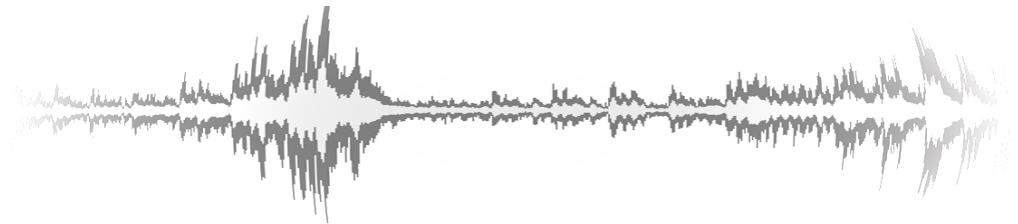


# Digital Signal Processing for Music

## Part 3: Signals

alexander lerch



# introduction

## sound

- sound is a vibration propagating through a medium
- vibrating source excites medium and vibration is received by microphone/ear
- microphone converts sound pressure (velocity) into electrical voltage
- the vibration/oscillation at each of these steps is a **signal**
- here, we are mostly interested in the electrical signal
- audio signal
  - representation of sound (speech, music, etc.)
  - main frequency content is below 12[kHz]

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# audio signals

## categorization

- **deterministic signals:**

*predictable*: future shape of the signal can be known (example: sinusoidal)

- **random signals:**

*unpredictable*: no knowledge can help to predict what is coming next (example: white noise)

Every “real-world” audio signal can be modeled as a time-varying combination of

- (quasi-)periodic parts
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## properties of real-world signals

- **real-valued:**

- real-world signals are usually real-valued.

- **finite:**

- amplitude:  $\max|x(t)| < \infty$
- energy or power:

$$E = \int_{-\infty}^{\infty} x^2(t) dt$$

$$P = \lim_{T \rightarrow \infty} \frac{1}{2T} \int_{-T}^T x^2(t) dt$$

- **smooth:**

- no “abrupt” changes  $\rightarrow$  finite bandwidth

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## periodic signals 1/3

periodic signals most prominent examples of deterministic signals:

$$x(t) = x(t + T_0)$$

$$f_0 = \frac{1}{T_0}$$

$$\omega_0 = \frac{2\pi}{T_0}$$

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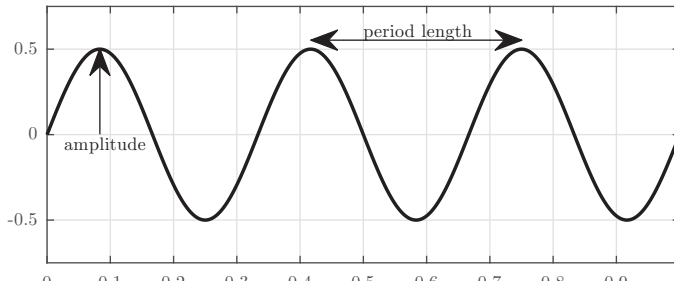
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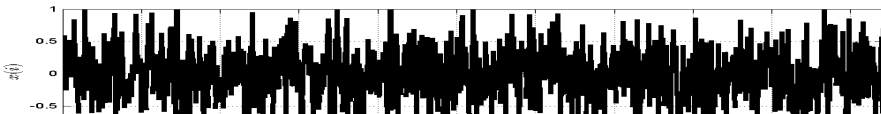
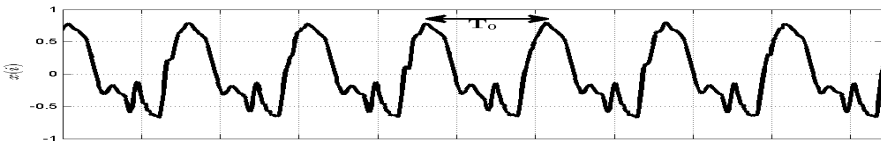
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periodic signals can be reconstructed through a sum of sinusoidals at frequencies  $k \cdot \omega_0$

