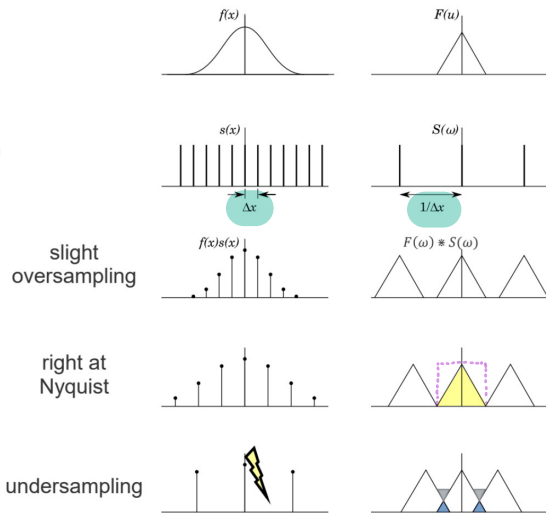


Sampling

- is the multiplication of a signal with a comb-function in the spatial domain
- a continuous (natural) signal is discretised for representation
- the distance of the dirac-pulses in the comb defines the sampling rate

- Continuous function
 - Band-limited Fourier transform
- Sampled at discrete points
 - Multiplication with Comb function in space domain
 - Corresponds to convolution in Fourier domain
 - Multiple copies of the original spectrum



Reconstruction

reconstruct the original frequency band by applying a Low-pass filter

→ box is optimal reconstruction filter but costly, sinc² as cheaper solution (Artefacts)

[sinc² is Linear interpolation (triangle function in spatial domain)]

→ distinguish between bad sampling (aliasing) and bad reconstruction

Aliasing Artefacts

- stair cases (e.g. diagonal line)
 - Moiré Patterns (e.g. aliasing on a checkerboard)
 - cart wheels (moving anti-clockwise in movie)
- } spatial aliasing
- } temporal aliasing

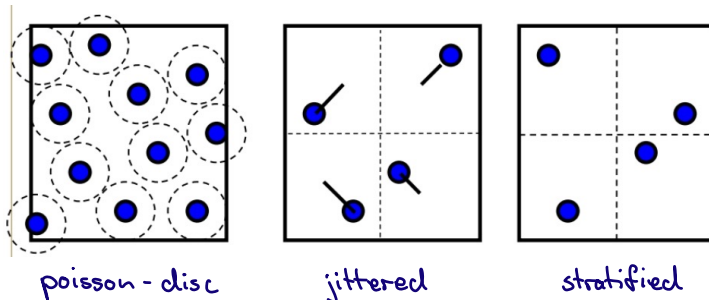
Antialiasing

sources for high frequencies: edges, silhouettes, discontinuities, illumination

- pre-filtering: apply low-pass filter on original signal (Limit highest frequencies)
- super-sampling: more samples per pixel → doesn't eliminate aliasing (f_{nyq} shifted)
→ irregular supersampling

Sampling Patterns

- **regular sampling**: N equal distributed samples per pixel
 - still aliasing if lines are thinner than a pixel or curvy
- **random sampling**: N random distributed samples per pixel
 - replaces aliasing by noise → usually destroys image completely
- **jittered sampling**: random deviation from regular points
 - replaces aliasing by soft noise
- **stratified sampling**: pixel is subdivided into N equal sized areas (grid)
 - one sample point is set randomly into each area
 - replaces aliasing by soft noise
- **Quasi-Monte-Carlo sampling**: advanced technique
- **poisson disk sampling**: random distribution of samples, but minimum distance between points (sampling of human eye)
 - replaces aliasing by soft noise (approximates human eye)



→ good sample count per pixel is 4 or 16

Aliasing and Sampling in digital Cameras

- most cameras do **low-pass pre-filtering** → (mostly) no aliasing
- optical zoom defines the **maximum pixel** count the camera can set by sampling
- digital zoom is **calculating image bigger** without increasing the sample count

Lecture Slides about Sampling and Reconstruction

The *Perfect* Case



Original function and its **band-limited** frequency spectrum

Signal sampling:

Mult./conv. with comb

Comb dense enough
(sampling $\geq 2 \cdot \text{bandlimit}$)

