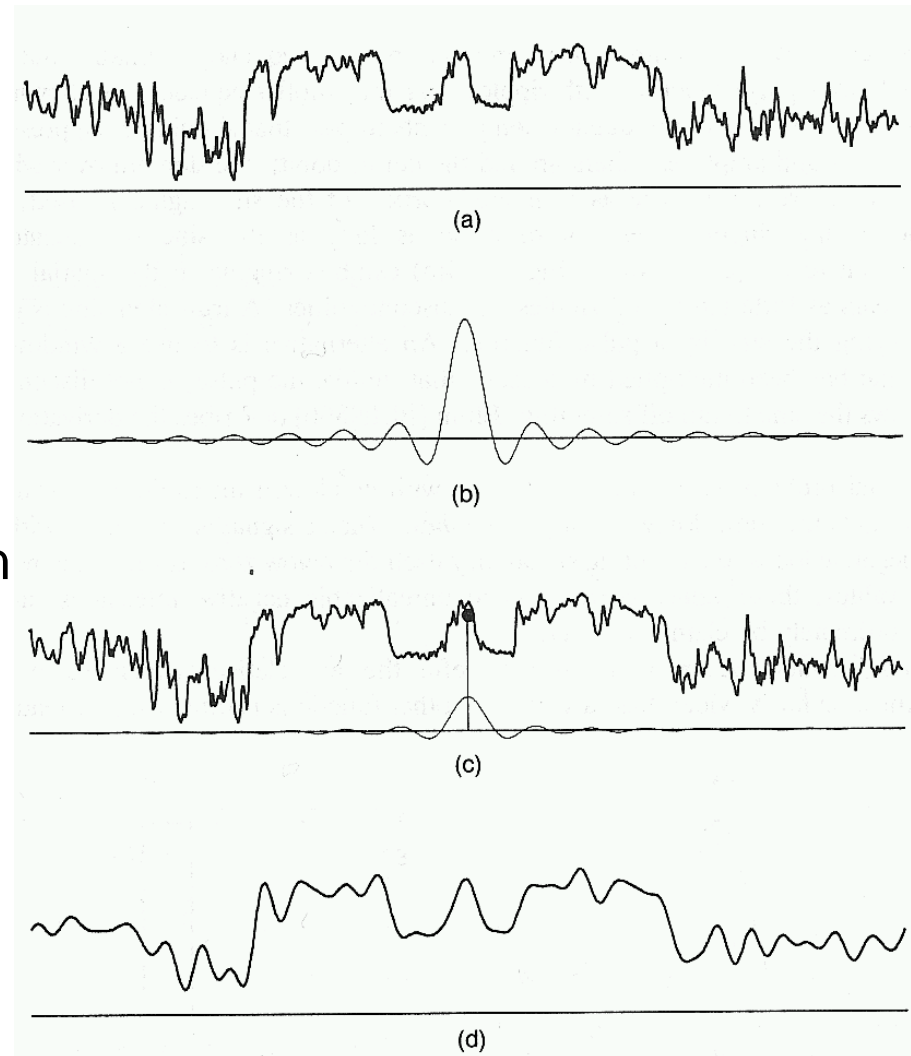
# Convolution and Filtering

- **Convolution (Faltung)**

$$f(x) \otimes g(x) = \int_{-\infty}^{\infty} f(\tau)g(x - \tau)d\tau$$

- **Convolution Theorem**

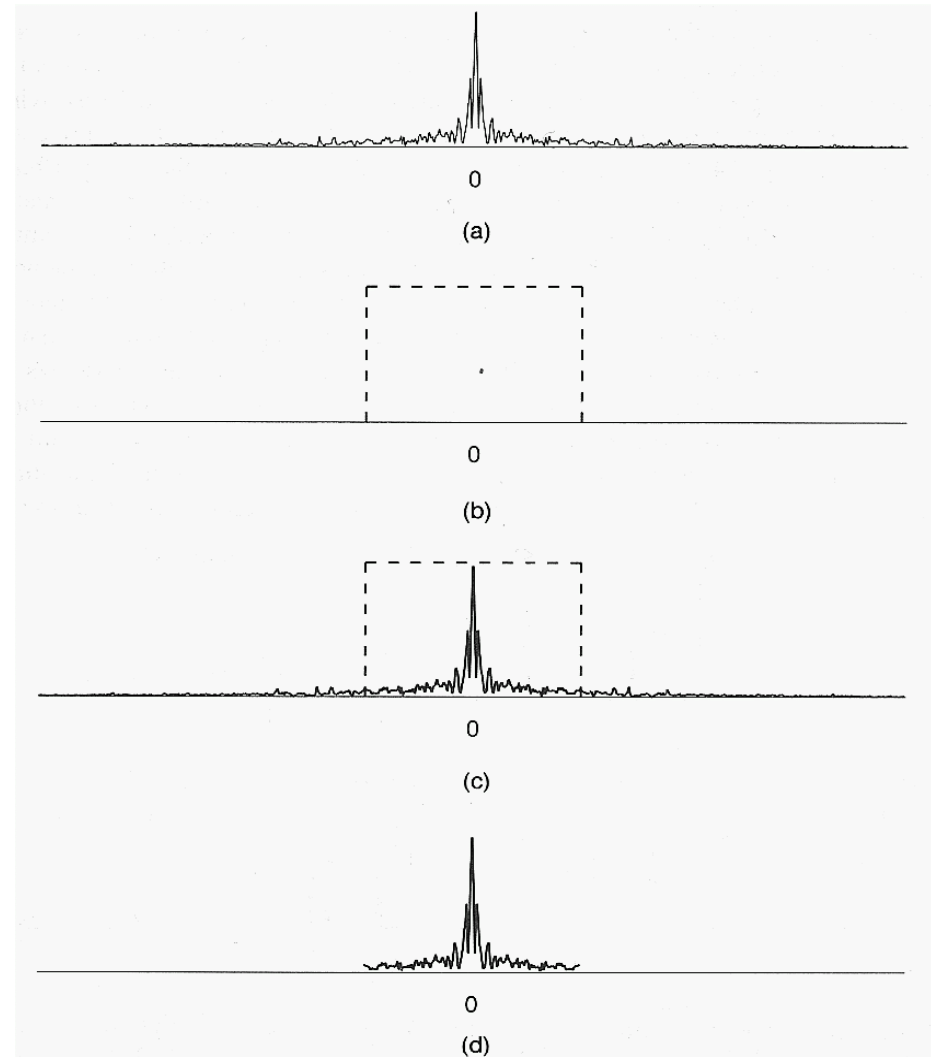
- Multiplication in spatial domain corresponds to convolution in frequency domain
  - $f \cdot g \leftrightarrow F \otimes G$
- And vice versa (for symmetry reasons)
  - $F \cdot G \leftrightarrow f \otimes g$



Low-pass filtering in spatial domain: convolution with sinc

# Convolution and Filtering

- **Low-pass filtering**
  - Convolution with sinc in spatial domain, or
  - multiplication with box in frequency domain
- **High-pass filtering**
  - Only high frequencies
- **Band-pass filtering**
  - Only intermediate frequencies



