

**ETH** zürich



**Empa**

Materials Science and Technology

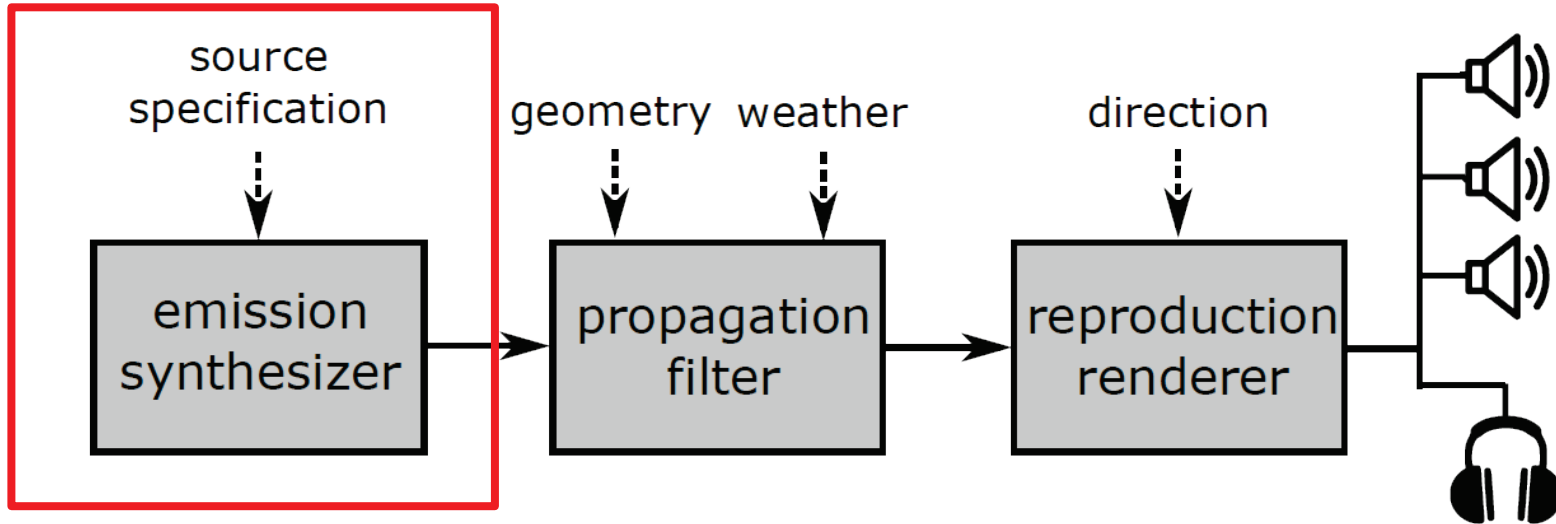
# Acoustics II

## Auralization: Sound synthesis

Reto Pieren

2024

# Flexible auralization approach

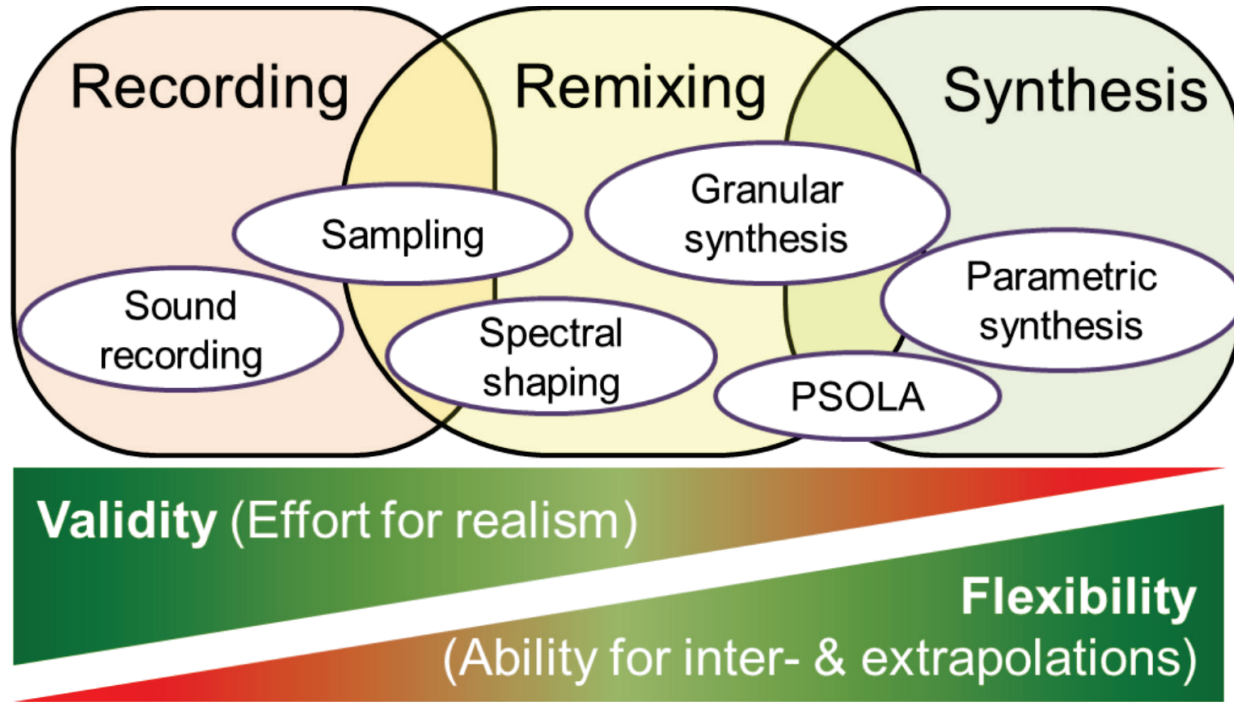


# Sound synthesis

[Bilbao, S. 2009. Numerical Sound Synthesis. Wiley.]