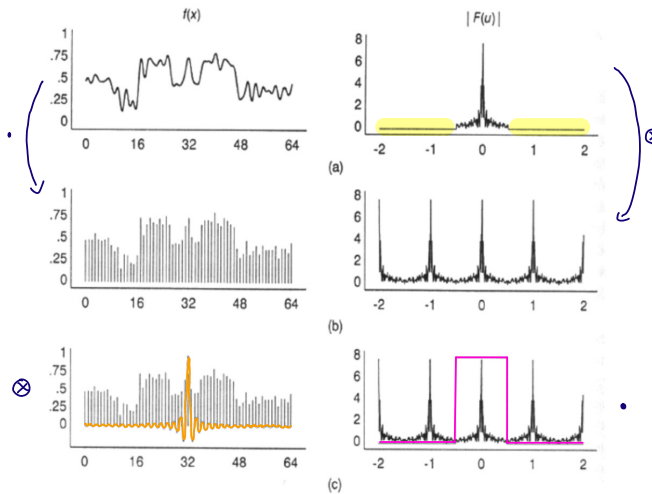
Frequency spectrum is replicated

Bands do not overlap

Correct reconstruction filtering

Fourier: **Box** (mult.)
Image: **sinc** (conv.)

Only one copy



result after reconstruction

→ box function

Correct Sampling / *Bad* Reconstruction



Reconstruction with ideal sinc

Identical signal

Approximate filtering

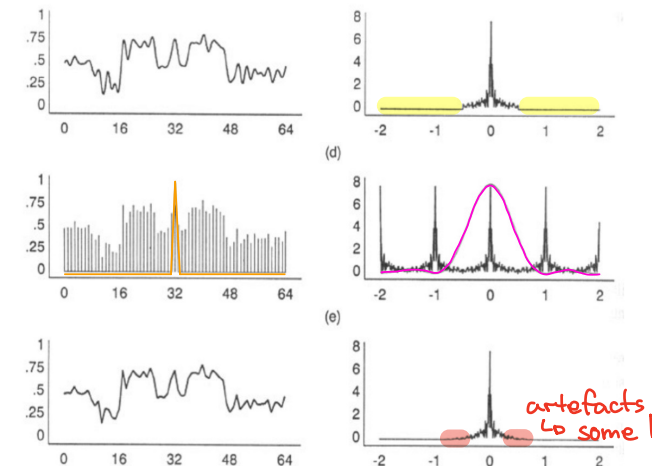
Space: **tri** (conv.)

Fourier: **sinc²** (mult.)

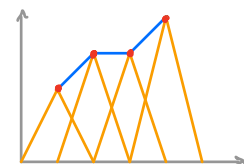
High frequencies are not ignored

→ Aliasing

Reconstruction with tri function
(= piecewise linear interpolation)



tri (cap - function) is
Linear interpolation



artefacts
to some higher frequencies

Sampling with *Too Low Frequency*



Original function

Sampling below Nyquist:

Comb spaced too far
(sampling < 2 * bandlimit)

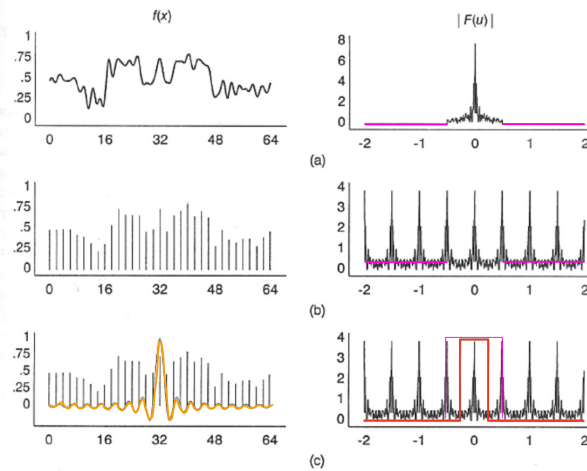
Frequency bands overlap

Correct filtering

Image: sinc (conv.)

Fourier: box (mult.)

Band overlap in frequency domain cannot be corrected - aliasing



→ result will not be similar to input

Sparse Sampling + *Bad* Reconstruction



Reconstruction with ideal sinc

Reconstruction fails (frequency components wrong due to aliasing !)

Filtering with sinc² function

Reconstruction with tri function (= piecewise linear interpolation)

Even worse reconstruction

