

# Digital Signal Processing for Music

Part 9: Discretization, Part 1 - Sampling

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

» Time discretization:

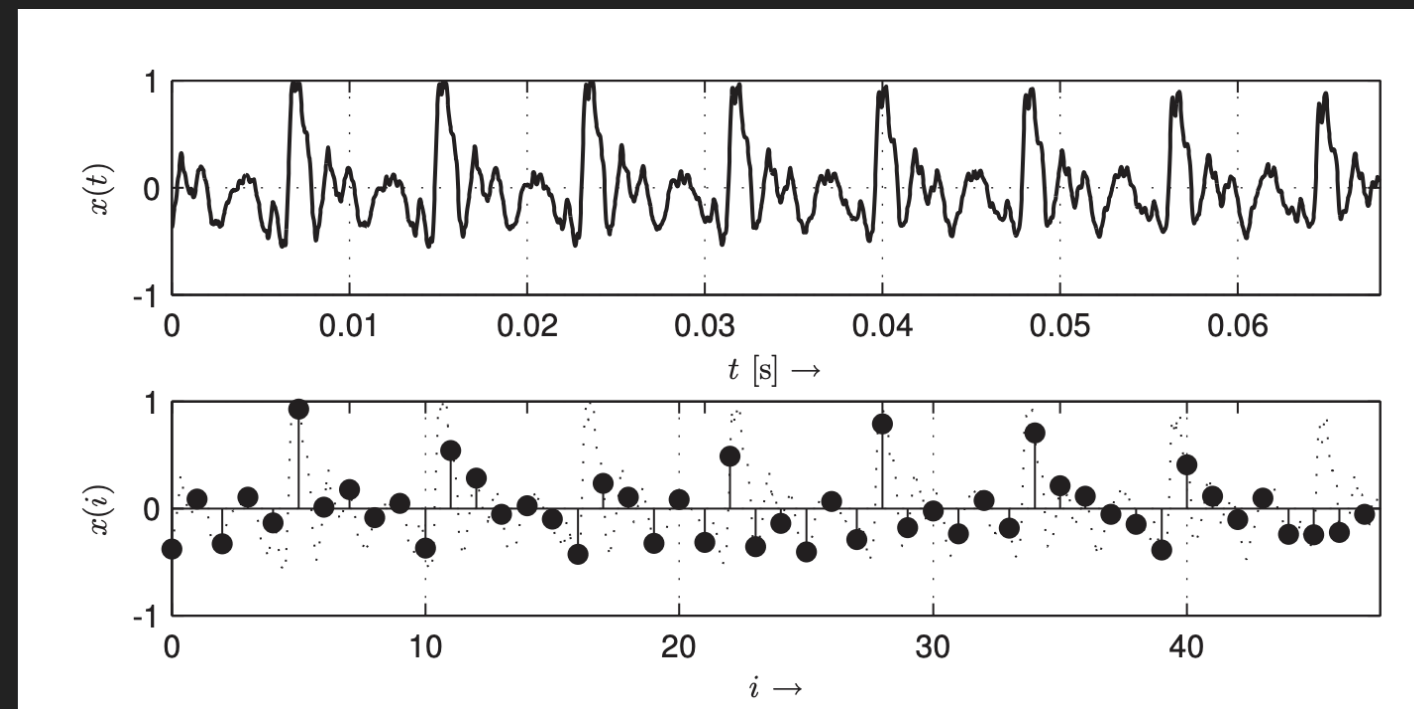
**Sampling**

» Amplitude discretization:

**Quantization**

# Sampling

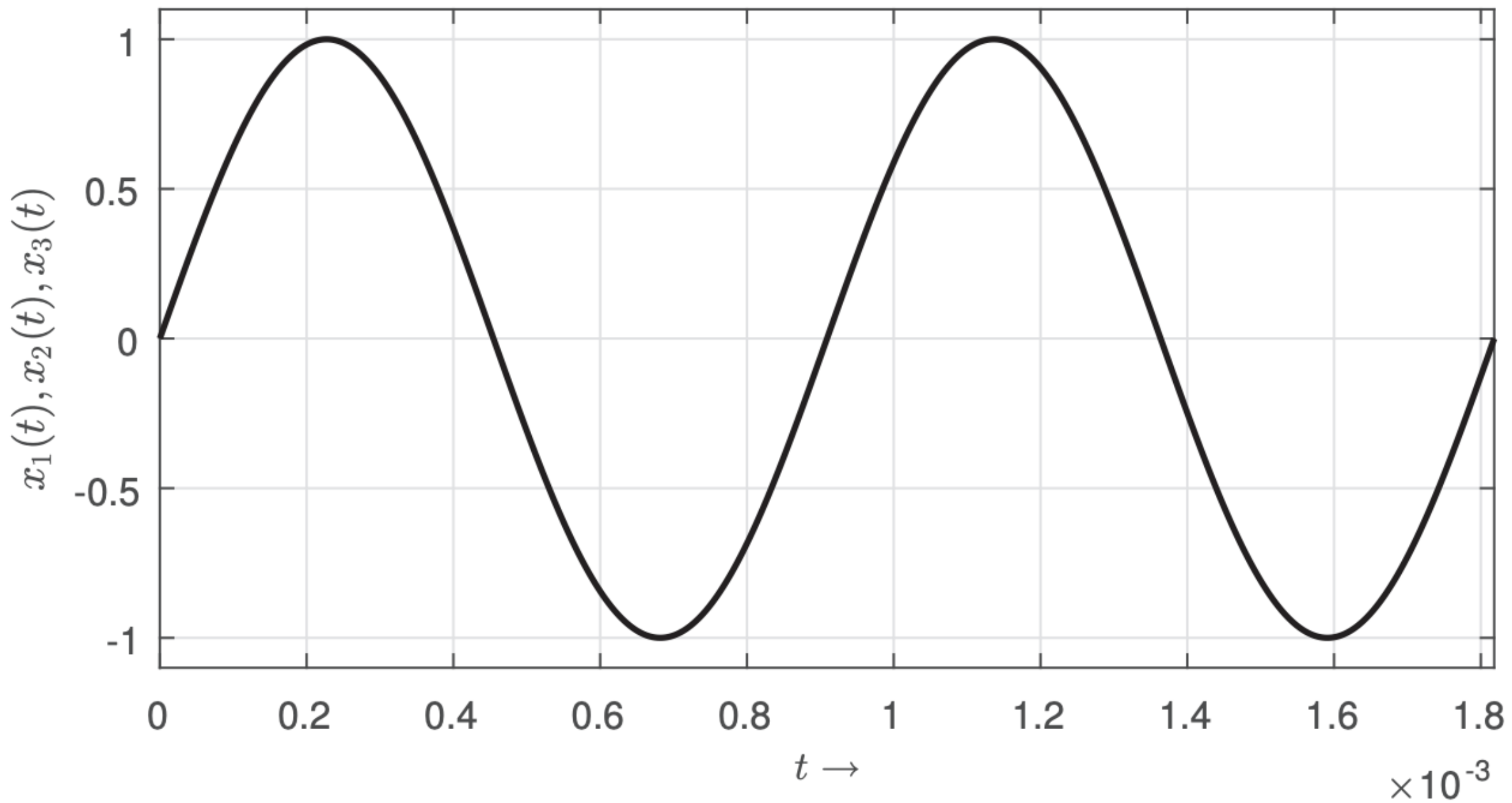
$$T_s = \frac{1}{f_s}$$



Typical Sample Rates

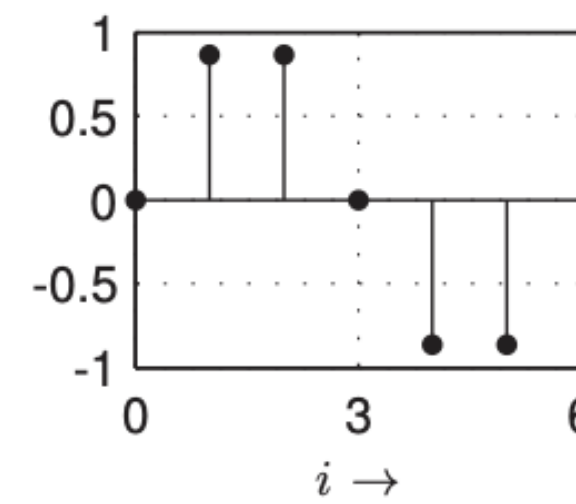
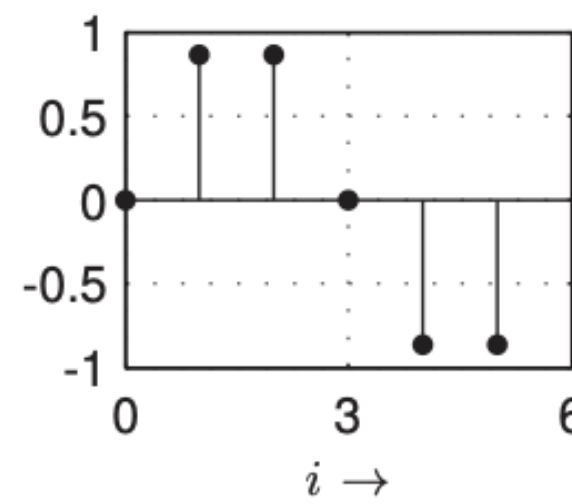
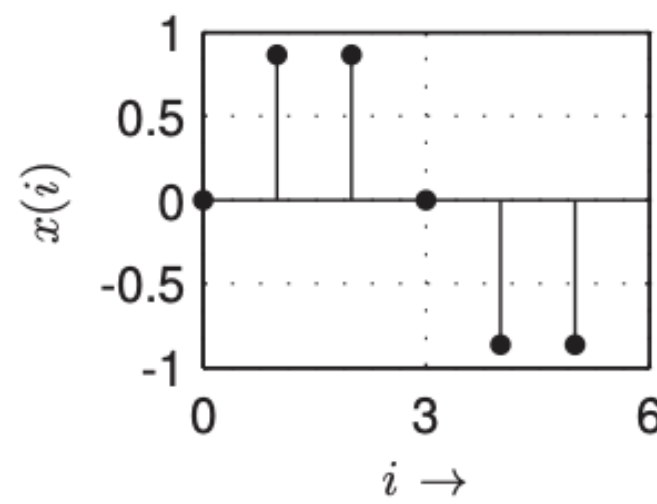