Smith, J.O. III 2011. Spectral Audio Signal Processing. W3K Publishing.]

# Sound signal generation: Recording vs synthesis



# Synthesis methods

## 1. Sample-based synthesis

- Granular
- PSOLA

## 2. Signal-based synthesis

- Additive
- Subtractive
- Spectral Modelling

## 3. Physics-based synthesis

# 1. Sample-based synthesis

# Granular synthesis

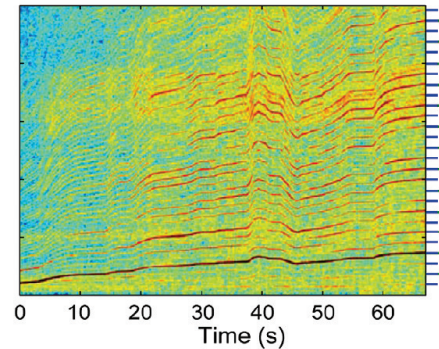
- Type of concatenative synthesis: concatenating existing audio samples in time
  1. Recorded signal segmented into short units (grains): 10 – 100 ms
  2. Enveloping amplitude of each grain
  3. Playback of overlapping, reordered, amplitude-scaled grains
- Keeps transients, spectral content and natural variations

# Pitch-Synchronous OverLap and Add (PSOLA)

- Type of concatenative synthesis: harmonic signals
- Very short segments with respect to signal period

- Applications:

- Speech
- Musical instruments
- Combustion engine of car



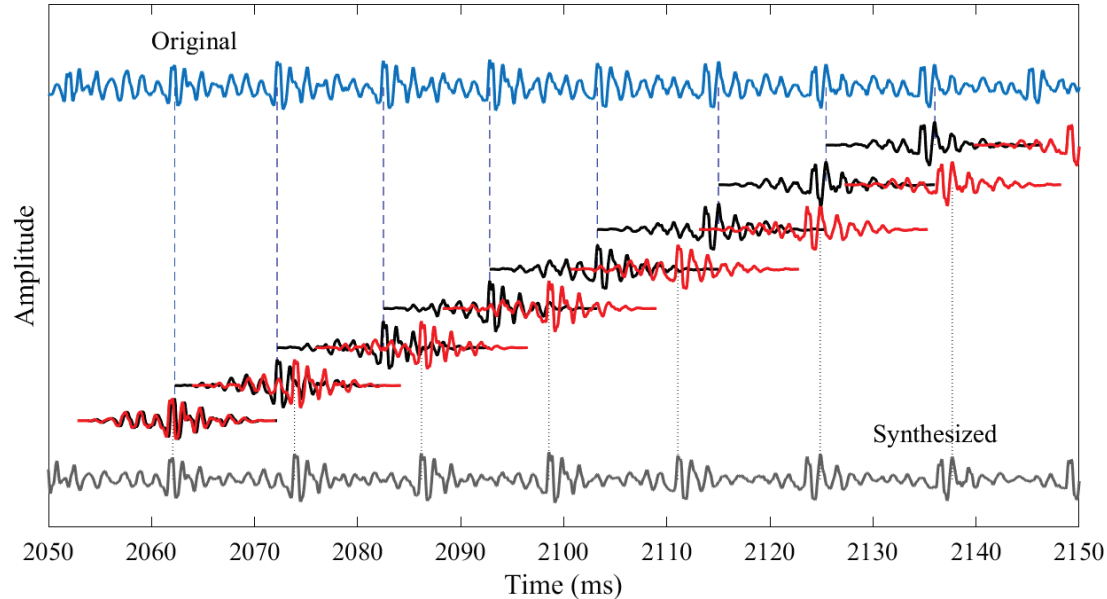
[Jagla, J. et al. 2012. Sample-based engine noise synthesis using an enhanced pitch-synchronous overlap-and-add method. Journal of the Acoustical Society of America, 132(5).]

- Keeps spectral content, natural variation  
→ allows for pitch modification



# Pitch-Synchronous OverLap and Add (PSOLA)

- Processing: Pitch estimation, segmentation, weighting, adding



[<https://wiki.aalto.fi/display/ITSP/Introduction+to+Speech+Processing>]

# 2. Signal-based synthesis

# Signal-based synthesis

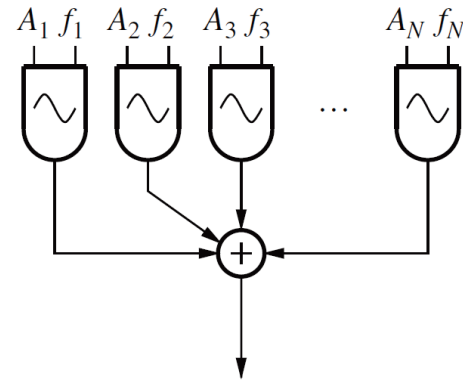
- Parametric synthesis
- Creating audio signal from scratch
- Full control
- Full flexibility
- Not necessarily related to physical sound generation mechanisms