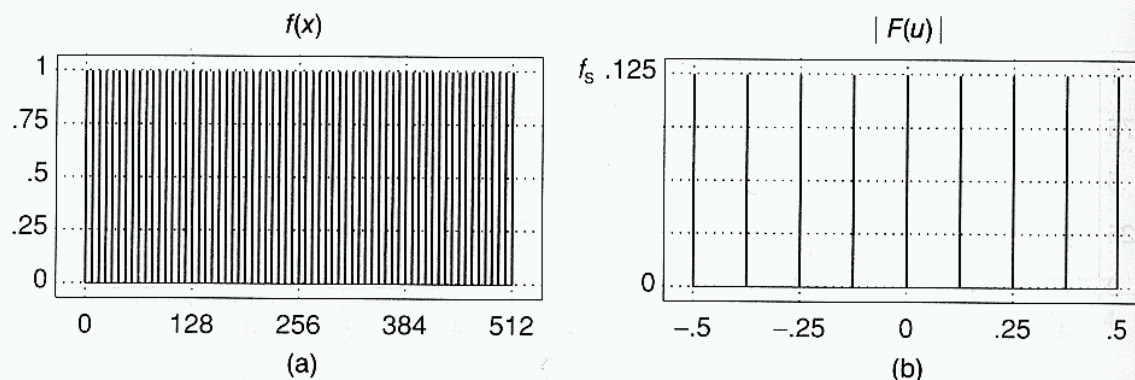
Low-pass filtering in frequency domain: multiplication with box

# Sampling and Reconstruction

- **Sampling**

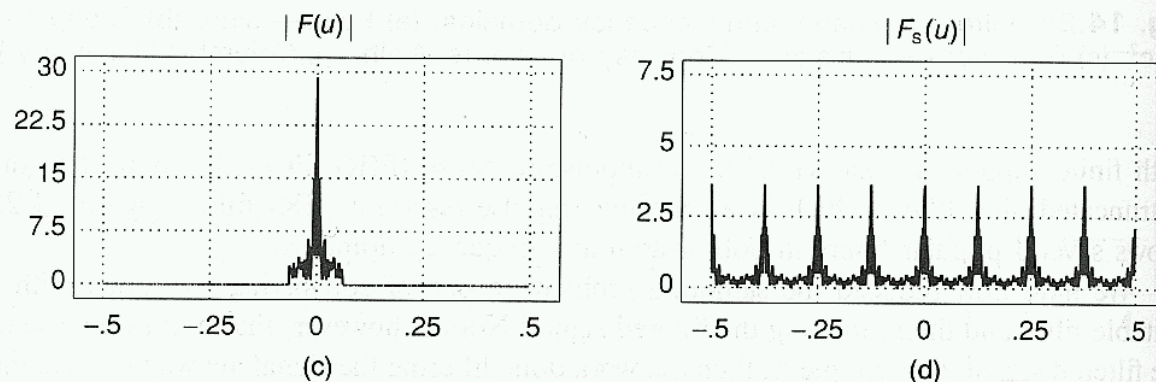
- corresponds to multiplication with a comb function
  - Convolution with  $F(u)$  in frequency domain
- Regular delta-functions (e.g. Pixel center)

Sampling signal



Sampling signal  
in frequency  
domain

Signal in  
frequency  
domain

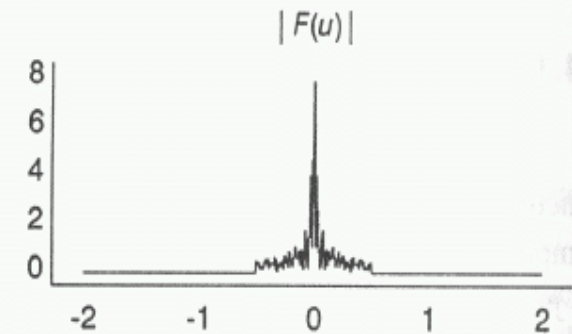
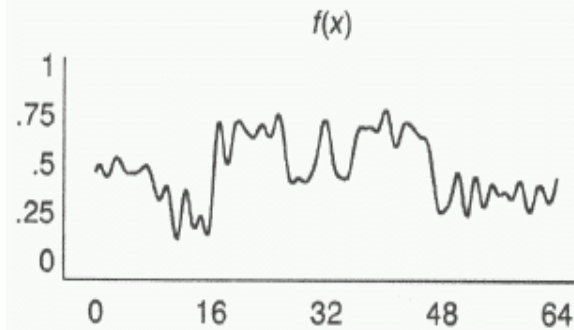


After  
convolution

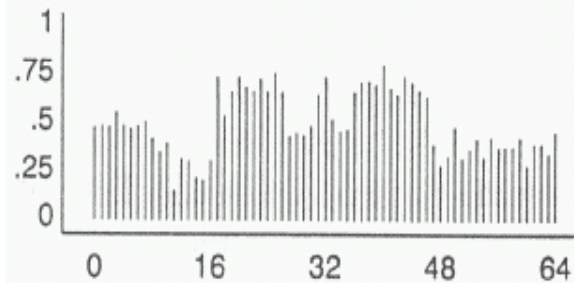


# Sampling and Reconstruction

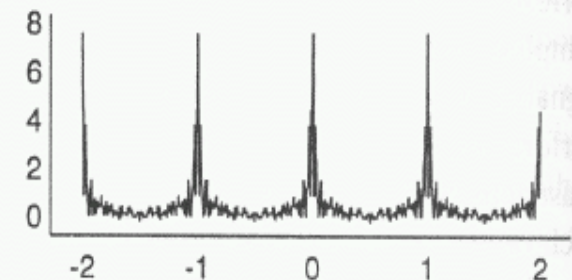
Original function  
and its frequency  
spectrum



Sampled signal  
Convolution of comb  
with  $F(u)$



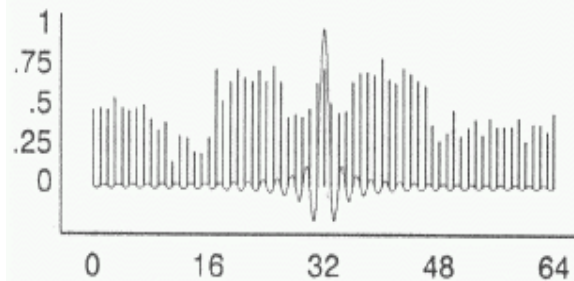
(a)



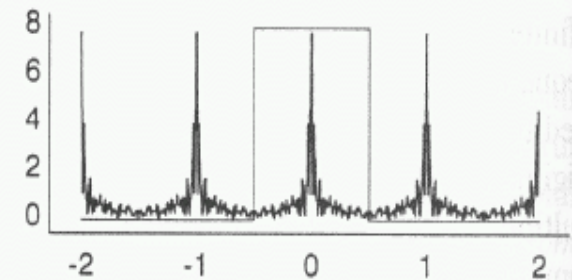
**Signal is replicated!!**

Before  
Reconstruction

**Only a copy!!!**



(b)



(c)