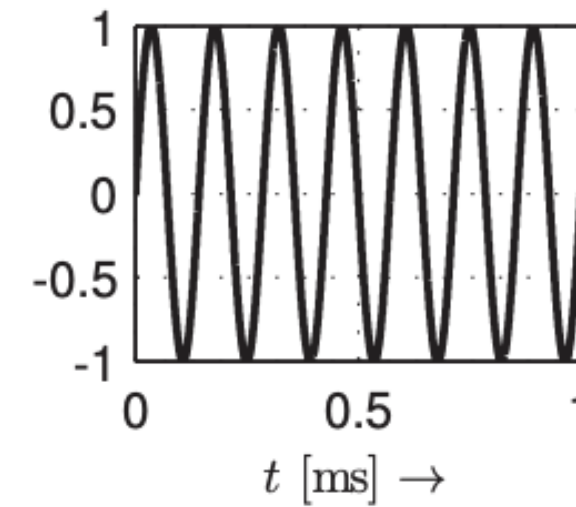
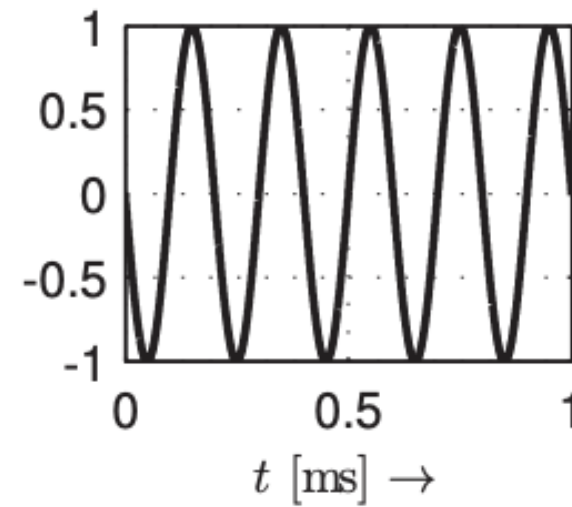
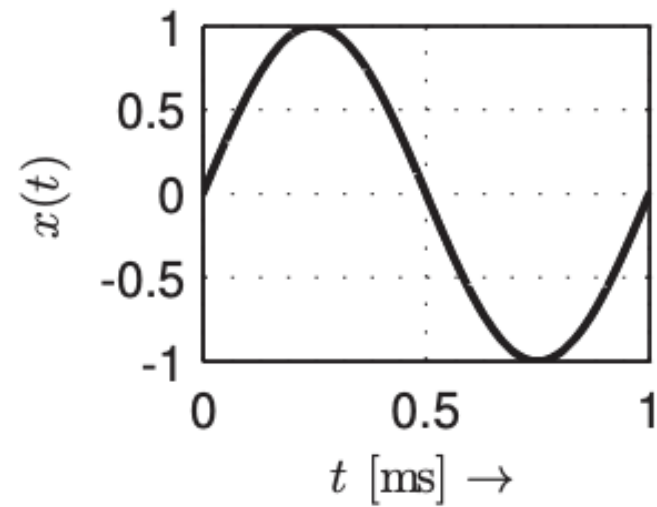
- » 8-16kHz: Speech (phone)
- » 44.1-48kHz: Consumer audio/music
- » Higher: Production audio