# Additive synthesis

# Additive synthesis

- Inspired by Fourier series («Fourier synthesis»)
- Sinusoidal model: Sum of sinusoids (stationary case):

$$x(t) = \sum_{i=1}^N A_i \sin(2\pi f_i t + \theta_i)$$



# Additive synthesis: Variations in time

- Instantaneous (time-dependent) frequency of signal  $\sin(\varphi(t))$  with oscillation phase  $\varphi$ :

$$f(t) \triangleq \frac{1}{2\pi} \frac{d\varphi}{dt}$$

- Instantaneous phase (= oscillation phase):

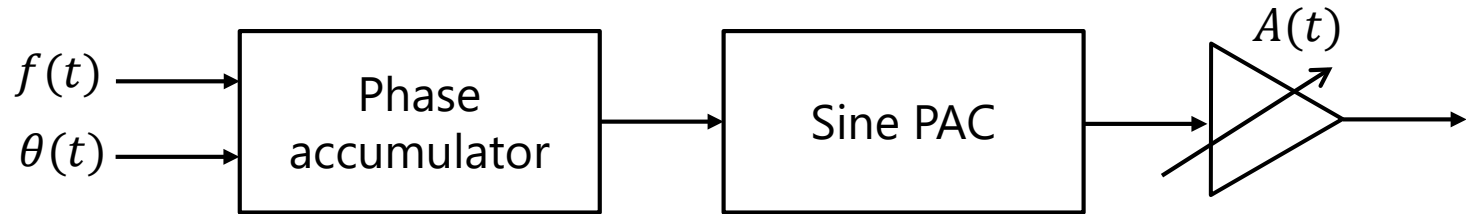
$$\varphi_i(f_i, t) = 2\pi \int_{-\infty}^t f_i(\tau) d\tau = \varphi_{i,0} + 2\pi \int_0^t f_i(\tau) d\tau$$

- Time-varying amplitude, frequency and phase:

$$x(t) = \sum_{i=1}^N A_i(t) \sin(\varphi_i(f_i, t) + \theta_i(t))$$

# Additive synthesis: Digital realization by Numerically Controlled Oscillator (NCO)

- 2 stages: Phase accumulator and Phase-to-Amplitude Converter (PAC)

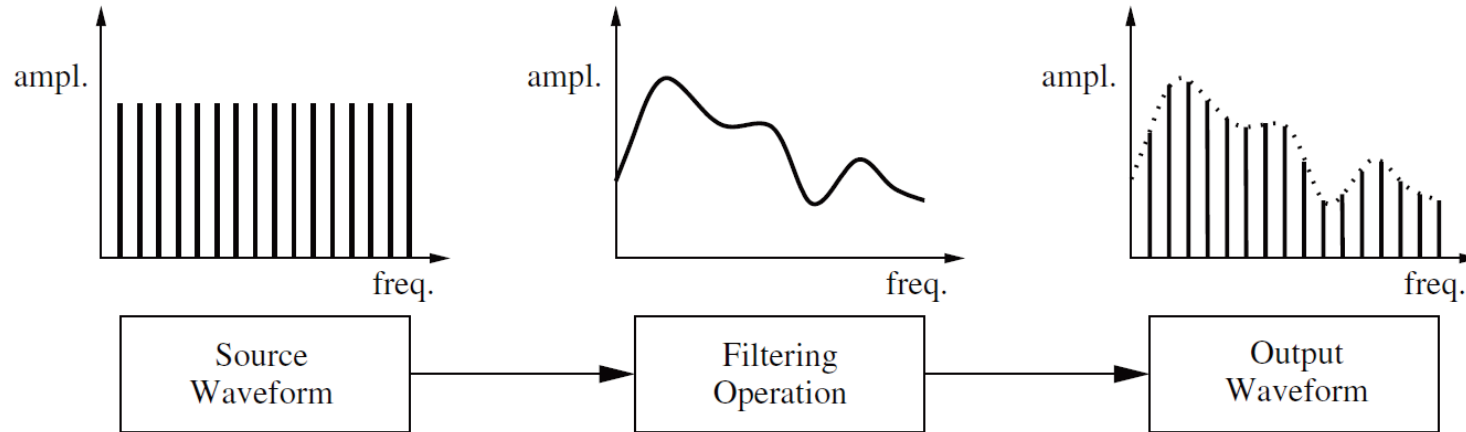


- Advantages
  - Flexible and robust
  - Direct and linear control of frequency, phase and amplitude
- For real-time processing:
  - Lookup table with interpolation for sine function (wavetable)
  - Polynomial approximation for sine function

# Subtractive synthesis

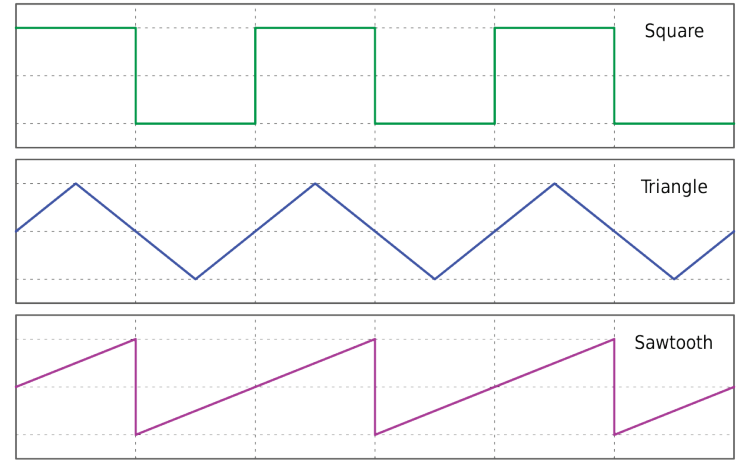


# Subtractive synthesis



# Subtractive synthesis

- Broadband basic waveform + filter
- For musical applications typically:
  - Non-sinusoidal periodic waveforms
  - Fundamental + many harmonics
  - Square, triangle, sawtooth wave
- For environmental noise applications typically:
  - Noise or noise-like signals