# Sampling and Reconstruction

Reconstruction  
with ideal sinc

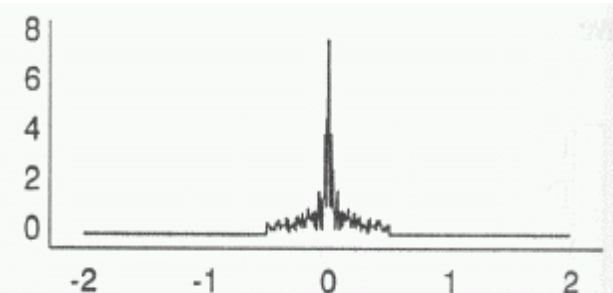
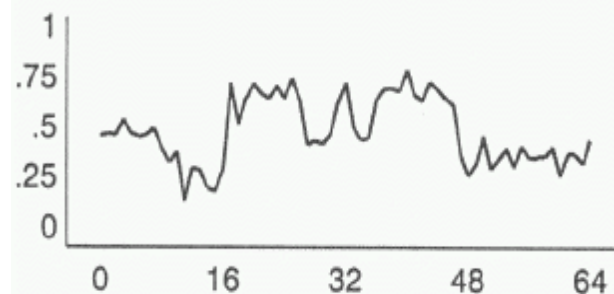
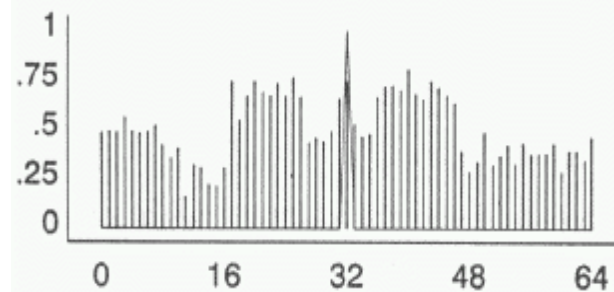
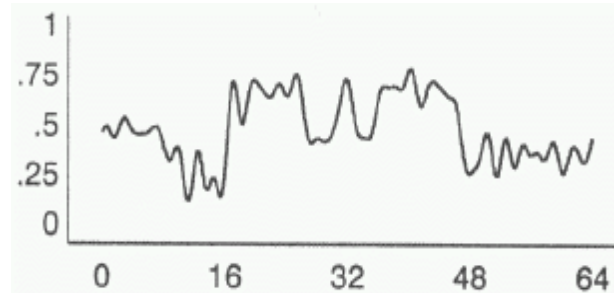
Identical signal

Before  
reconstruction  
with hat function

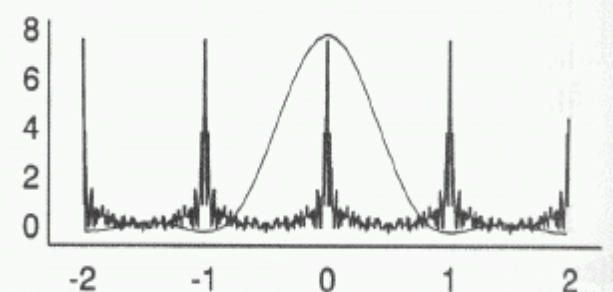
High frequencies  
are not ignored

→ Aliasing

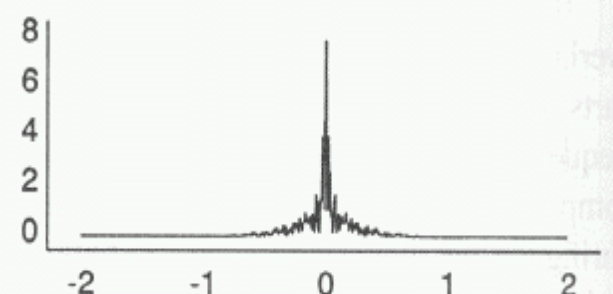
Reconstruction  
with hat function  
(= piecewise linear  
interpolation)



(d)

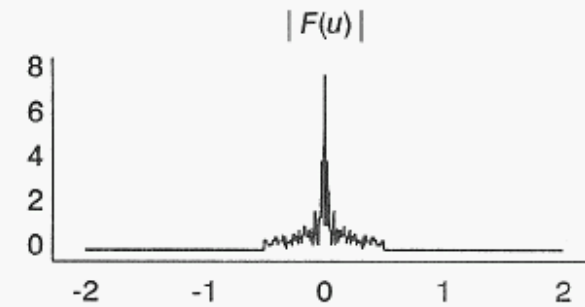
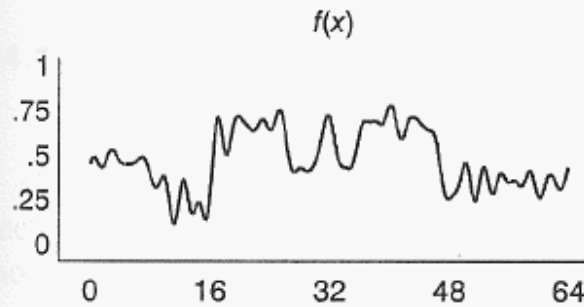


(e)

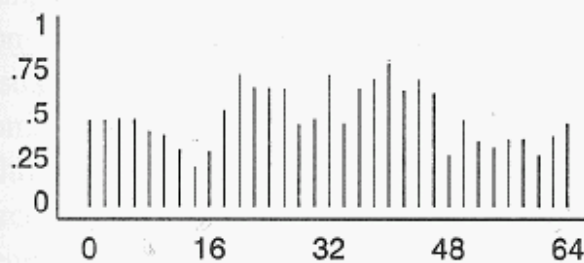


# Sampling with Low Frequency

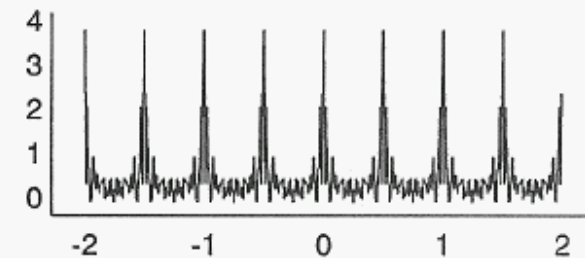
Function and its frequency spectrum



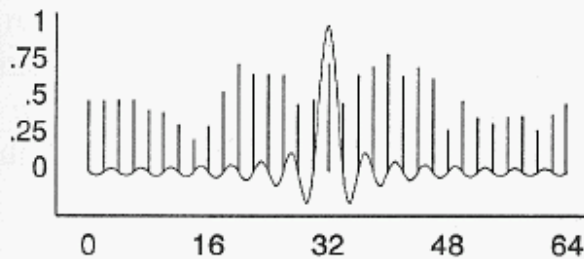
Sampling with low frequency



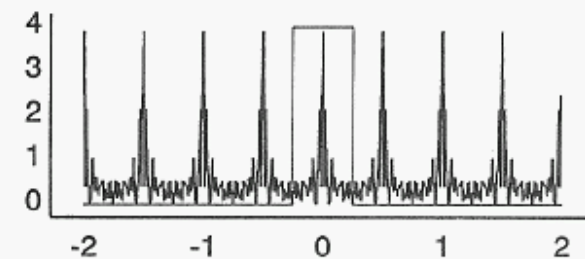
(a)



Convolution of comb with  $F(u)$



(b)