# Sampling Ambiguity



$$f_0 = [1, 5, 7\text{kHz}]$$

$$f_s = 6\text{kHz}$$



# Sampling Ambiguity: Wagon Wheel Effect

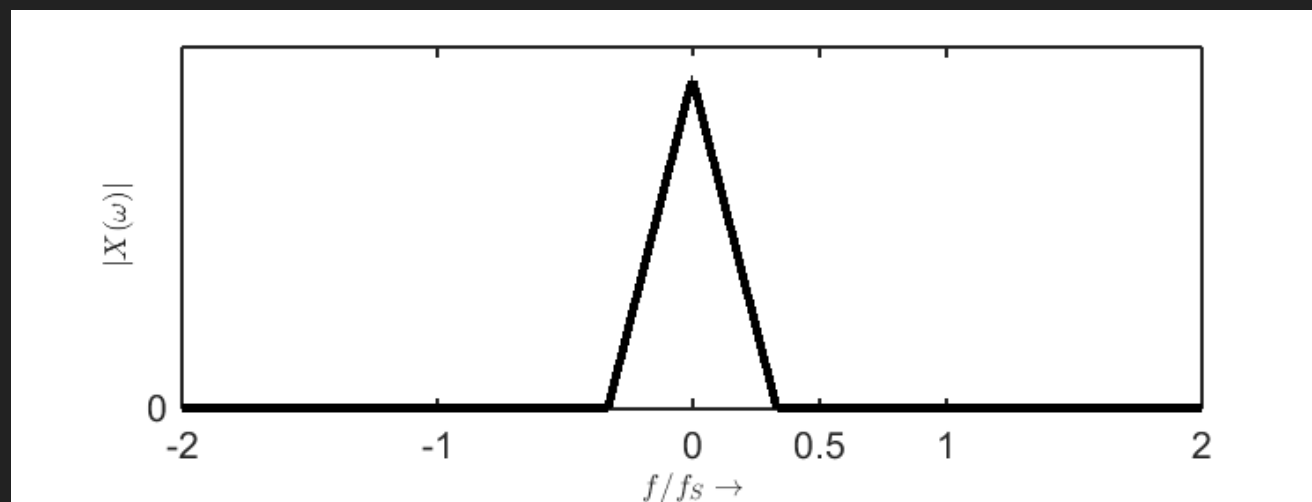


- »  $f_{wheel} < \frac{f_s}{2}$   
Speeding up
- »  $\frac{f_s}{2} < f_{wheel} < f_s$   
Slowing down
- »  $f_{wheel} = f_s$   
Standing still
- »  $f_{wheel}$  far from  $f_s$   
No effect