# Noise signals

- Noise = random signal
  - Creation by random process
  - Random phase relations within signal
- DC-free: average amplitude = 0
  
- White noise:
  - constant Power Spectral Density (PSD) → analogy to white light
  - equal intensity at *all* frequencies
  - *all* frequencies equally frequent

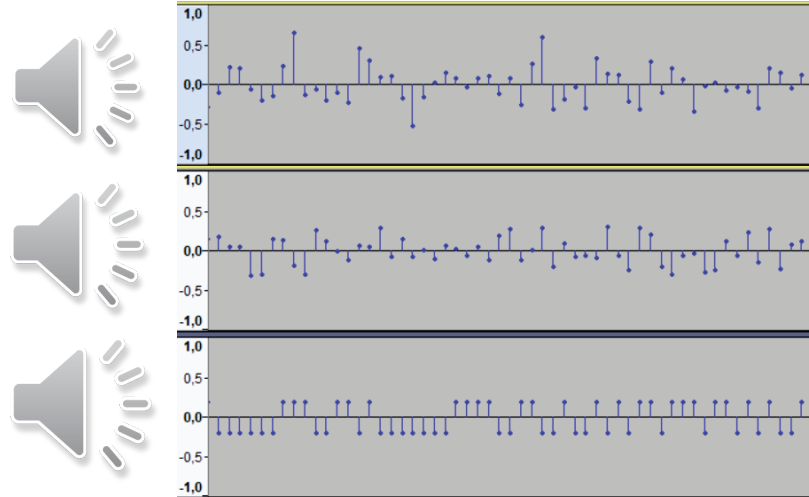
# White noise generation: Discrete-time

- Realization: Vector of random numbers with zero mean and finite variance  $\sigma^2$
- Statistically independent samples  $\rightarrow$  Power spectrum independent of frequency
  - Because: autocorrelation  $R_{ww} = \sigma^2 \delta(t)$

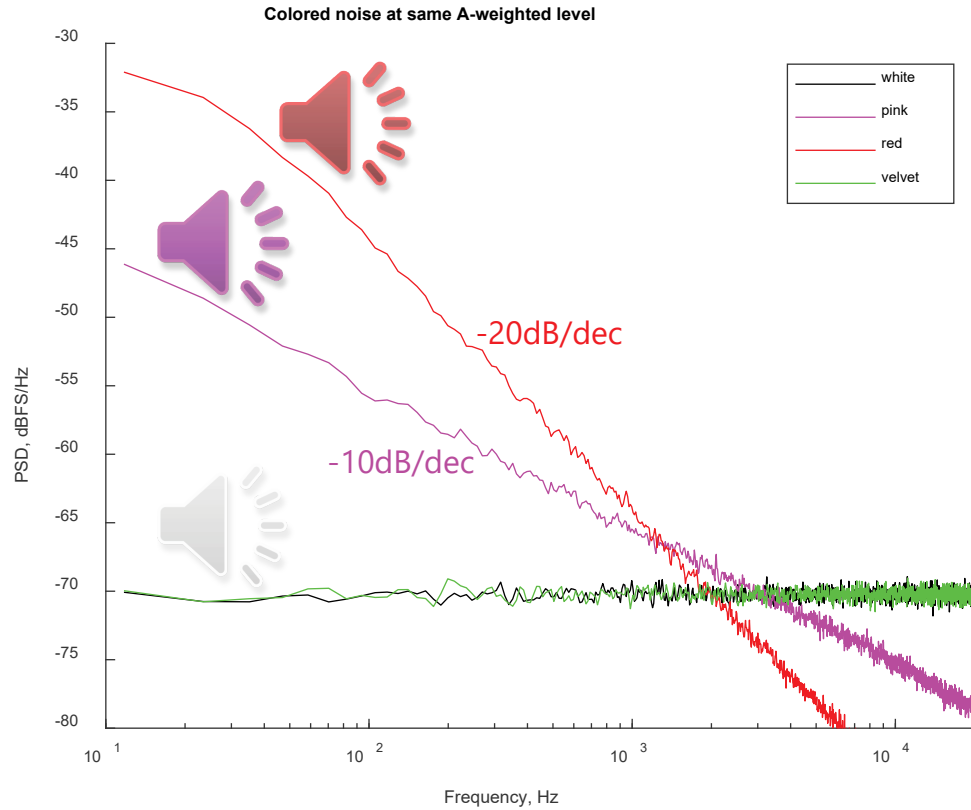
$$S_{ww}(f) = \mathcal{F}(R_{ww}) = \sigma^2$$

# White noise generation: Discrete-time

- Different amplitude distributions
  - Gaussian (White Gaussian Noise)
  - Uniform
  - Binary