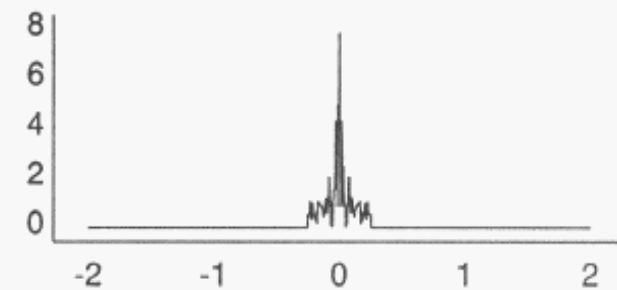
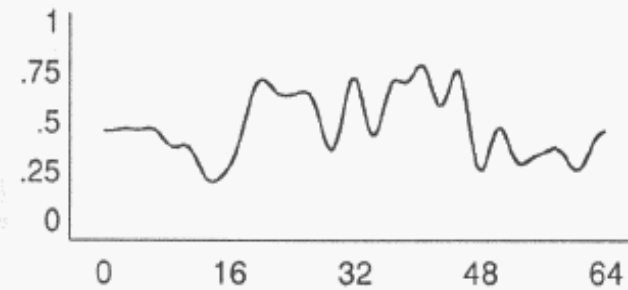
Before reconstruction with suitable sinc

Reconstruction fails (overlap in frequency domain)

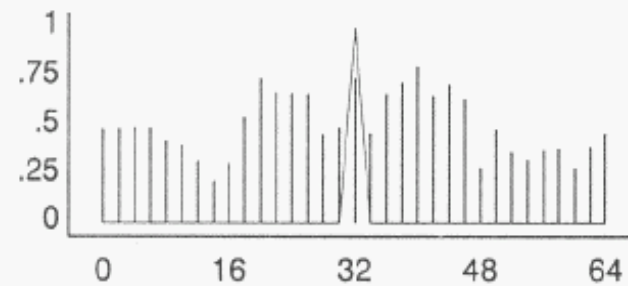
(c)

# Sampling with Low Frequency

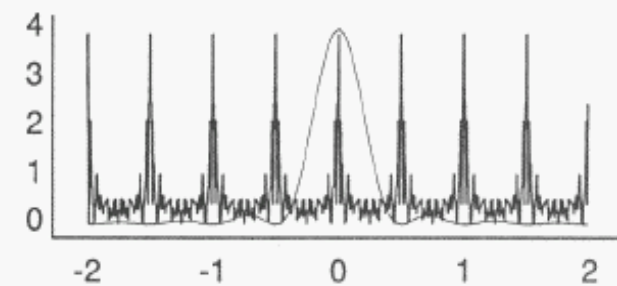
Reconstruction  
with suitable  
sinc



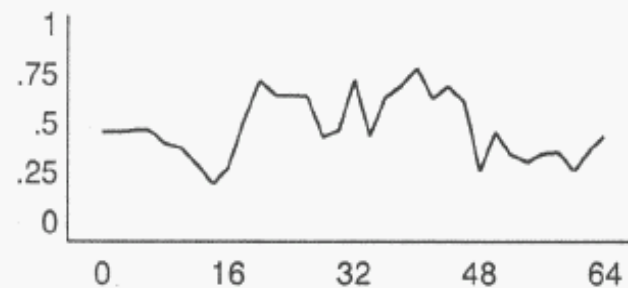
Before  
reconstruction  
with hat function



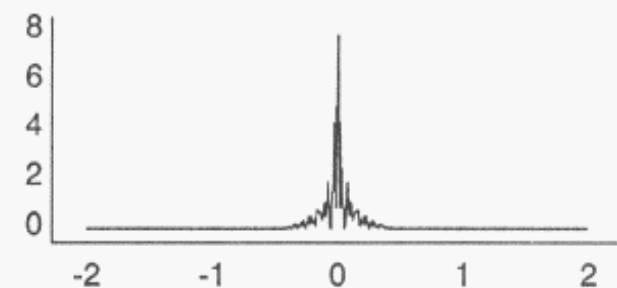
(d)



Reconstruction  
with hat function  
(= piecewise linear  
interpolation)



(e)



# Nyquist Frequency

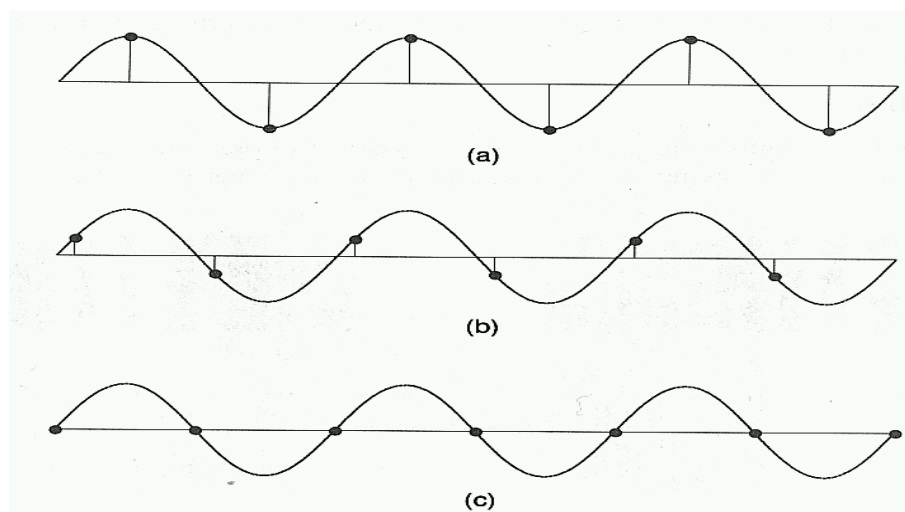
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- **Shannon: Sampling-Theorem `49**

- „A signal can be properly reconstructed from its samples if the original signal is sampled at a frequency that is greater than twice the highest frequency component in its spectrum“
- In short: Sampling frequency  $> 2 * \text{highest frequency component}$  (in particular: signal must be band limited)

- **Nyquist**

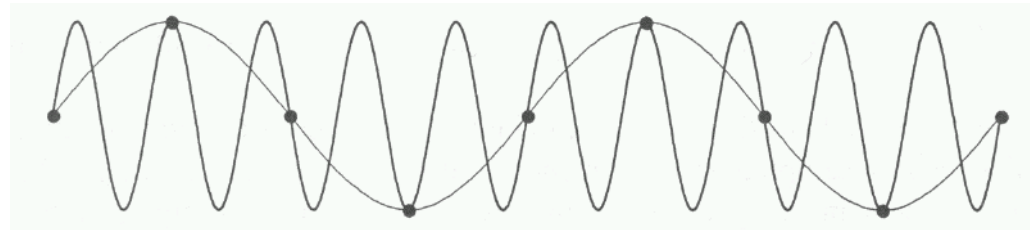
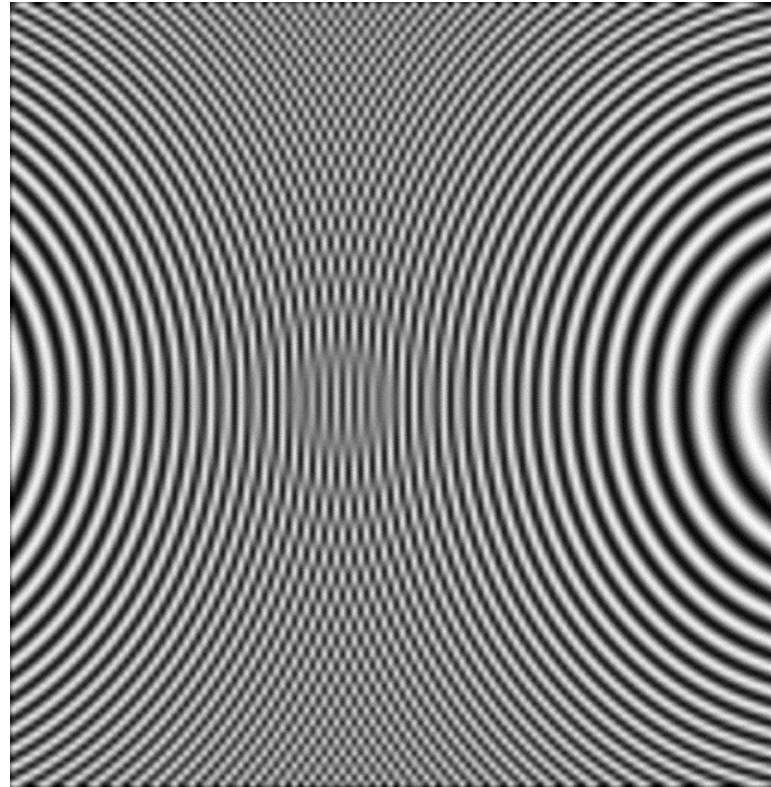
- Critical frequency is called **Nyquist frequency**