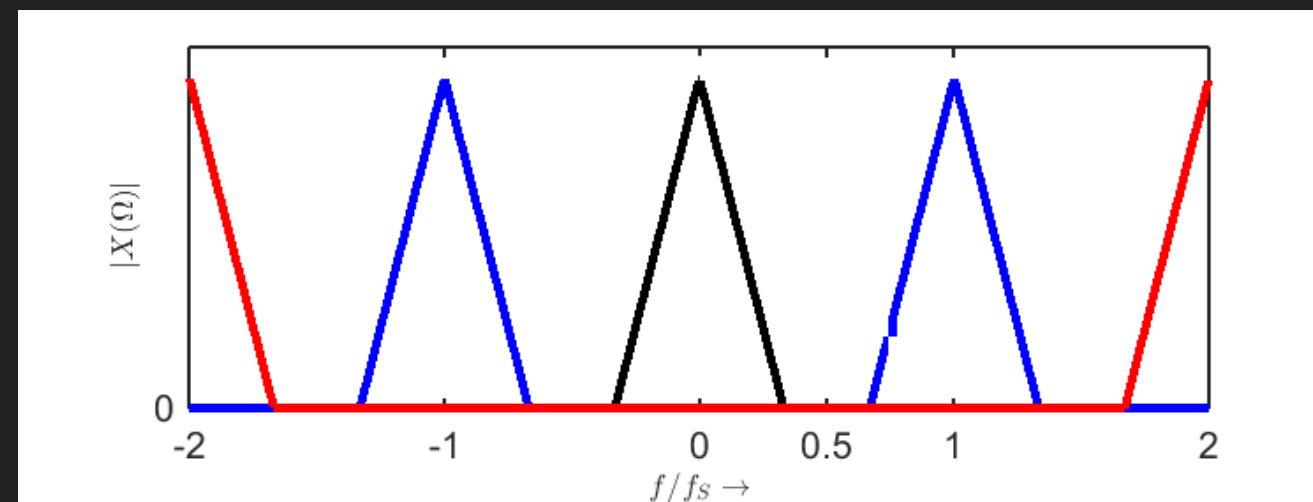


All this ambiguity is simply the intuitive understanding of aliasing.