# Colored noise

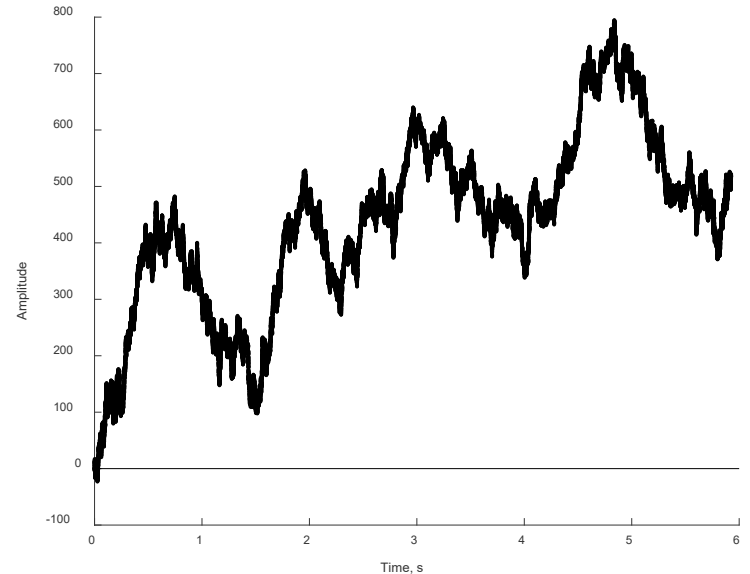


# Red noise

- Brownian/red noise:
  - Analogy to red light
  - Created by Brownian motion process (random walk)
  - Power spectral density:  $S(f) \sim \frac{1}{f^2}$
  - Power drops -6dB/oct
- Infinite power at 0 Hz → in practice saturation at low frequencies

# Red noise generation: Discrete-time

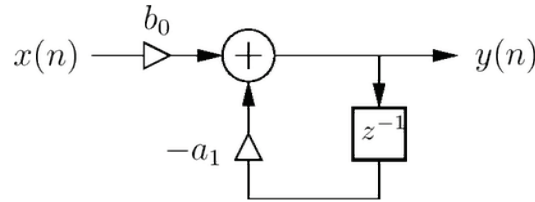
- How to generate red noise?
- Idea 1: Random walk: Statistically independent amplitude *increments* between samples
- Realization:
  - new sample = previous sample + random offset
  - = cumulative integration of white noise
  - Problem: signal «wandering off»  
Solution: *leaky* integrator





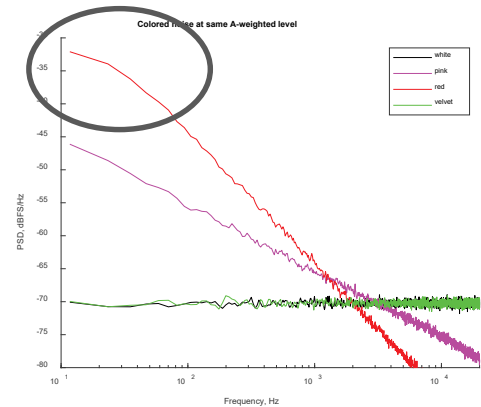
# Red noise generation: Discrete-time

- Idea 2: Filtering of white noise
  - -6dB/oct  $\rightarrow$  stopband of 1st order lowpass filter
  - Choose corner frequency well below relevant frequency range



$$b_0 = \frac{1}{1 + \frac{f_s}{2\pi f_c}} \quad a_1 = b_0 - 1$$

- Sampling rate 48kHz, corner frequency 20 Hz  $\rightarrow -a_1 = 0.9974$   
 $\rightarrow$  slightly dampened feedback  $\rightarrow$  = leaking of integrator

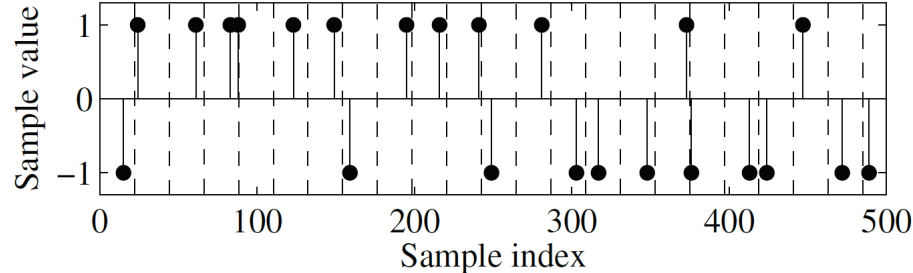


# Pink noise generation

- Pink noise
  - Occurs often in nature → good starting point
  - Same power in frequency bands of constant relative bandwidth
  - Power spectral density:  $S(f) \sim \frac{1}{f}$
  - Power drops -3dB/oct
- No exact solution, no simple elementary filter with -3dB/oct
- Different algorithms available

# Velvet noise generation

- Sparse pseudo-random noise with white-like spectrum
- Applications in artificial reverberation (and more?)
- Discrete signal values:  $-1, 0, 1$
- Only few non-zero amplitudes



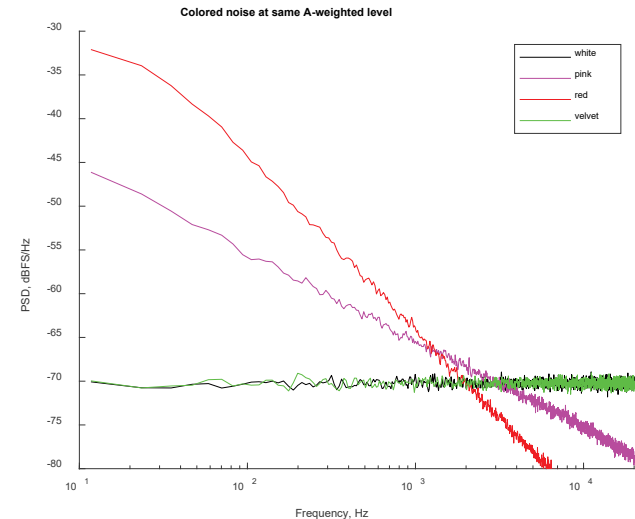
[Välimäki, V. et al 2013. A Perceptual Study on Velvet Noise and its Variants at different Pulse Densities. IEEE Transactions on Audio Speech and Language Processing, 2013]

# Velvet noise generation

- Parameter: spike density
- Velvet noise (4000 spikes/s) vs. white noise



- Sounds smoother than white noise...