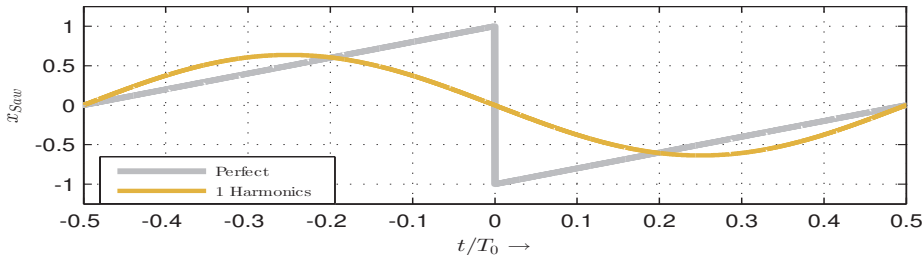
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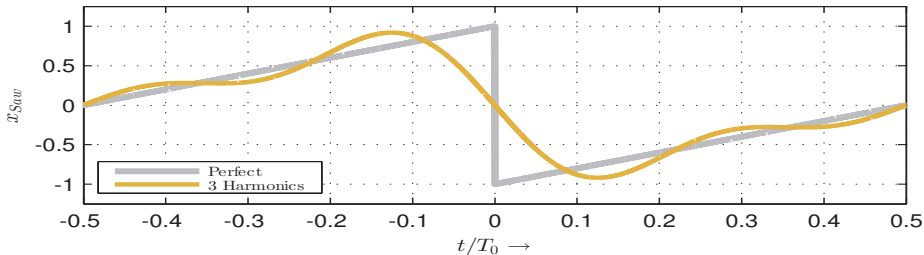
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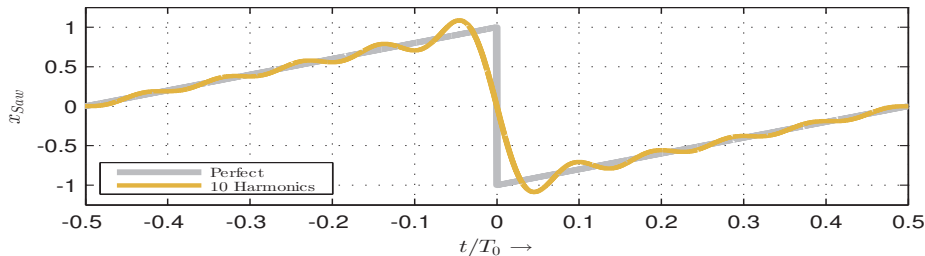
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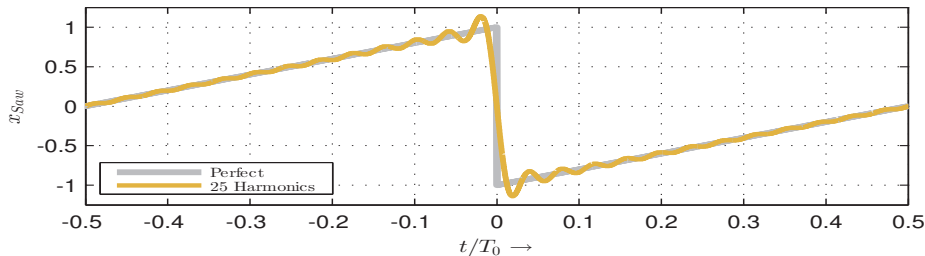
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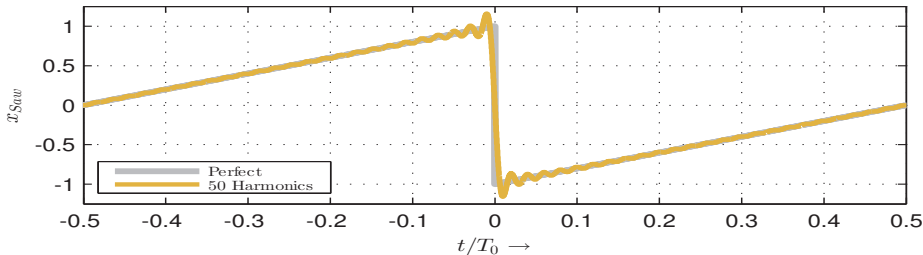
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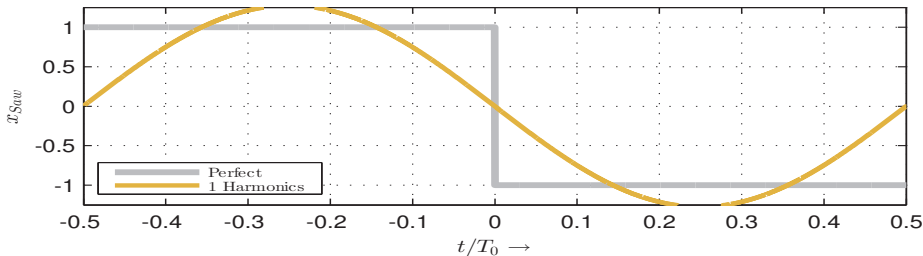