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



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

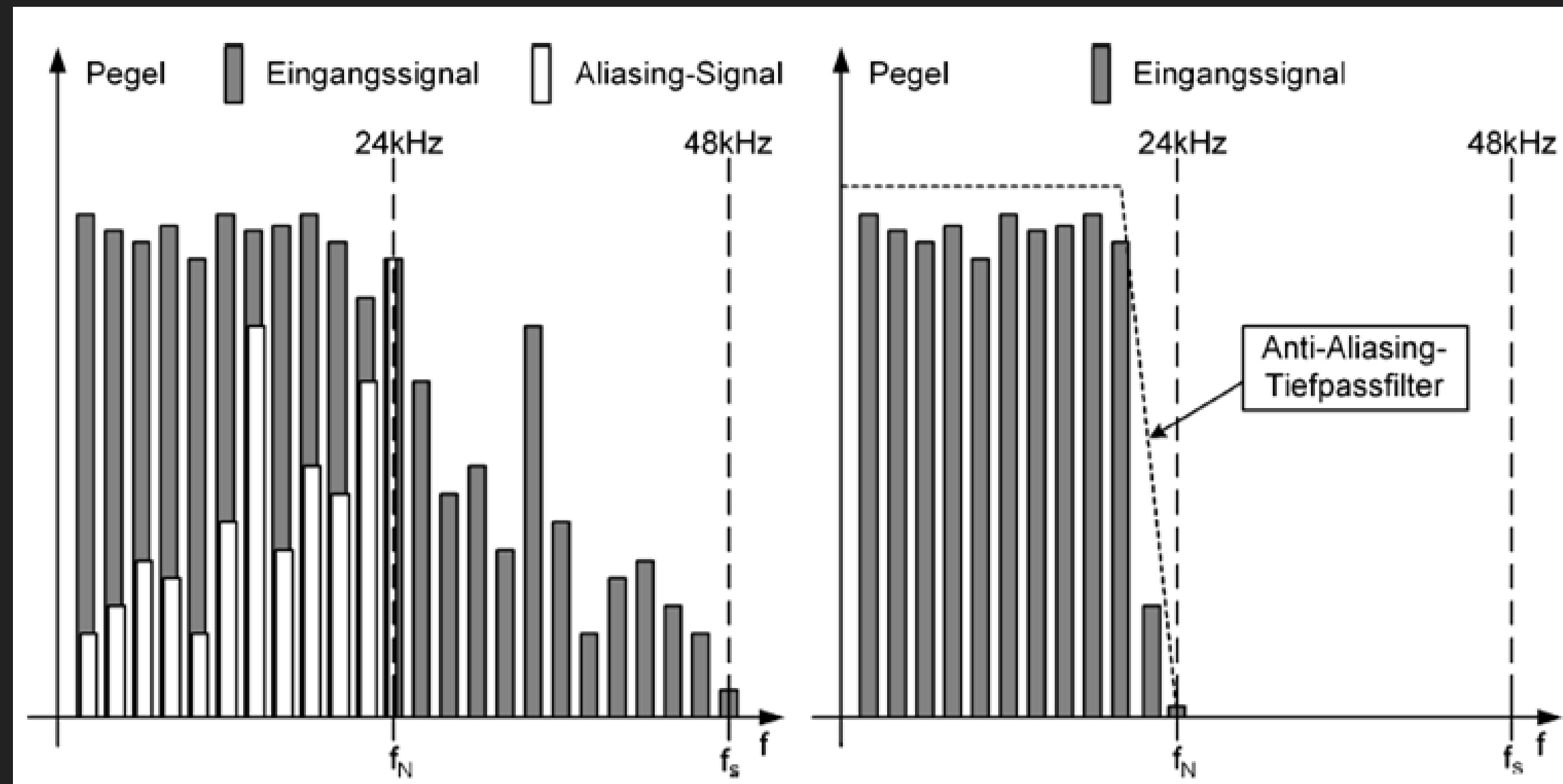




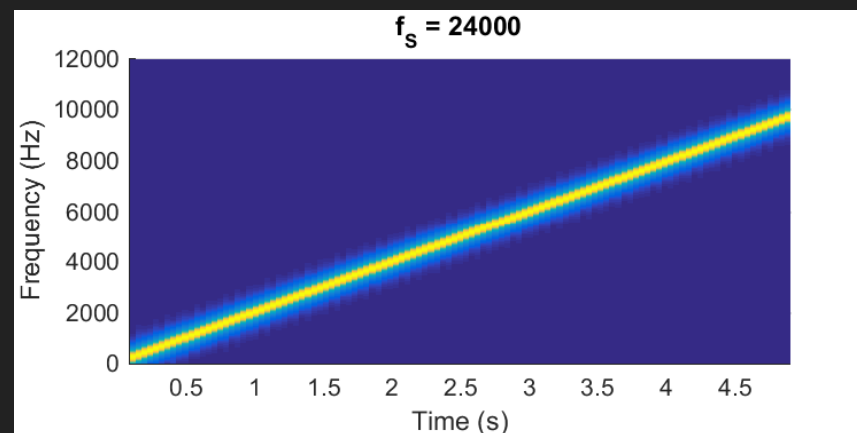
# Sampling Theorem

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.