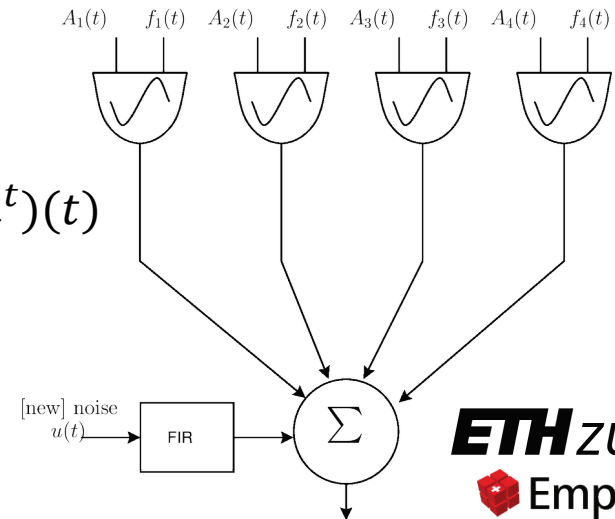
# Spectral modeling synthesis

# Spectral modeling synthesis (SMS)

- Combination of additive and subtractive synthesis
- Modelling time-varying spectra as combination of deterministic and stochastic component
- Sum of sinusoids plus colored noise

$$x(t) = \sum_{i=1}^N A_i(t) \sin[\varphi_i(f_i, t) + \theta_i(t)] + (u * h^t)(t)$$

[Serra, X. & Smith III, J. 1990. Spectral Modeling Synthesis: A Sound Analysis/Synthesis System Based on a Deterministic plus Stochastic Decomposition. Computer Music Journal, 14(4).]



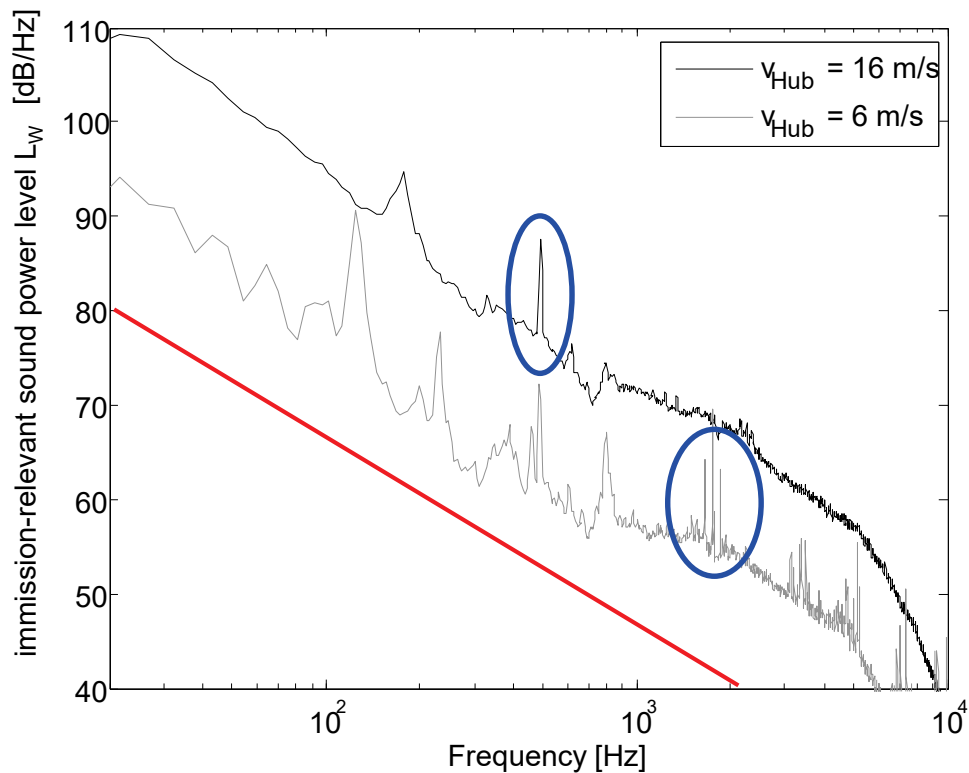
# Example: Wind turbine noise

[Pieren, R., Heutschi, K. et al. 2014. Auralization of Wind Turbine Noise: Emission Synthesis, Acta Acustica united with Acustica, 100]

