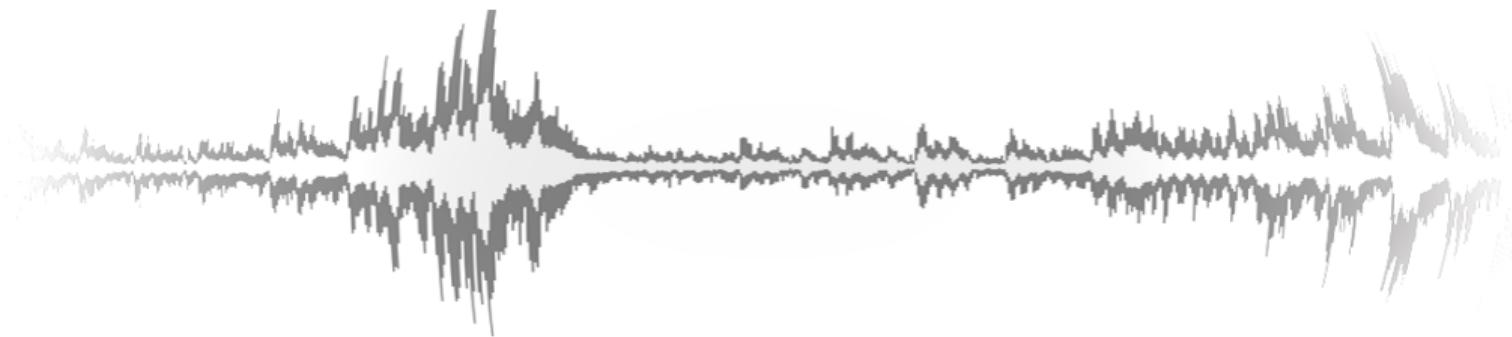


# Digital Signal Processing for Music

## Part 10: Discretization 1—Sampling

alexander lerch



# sampling and quantization

## introduction

digital signals can only be represented with a limited number of values



- time discretization:  
**sampling**
  
- amplitude discretization:  
**quantization**

# sampling and quantization

## introduction

digital signals can only be represented with a limited number of values

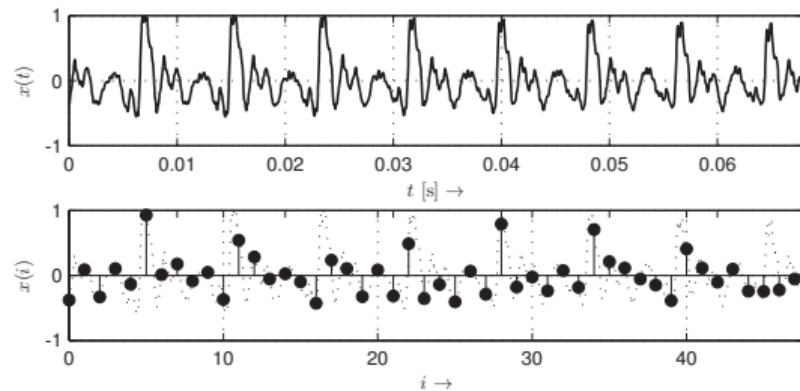
⇒

- time discretization:  
**sampling**
  
- amplitude discretization:  
**quantization**

# sampling and quantization

## sampling

$$T_S = \frac{1}{f_S}$$



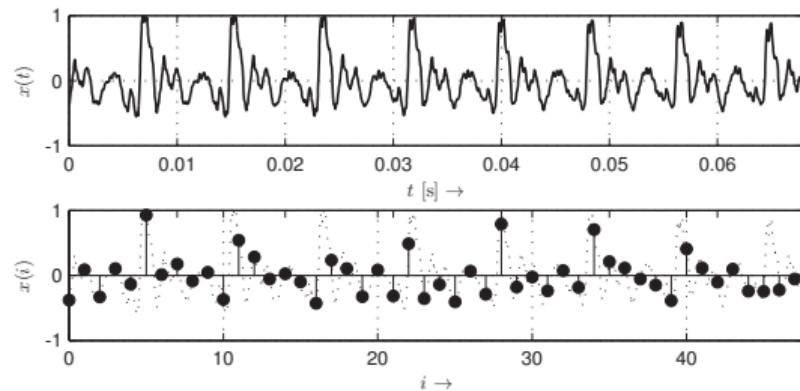
typical sample rates

- 8-16 kHz: speech (phone)
- 44.1-48 kHz: (consumer) audio/music
- higher: production audio