# Aliasing Artefacts

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- **Moiré Patterns**
- **Aliasing**



# Sampling Artefacts

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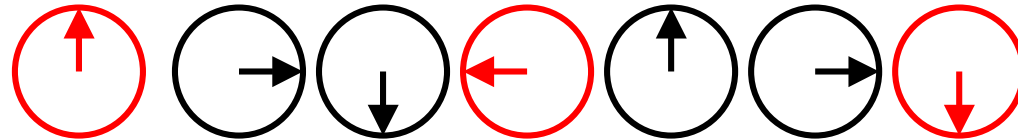
- **Spatial aliasing:**
  - Stair cases, Moiré patterns, etc.
- **Solutions:**
  - Increasing the sampling rate
    - Ok, but infinite frequencies at sharp edges
  - Postfiltering (after reconstruction)
    - Doesn't work - only leads to blurred stair cases
  - Prefiltering (Blurring) of sharp geometry features
    - Slowly make geometry transparent at the edges
    - Correct solution in principal
    - Analytic low-pass filtering hard to implement
    - Supersampling

# Sampling Artefacts

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- **Temporal Aliasing**

- Car wheels, ...



- **Solutions**

- Increasing the frame rate

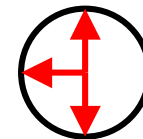
- OK

- Prefiltering (Motion Blur)

- Yes, possible for simple geometry (e.g.. Comic)
    - Problems with texture, etc.

- Postfilterung (Averaging several frames)

- Doesn't work – only multiple detail



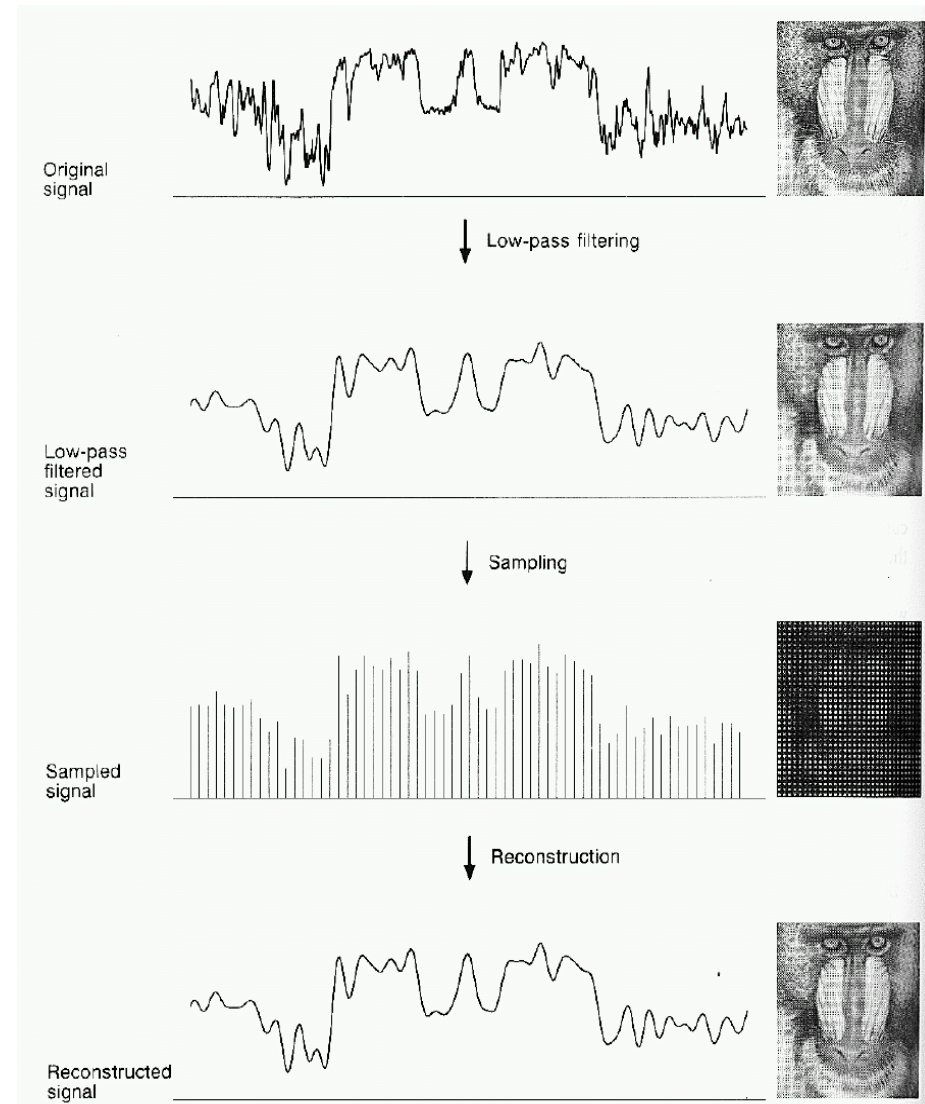
- **Important**

- Distinction between **aliasing errors** and **reconstruction errors**



# Antialiasing by prefiltering

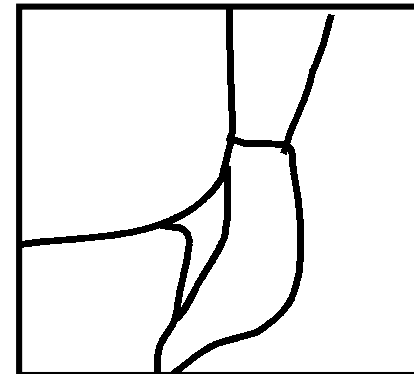
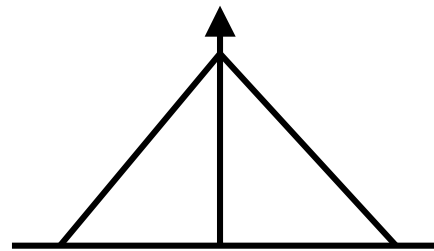
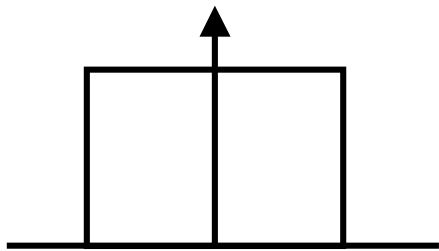
- **Filterung before sampling**
  - Analog/analytic or
  - Sampling with higher frequency (super sampling)
- **Ideal reconstruction**
  - Convolution with sinc
- **Practical reconstruction**
  - Convolution with
    - Box filter or
    - Circle filter
  - Sampling-Rate must then be significantly higher than Nyquist frequency