# Wind turbine source sound characteristics

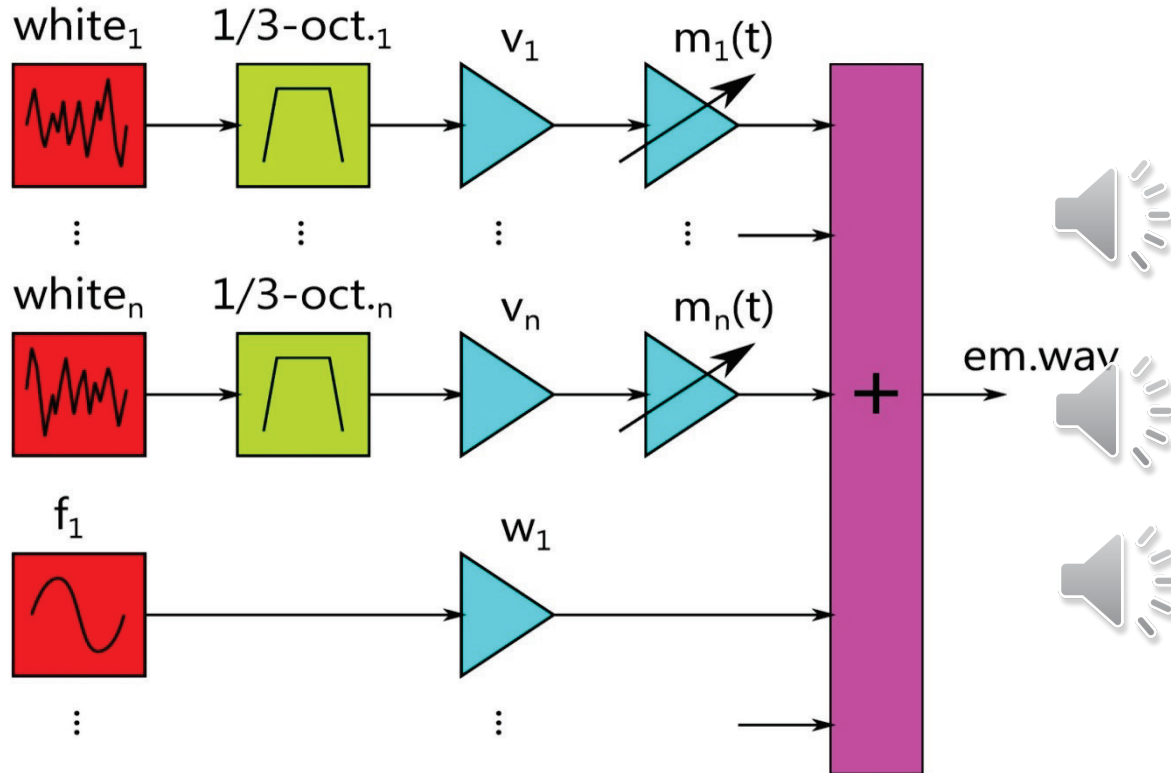


- Sound signal characteristics
  - Red-like spectrum
  - Discrete tones
  - Amplitude modulations





# Wind turbine sound synthesis using SMS



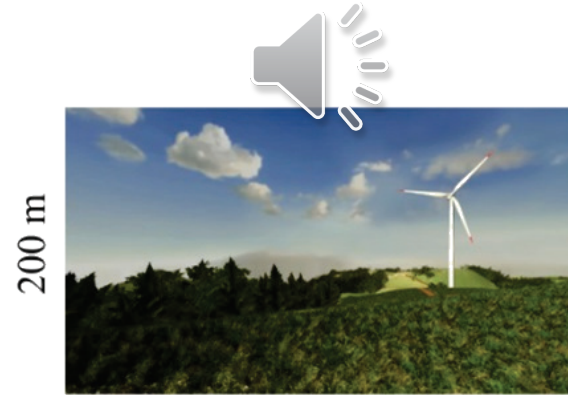
Recording

(Vestas V90-2MW  
Strong wind, 150 m distance)

Synthesis

Synthesis  
(increased AM)