# sampling and quantization

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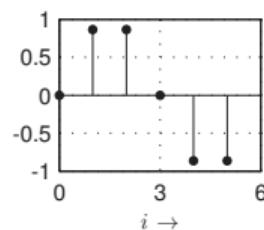
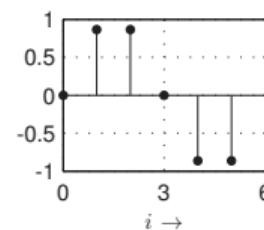
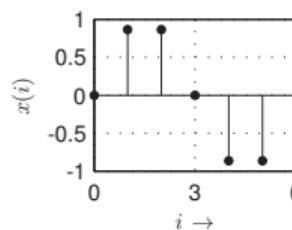
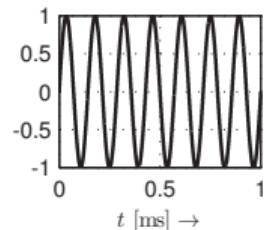
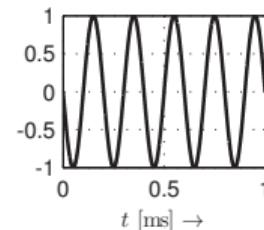
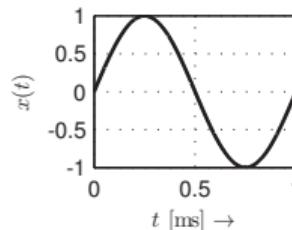
# sampling and quantization

## sampling ambiguity 1/4

# sampling and quantization

## sampling ambiguity 2/4

$$\begin{aligned}f_0 &= [1, 5, 7 \text{ kHz}] \\f_S &= 6 \text{ kHz}\end{aligned}$$



# sampling and quantization

## sampling ambiguity 3/4

### wagon wheel effect



# sampling and quantization

## sampling ambiguity 3/4

### wagon wheel effect



- ①  $f_{wheel} < \frac{f_s}{2}$ : speeding up
- ②  $\frac{f_s}{2} < f_{wheel} < f_s$ : slowing down
- ③  $f_{wheel} = f_s$ : standing still
- ④ . . .

# sampling and quantization

## sampling ambiguity 3/4

### wagon wheel effect



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# sampling and quantization

## sampling ambiguity 3/4

### wagon wheel effect



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# sampling and quantization

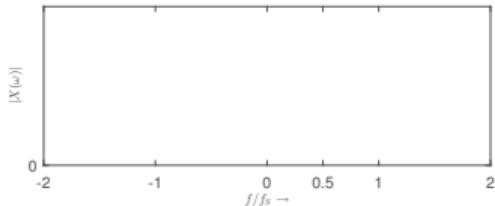
sampling ambiguity 4/4

[http://youtu.be/uENITui5\\_jU](http://youtu.be/uENITui5_jU)

# sampling and quantization

## sampling

$$x(t) \mapsto X(j\omega)$$

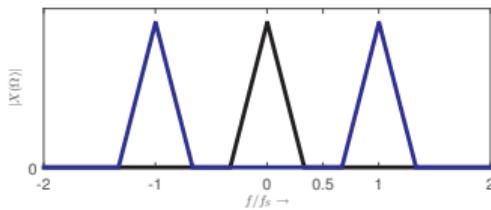
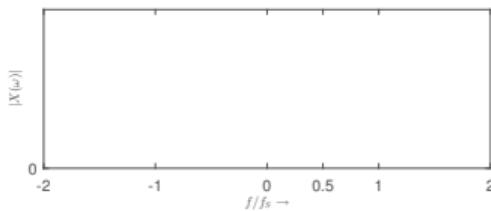