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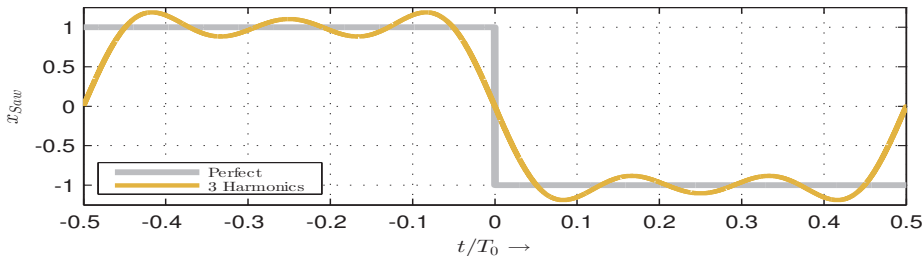
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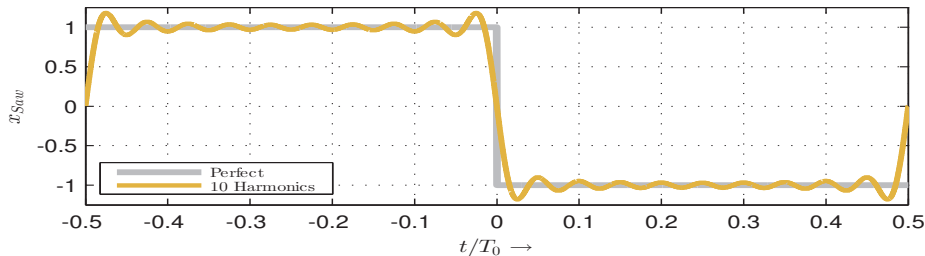
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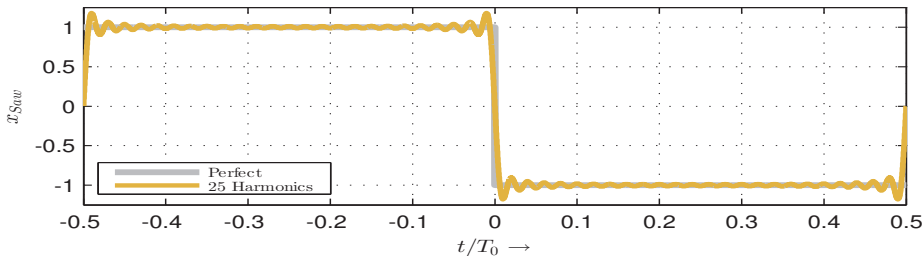
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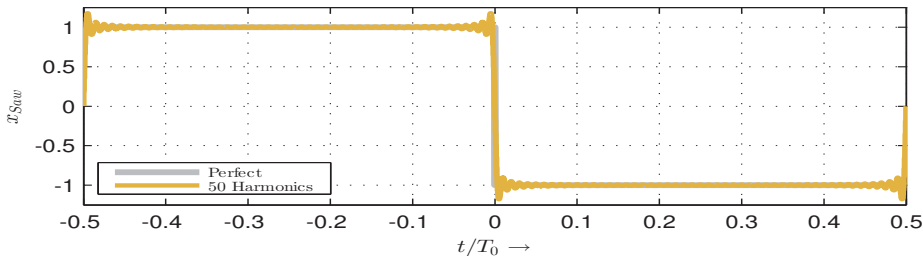
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# audio signals

