T2 – Filtering, Fourier Transform, Aliasing

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Discussion P3

- b) IV: $\mathbf{n}' \bullet \mathbf{p}' = 0$

$$(\tilde{A}\mathbf{n})^T \cdot (A\mathbf{p}) = \mathbf{n}^T \tilde{A}^T \cdot A\mathbf{p} = 0$$

- c) I: Einheitsquaternion!

$$\mathbf{n} = \frac{[3\ 0\ 4]}{\|[3\ 0\ 4]\|} = [0.6\ 0\ 0.8]$$

Aufgabe 1 – Convolution

- Convolution: combine two functions into one
- Definition:

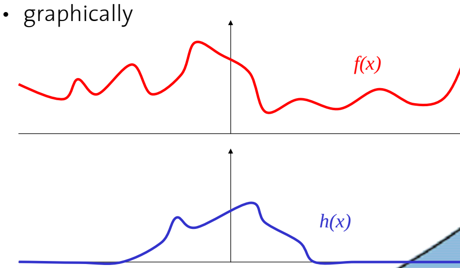
inversion

$$f(x) * g(x) = \int_{-\infty}^{\infty} f(\alpha) g(x - \alpha)\, d\alpha$$

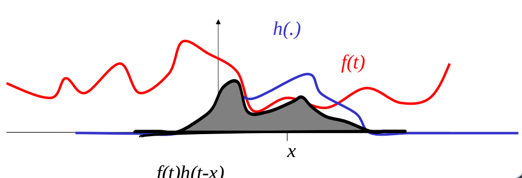
$$f(x) * g(x) = \sum_{m=0}^{M-1} f(m)\, g(x - m)$$

Convolution

- graphically



Convolution



Convolution

- Convolution animated:
  http://mathworld.wolfram.com/Convolution.html
- Aufgabe 1:
  - sequence of impulses – continuous formula, but only evaluates to values != 0 for impulses => scale with amplitude of impulse
  - can be solved using Maple, Matlab

Aufgabe 2 & 3

- Fourier Analysis
  - only basics here
  - more in lecture
- Sampling
- Results: e.g. band width limitation

Fourier – Why

- 2D images are continous 2D functions: f(x, y)
- On screen, these images are represented by discrete samples, the pixels
- Sampling can cause artifacts
- Fourier space is **the** space for **analyzing and understanding** what happens when we sample.

Fourier Transform - Sum of sin and cos

- *It can be shown that each periodic function can be represented by a sum of sin- and cos-functions, if the periods of the function statisfy certain simple conditions (Dirichlet's conditions about finitness of the periods).*
- *Like a projection of a vector onto basis vectors, a function gets projected onto basis functions => basis functions are orthogonal*

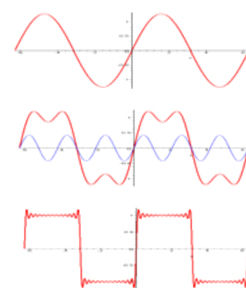
Sum of sin and cos – Example

$$f(x) = \frac{4k}{\pi} \sin x$$

$$f(x) = \frac{4k}{\pi}\left(\sin x + \frac{1}{3}\sin 3x\right)$$

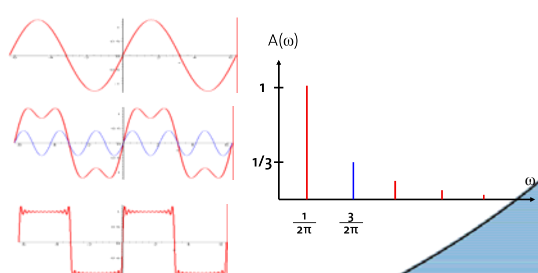
$$f(x) = \frac{4k}{\pi}\left(\sin x + \frac{1}{3}\sin 3x + \cdots + \frac{1}{25}\sin 25x\right)$$

T = 2π　T = 2/3π　T = 2/25π



Spatial and Frequency Domain

Spatial　　Frequency



Fourier Basics

$$F\{f(x)\} = F(u) = \int_{-\infty}^{\infty} f(x)\, e^{-j2\pi ux}\, dx$$

inverse: $$F^{-1}\{F(u)\} = f(x) = \int_{-\infty}^{\infty} F(u)\, e^{j2\pi ux}\, du$$

Euler: $$e^{jx} = cox(x) + j\sin(x)$$

Fourier – what else

- Rarely ever want to transform to Fourier space.
- By looking at F(u), we get a feel for the "frequencies" of the image.
- Space of Fourier transformed image: so-called frequency space.
- Intuitively: the sharper an edge, the higher the frequencies.