# sampling and quantization

## sampling

$$x(t) \mapsto X(j\omega)$$

$$x(t) \cdot \delta_T \mapsto X(j\omega) * \delta_{\omega_T}$$

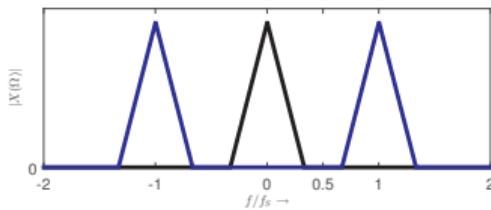
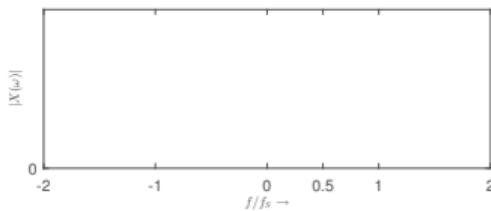


# sampling and quantization

## sampling

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# sampling and quantization

## sampling theorem

### sampling theorem

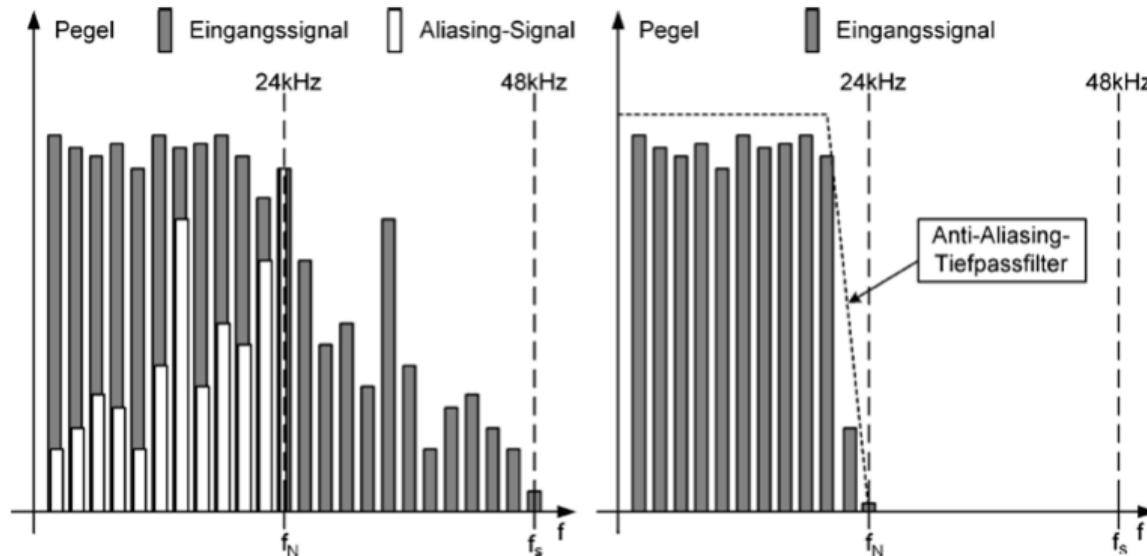
A sampled audio signal can be reconstructed **without loss of information** if the sample rate  $f_S$  is higher than twice the bandwidth  $f_{\max}$  of the signal.