# Sources of High Frequencies

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- **Geometry**
    - Edges, Vertices, sharp boundaries
    - Silhouettes (view dependent)
  - **Texture**
    - Chess board patterns, lots of detail
  - **Illumination**
    - Shadows, lighting effects, projections
- ➔ **Analytic filtering almost impossible**
- Even with the most simple filters



# Comparison

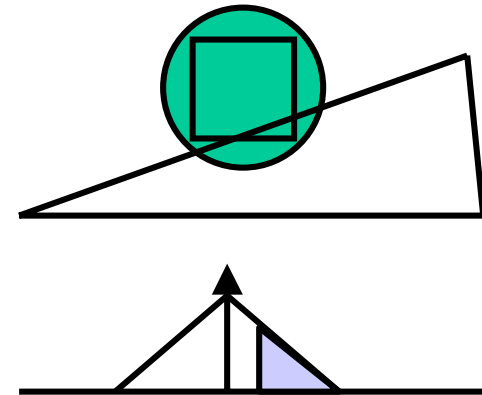
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- **Analytic low-pass filtering**

- Ideally eliminates aliasing completely
- Hard to implement
  - Only works for polygon edges with constant color
  - Weighted or unweighted area sampling
  - Compute distance from pixel to a line
  - Filter values can be stored in look-up tables
    - Possibly taking into account slope
    - Distance correction
    - Non rotationally symmetric filters
  - Doesn't work for corners

- **Over-/Supersampling**

- Very easy to implement
- Doesn't eliminate aliasing completely
  - Sharp edges contain infinitely high frequencies



# Resampling Pipeline

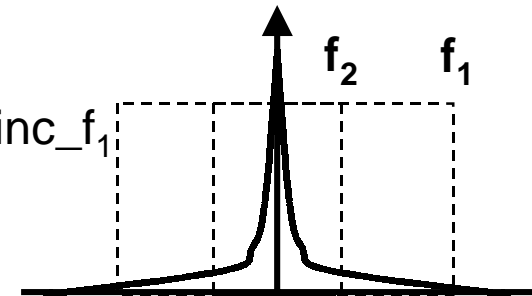
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- **Assumption**

- Energy in high frequencies decreases
- Reduced aliasing by sampling with higher frequencies

- **Algorithm**

- Supersampling
  - Sample continuous signal with boundary frequency  $f_1$
  - Aliasing with energy beyond  $f_1$
- Reconstruction of signal
  - Filtering with  $g_1(x)$ : e.g. convolution with  $\text{sinc}_{f_1}$
- Analytic low-pass filtering of signal
  - Filtering with filter  $g_2(x)$  with  $f_2 \ll f_1$
  - Signal becomes band limited w.r.t.  $f_2$
- Resampling with a sampling frequency that is compatible with  $f_2$ 
  - No additional aliasing
- Filters  $g_1(x)$  and  $g_2(x)$  can be combined
- Hardware support (SGI Reality Engine, multisampling)

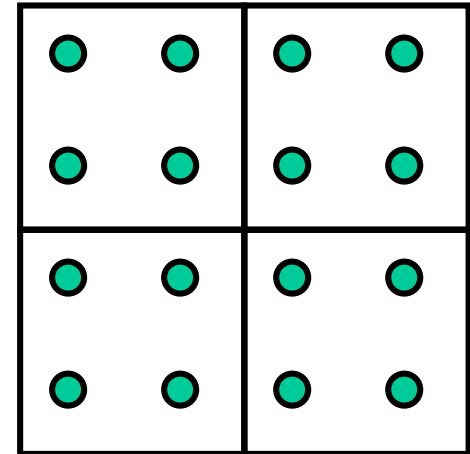


# Supersampling in Praxis

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- **Regular supersampling**

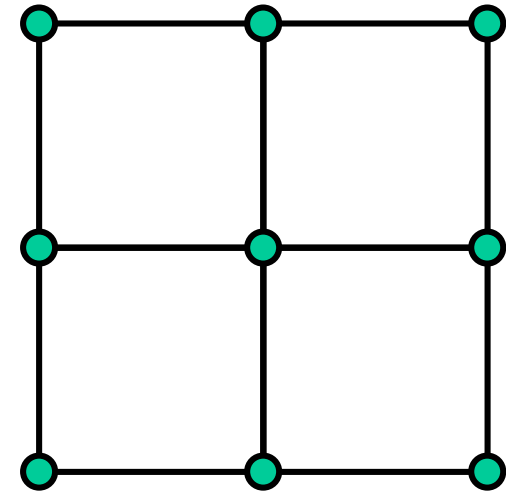
- Averaging of N samples per pixel on a grid
- N:
  - 4 quite good
  - 16 almost always sufficient
- Samples
  - Rays, z-buffer, reflexion, motion, ...
- Averaging
  - Box filter
    - Up to 5 resp. 17 intensity levels
  - Others: Pyramid (Bartlett), B-Spline, Hexagonal, ...
- Regular supersampling
  - Nyquist frequency for aliasing only shifted
    - ➔ Irregular sampling patterns



# Supersampling Caveats

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- **Popular mistake**
  - Sampling at the corners of every pixel
  - Pixel color by averaging
- **Problem**
  - Wrong reconstruction filter !!!
  - Same sampling frequency, but postfiltering with a box
  - Blurring: Loss of information
- **Post-Rekonstructions-Blur**