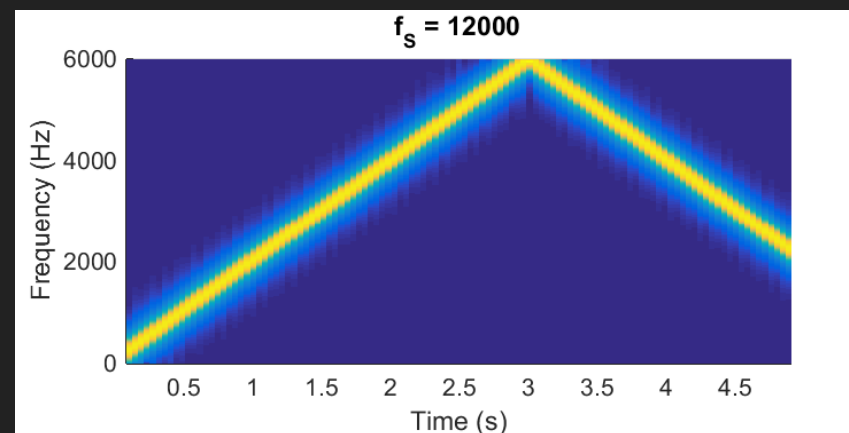
$$f_S > 2 \cdot f_{\max}$$



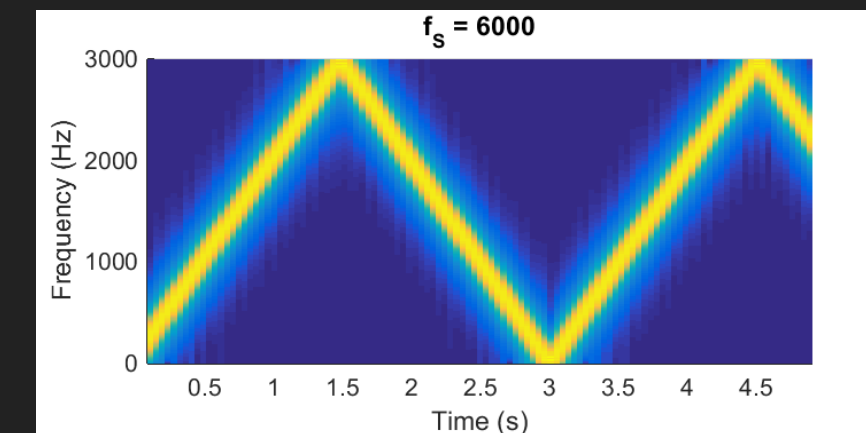
# Aliasing Examples: Sine sweep 100-10k @ 24, 12, 6k



▶ 0:00 / 0:05



▶ 0:00 / 0:05



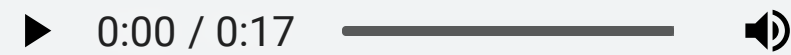
▶ 0:00 / 0:05

# Aliasing Examples: Music

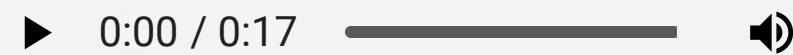
## Big Band



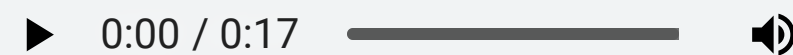
Original (48 kHz):



Samples discarded (6 kHz):



Downsampled w/ Anti-aliasing filter (6 kHz):



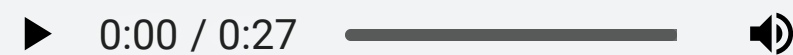
## Sax



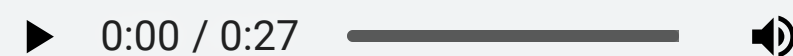
Original (48 kHz): *Sorry, don't have it :(*



Samples discarded (6 kHz):



Downsampled w/ Anti-aliasing filter (6 kHz):



# Summary

Continuous Input Signal



## 1. **Anti-Aliasing Filter**

Filtered continuous input signal

## 2. **Sampling**

Sampled input signal

## 3. **Reconstruction Filter**



Continuous Output Signal

# Summary

## 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  $(0 \dots \frac{f_s}{2})$ , but any band  $(k \cdot \frac{f_s}{2} \dots (k + 1) \cdot \frac{f_s}{2})$  as long as the **bandwidth** is not wider, and unwanted frequencies are filtered out.