$$f_S > 2 \cdot f_{\max}$$



# sampling and quantization

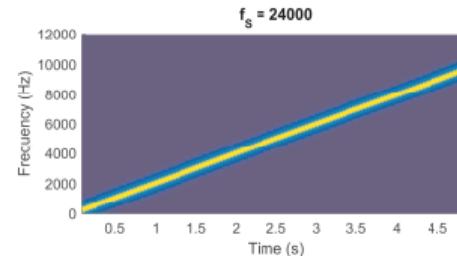
## sampling: aliasing



# sampling and quantization

sampling: aliasing examples 1/2

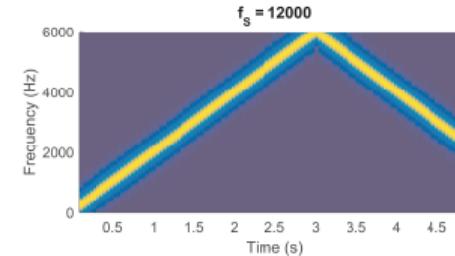
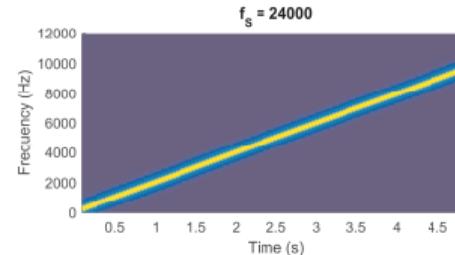
audio example: sinesweep 100–10k at 24, 12, 6k



# sampling and quantization

## sampling: aliasing examples 1/2

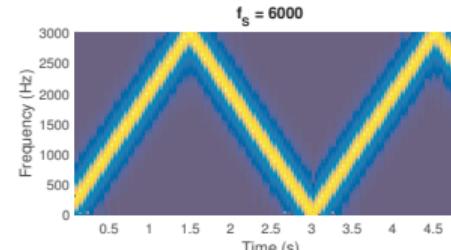
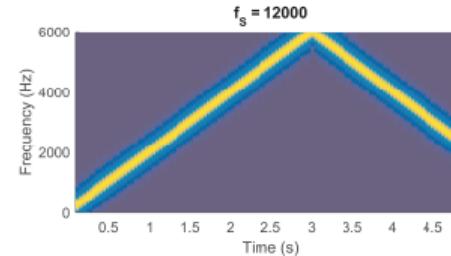
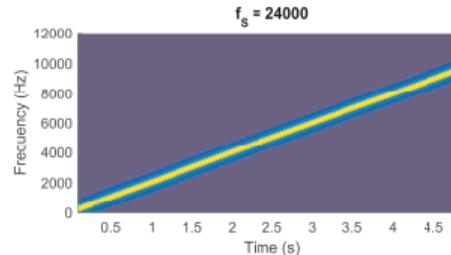
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# sampling and quantization

## sampling: aliasing examples 1/2

audio example: sinesweep 100–10k at 24, 12, 6k



# sampling and quantization

sampling: aliasing examples 2/2

## ● bigband

- original (48 kHz): 
- samples discarded (6 kHz): 
- downsampling w/ anti-aliasing filter (6 kHz): 

# sampling and quantization

sampling: aliasing examples 2/2

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# sampling and quantization

sampling: summary 1/2

continuous input signal



① anti-aliasing filter

filtered continuous input signal

② sampling

sampled input signal

③ reconstruction filter



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



## ① anti-aliasing filter

filtered continuous input signal

## ② sampling

sampled input signal

## ③ reconstruction filter



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



## ① anti-aliasing filter

filtered continuous input signal

## ② sampling

sampled input signal

## ③ reconstruction filter



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



## ① anti-aliasing filter

filtered continuous input signal

## ② sampling

sampled input signal

## ③ reconstruction filter



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



## ① anti-aliasing filter

filtered continuous input signal

## ② sampling

sampled input signal

## ③ reconstruction filter



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



① **anti-aliasing filter**

filtered continuous input signal

② **sampling**

sampled input signal

③ **reconstruction filter**



continuous output signal

# sampling and quantization

sampling: summary 1/2

continuous input signal



**① anti-aliasing filter**

filtered continuous input signal

**② sampling**

sampled input signal

**③ reconstruction filter**



continuous output signal

# sampling and quantization

sampling: summary 2/2

- sampling theorem

*A sampled audio signal can be reconstructed without loss of information if the sample rate  $f_S$  is higher than twice the bandwidth  $f_{\max}$  of the signal.*

- perfect reconstruction!
- ensure accordance through filtering, otherwise aliasing (mirror frequencies)
- band of interest does not have to be base band ( $0 \dots f_S/2$ ), but any band  $(k \cdot f_S/2 \dots (k + 1) \cdot f_S/2)$  as long as the bandwidth is not wider