1x1 Sampling, 3x3 Blur



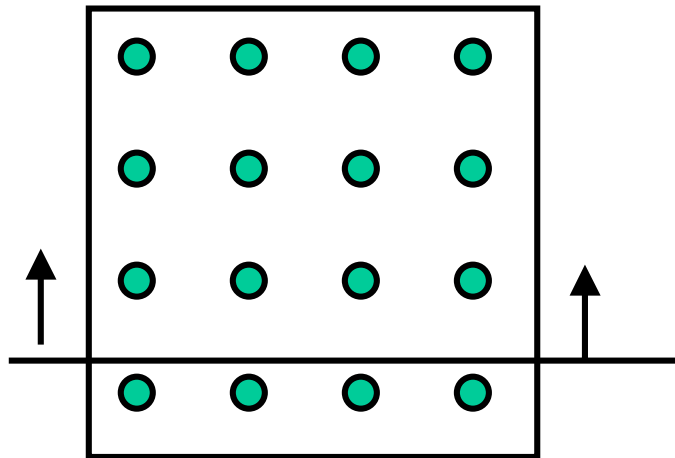
1x1 Sampling, 7x7 Blur

→ „Supersampling“ doesn't come for free

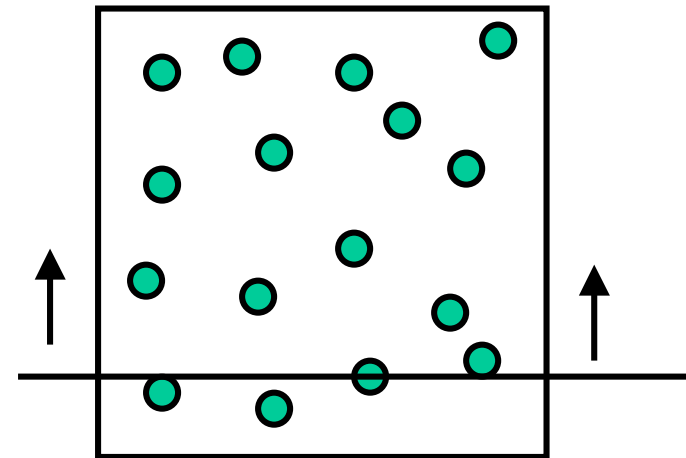
# Supersampling in Praxis

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- **Problems with regular supersampling**
  - Expensive: 4-fold to 16-fold effort
  - Non adaptive: Same effort everywhere
  - Too regular: Reduced number of levels
- **Introduce irregular sampling pattern**



0 → 4/16 → 8/16 → 12/16 → 16/16



Better, but noisy

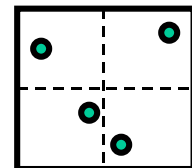
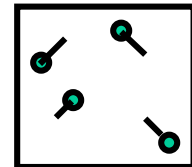
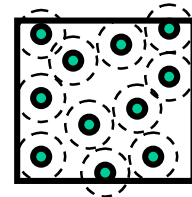
→ **Stochastic supersampling**

- Or analytic computation of pixel coverage and pixel mask

# Stochastic Sampling

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- **Requirements**
  - Even distribution
  - Little correlation between samples
  - Incremental generation
- **Generation of samples**
  - Poisson-disk-sampling
    - Fixes a minimum distance between samples
    - Random generation of samples
      - Rejection, if too close to other samples
  - Jittered sampling
    - Random perturbation from regular positions
  - Stratified Sampling
    - Subdivision in areas with one random sample each
  - Quasi-random numbers (Quasi-Monte-Carlo)



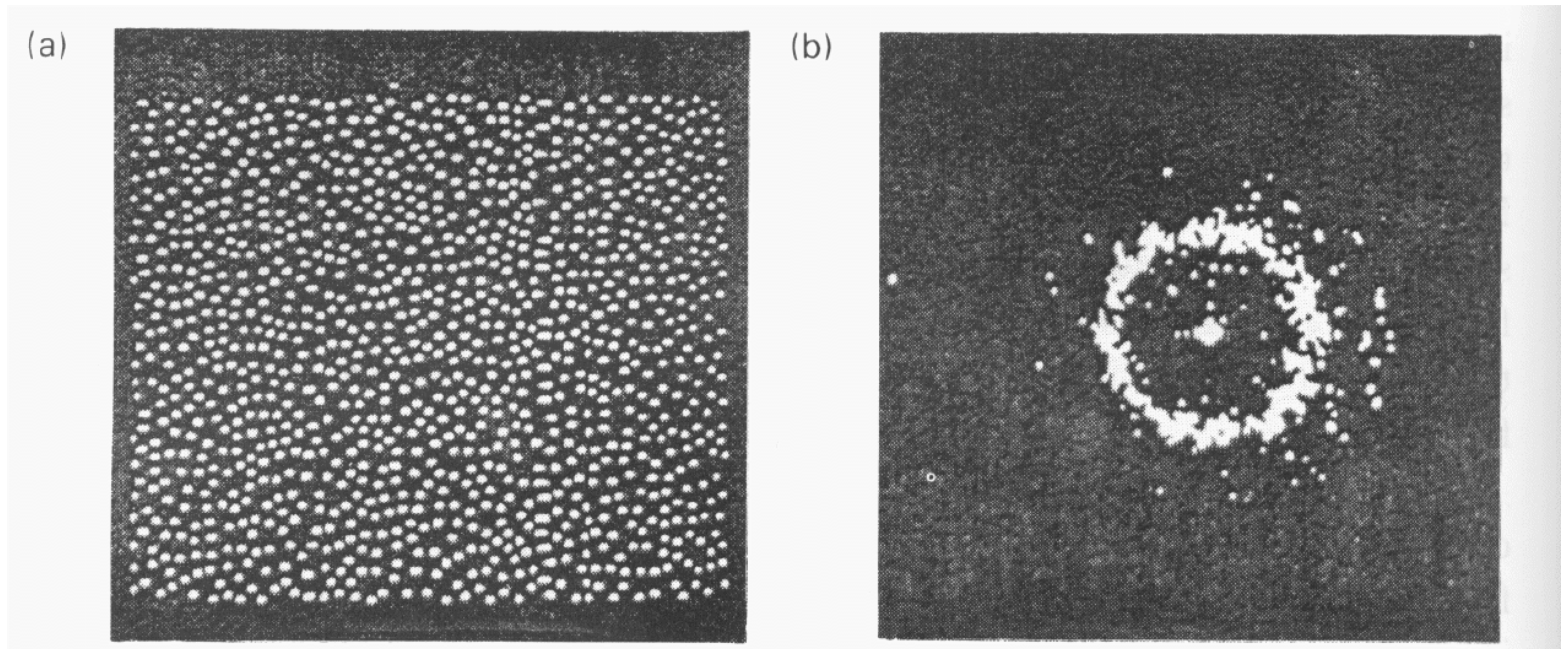


# Poisson-Disk-Sampling

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- **Motivation**

- Distribution of the optical receptors on the retina (here: ape)