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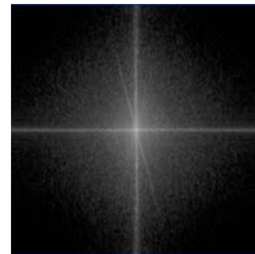
Fourier and Aliasing

Spectrum of a 2D Image



Source: Peter R. Fornaro

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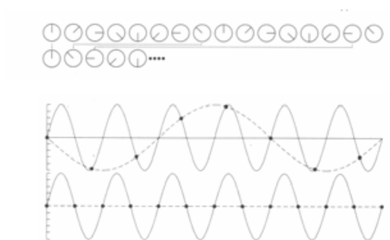
Fourier and Aliasing

Sampling - Examples

- Inadequate sampling



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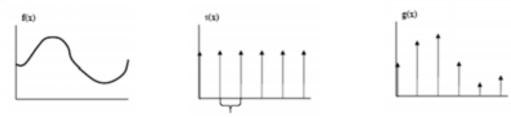
Fourier and Aliasing

Sampling - Mathematically



Original function

•Sampling function
•Shah function
•Impuls train
-> delta fct.

f(x)s(x)

! f(x)*s(x)

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Fourier and Aliasing

Result of Analysis

- „Fourier analysis for understanding aliasing"
- Selection of sampling rate (lecture):
  - Let W be the largest u for which |F(u)| > 0
  - Choose $u_{sampling}$ > 2W (Shannon)
- Problem: image has high frequencies (e.g. sharp edges), such that W too large or inexistent
  -> filter the signal

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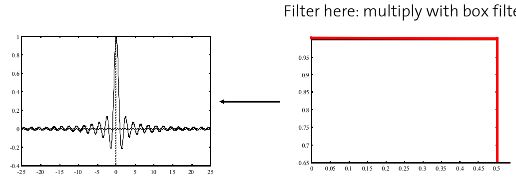
Fourier and Aliasing

Filtering

Spatial

Frequency

Filter here: multiply with box filter



Cut-off high frequencies

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Fourier and Aliasing

Convolution Theorem

- Convolution theorem:
  convolution in the spatial domain is equivalent to multiplication in the frequency domain, and vica versa

$$f(x)*g(x) \equiv F(u)G(u)$$

$$f(x)g(x) \equiv F(u)*G(u)$$

- => image gets **convoluted** with sinc function
  => sinc function „visible" in filtered image

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Fourier and Aliasing

Aufgabe 2 & 3

- Aufgabe 2:
  - a) describe more formally than your „friend"
  - b – e) ponder slides and script
- Aufgabe 3 a), b):

Image

↓ masking G (conv)

G(Image)

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Fourier and Aliasing

Aufgabe 3

$F^{-1}(H^{-1}(F(G(Image))))$

- c): Image → F(.) → Spectrum = $H^{-1}(F(G(Image)))$

masking: G(.) (conv)

filter H(.) (mult)

filter H^{-1}() (mult)

G(Image) → F(.) → H(Spectrum) = F(G(Image))

d) noise

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Fourier and Aliasing

Aufgabe 4

- Applet
- Question: condition
  - easy: script, slides
  - Verify in applet
  - change settings
- free to experiment!

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Fourier and Aliasing

Aufgabe 5 - Reconstruction

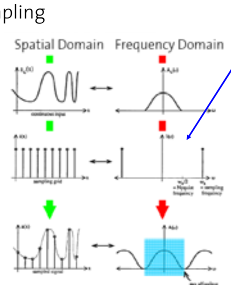
- so far: sampling

Fourier transform of a sample fct. is again a sample fct.

f(x)

s(x)

f(x)s(x)



F(u)

S(u)

Aufgabe 1

F(u)*S(u)

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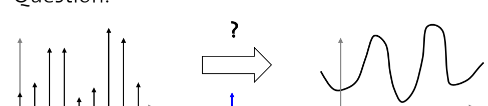
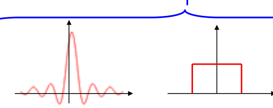
Fourier and Aliasing

Reconstruction

- Question:



Convolution with filter



c)

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Fourier and Aliasing

Reconstruction Problems

Spatial Domain Frequency Domain

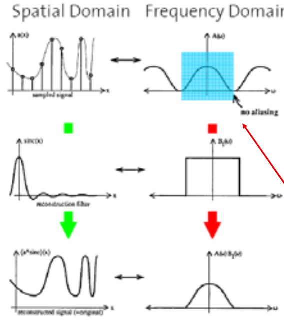
f(x)s(x)

F(u)*S(u)

filter

FT filter

reconstructed



Explains problems
-> lecture

Aufgabe 5

- a) actually, the answer is in the lecture slides…
- b) convolution theorem and a)
- c)
  I. Aufgabe 1
  II. consider period of b)
  III. support