## periodic signals 3/3

youtube — mechanical additive synthesis:

[http://youtu.be/8KmVDxkia\\_w](http://youtu.be/8KmVDxkia_w)

# audio signals

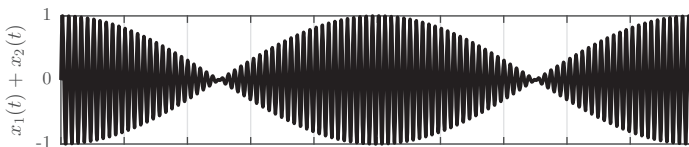
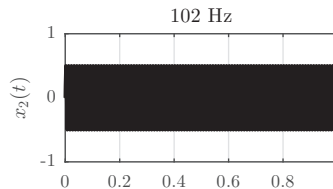
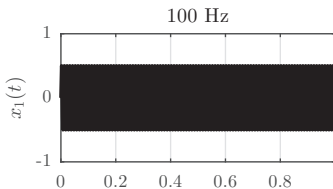
## superposition of sinusoidsals 1/2

- **partials**: a set of frequencies comprising a (pitched) sound
- **overtones**: as partials but without the fundamental frequency
- **harmonics**: integer multiples of the fundamental frequency, including the fundamental frequency

# audio signals

## superposition of sinusoidsals 2/2

$$\begin{aligned} y(t) &= \underbrace{\sin\left(2\pi\left(f + \frac{\Delta f}{2}\right)t\right)}_{\sin(2\pi f) \cos\left(2\pi t \frac{\Delta f}{2}\right) + \cos(2\pi f) \sin\left(2\pi t \frac{\Delta f}{2}\right)} + \underbrace{\sin\left(2\pi\left(f - \frac{\Delta f}{2}\right)t\right)}_{\sin(2\pi f) \cos\left(-2\pi t \frac{\Delta f}{2}\right) + \cos(2\pi f) \sin\left(-2\pi t \frac{\Delta f}{2}\right)} \\ &= 2 \sin(2\pi f) \cdot \cos\left(2\pi \frac{\Delta f}{2} t\right) \end{aligned}$$












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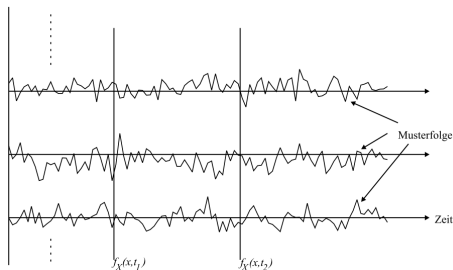
audio examples: addition of sines

500Hz	+1000	+750	+667	+625	+600	+530	+502	+501
								

# audio signals

## random process

**random process:** ensemble of random series



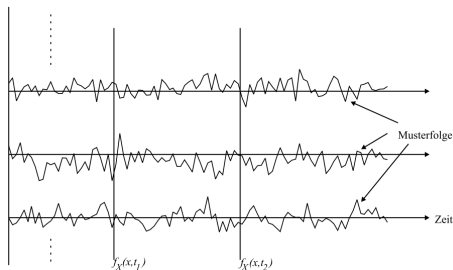
special cases:

- **stationarity:** all parameters (such as the mean) are time invariant
- **ergodicity:** process with equal time and ensemble mean (implies stationarity)

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# deterministic prototype signals

## periodic signals

- **sinusoidal**

$$x(t) = \sin(\underbrace{2\pi f t}_{\omega} + \Phi)$$

- sawtooth

$$x(t) = 2 \left( \frac{t}{T_0} - \text{floor} \left( \frac{1}{2} + \frac{t}{T_0} \right) \right)$$

- square wave

$$x(t) = \text{sign}(\sin(\omega t))$$

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# deterministic prototype signals

## non-periodic deterministic signals

- **DC**

$$x(t) = 1$$

- impulse

$$\delta(t) = \begin{cases} \infty & t = 0 \\ 0 & t \neq 0 \end{cases}$$

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- exponential

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## summary

- two basic signal classes, **deterministic** and **random**
- *deterministic* signals can be described by a function and are predictable
  - special case: periodic signals — sum of sinusoidals with freq. integer ratio
- *random signals* are not predictable
  - special case: ergodic signals can be described statistically