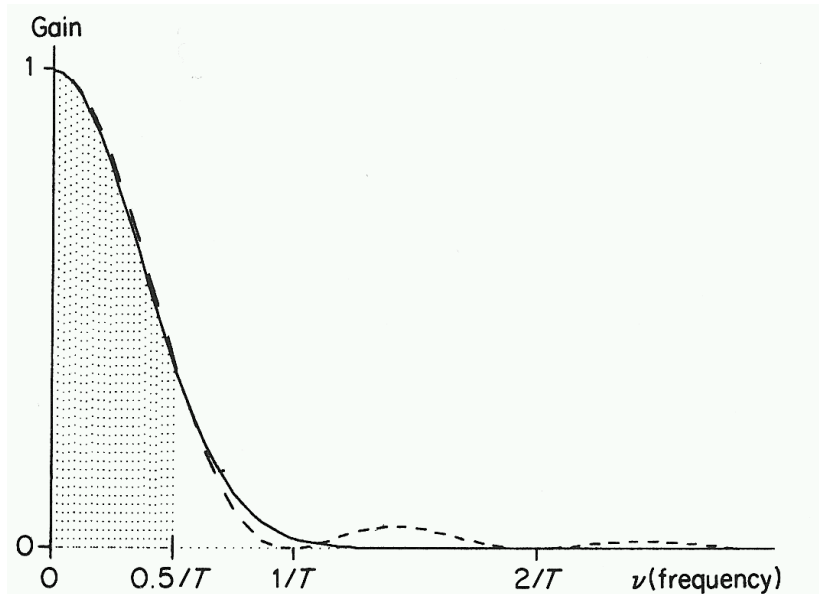


**Distribution of the receptors**

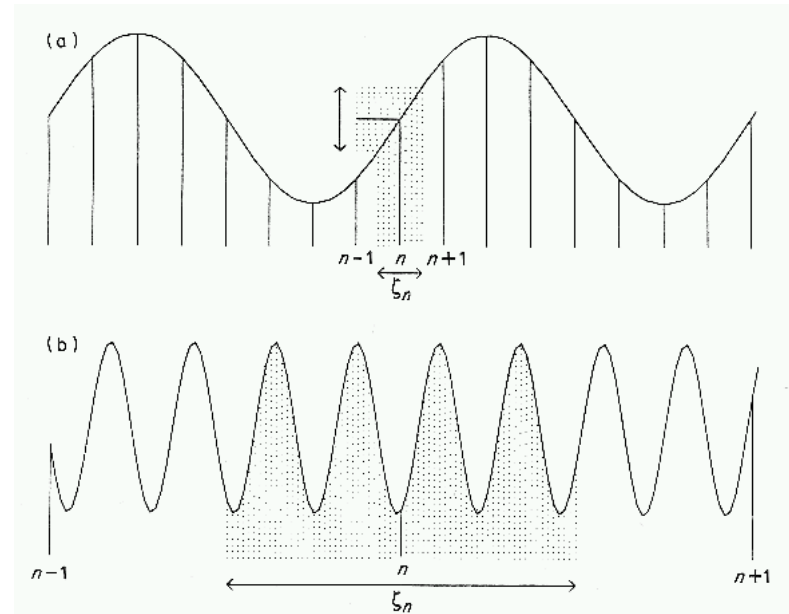
**Fourier analysis**

# Why does it work?

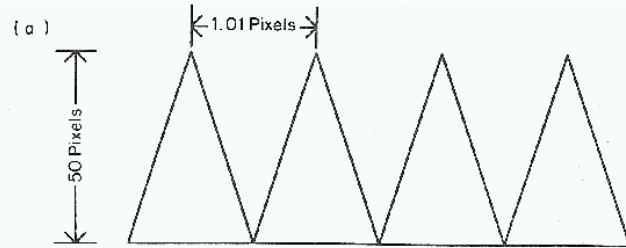
- **Exploits human perception**
  - Very sensitive to regular structures
  - Insensitive against (high frequency) noise
- **Stochastic Sampling**
  - Transforms ignored high frequency bands into noise



— **Gaußsches Jittering**  
- - - **White-Noise Jittering**



# Examples



## Triangle comb

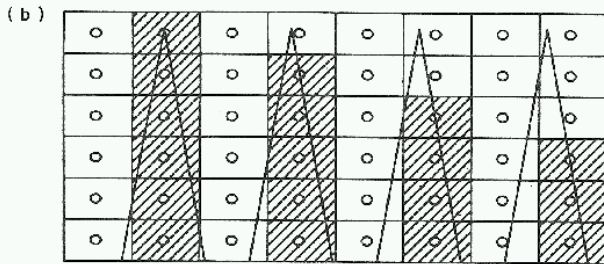
(B: 1.01 pix, H: 50 pix):

1 sample, no jittering

1 sample, jittering

16 samples, no jittering

16 samples, jittering



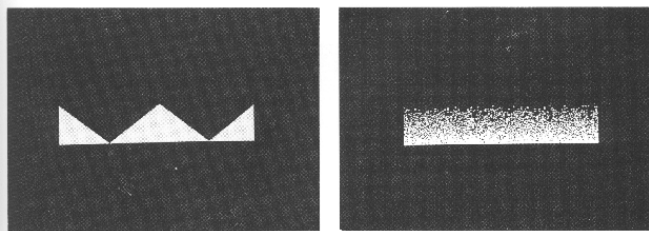
## Motion Blur:

1 sample, no jittering

1 sample, jittering

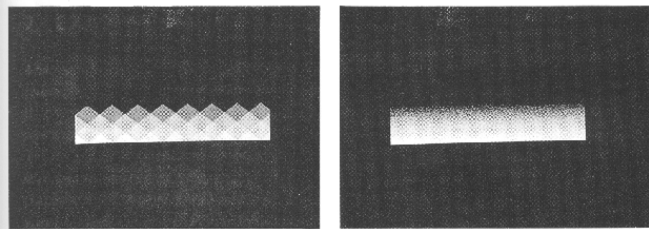
16 samples, no jittering

16 samples, jittering



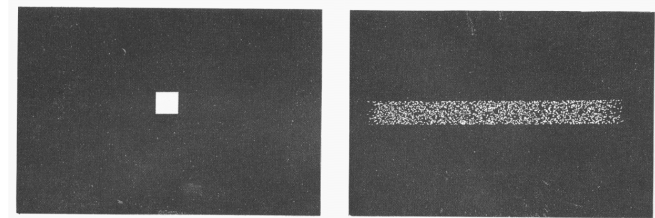
(c)

(d)



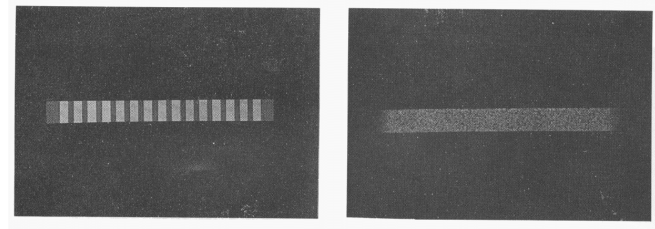
(e)

(f)



(a)

(b)



(c)

(d)

# Comparison

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**Regular, 1x1**



**Regular 3x3**



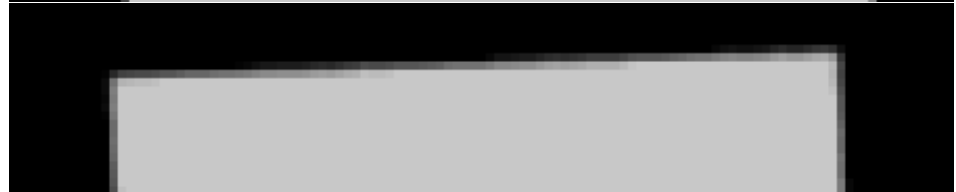
**Regular, 7x7**



**Jittered, 3x3**



**Jittered, 7x7**

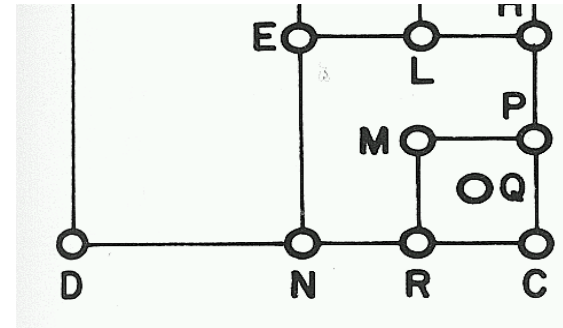


# Adaptive Supersampling

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- **Algorithm**

- Sampling at corners and mid points
- Recursive subdivision of each quadrant
- Decision criterion
  - Color differences, ray trees, object-IDs, ...
- Filtering with weighted averaging
  - $\frac{1}{4}$  from each quadrant
  - Quadrant:  $\frac{1}{2}$  (midpoint + corner)
    - Recursion



- **Extension**

- Jittering of the samples