# Application: Auralization of virtual wind farms







# Example: Passenger car noise

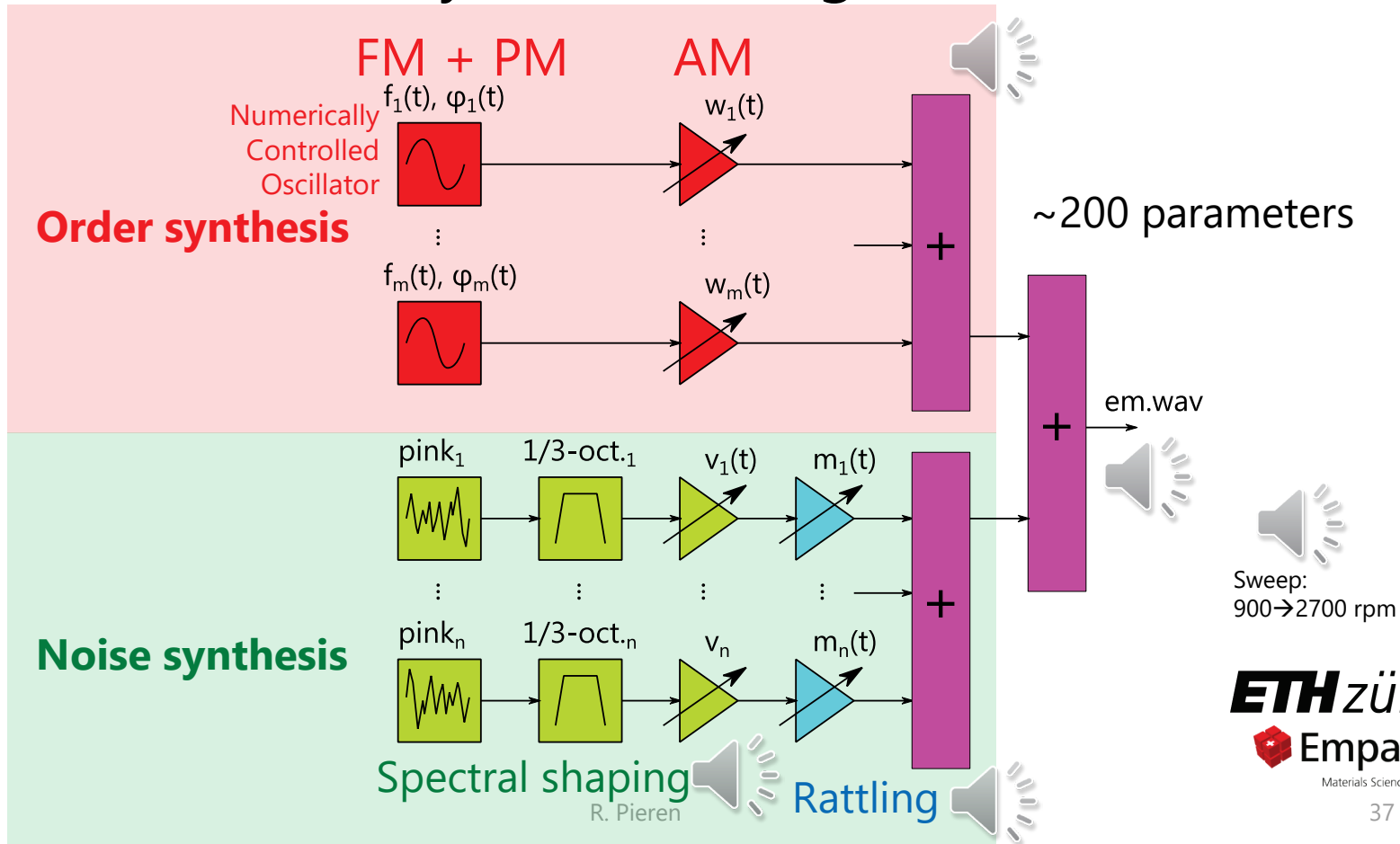
[Pieren, R., Bütler, T. & Heutschi, K. 2016. Auralization of accelerating passenger cars using spectral modeling synthesis. Applied Sciences, 6(1).]

# Passenger car sound synthesis

- Separate synthesis of
  - Tyre/road interaction sound and
  - Propulsion sound:

Examples	Recording	Synthesis
Petrol-engined car full load at 2000 rpm back mic		
Diesel-engined car idling at 1500 rpm front mic		

# Propulsion sound synthesis using SMS

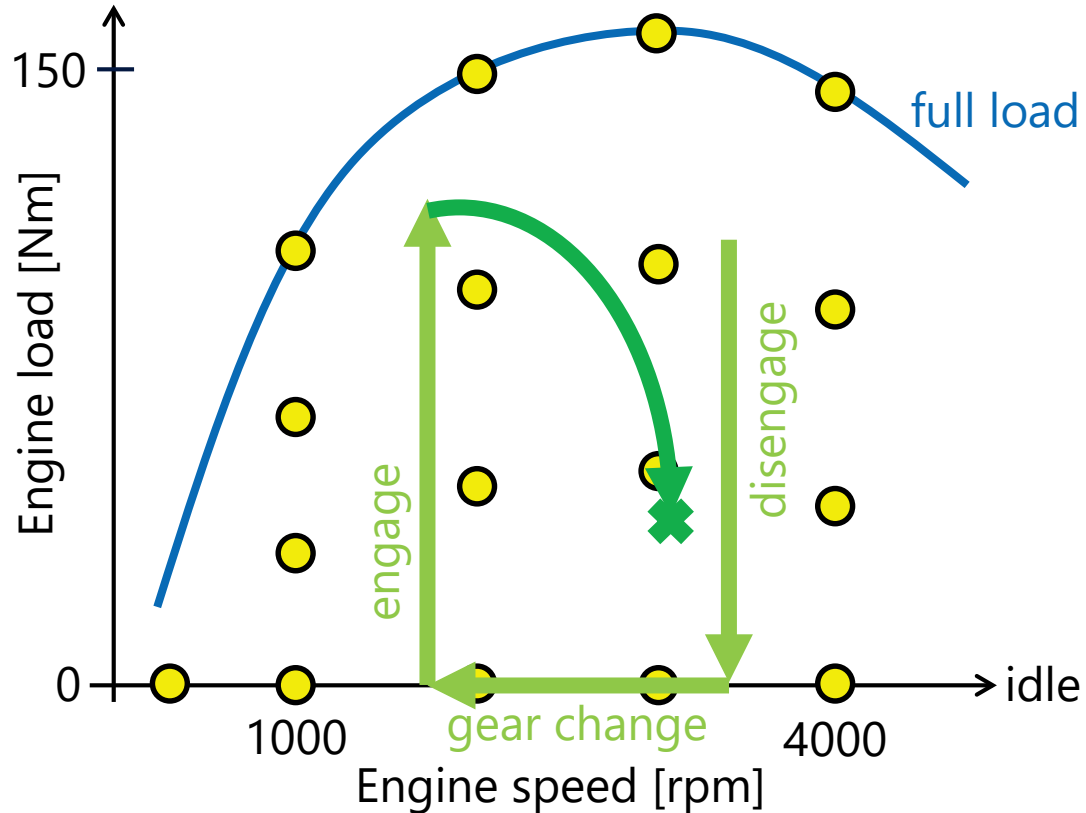


Sweep:  
900→2700 rpm



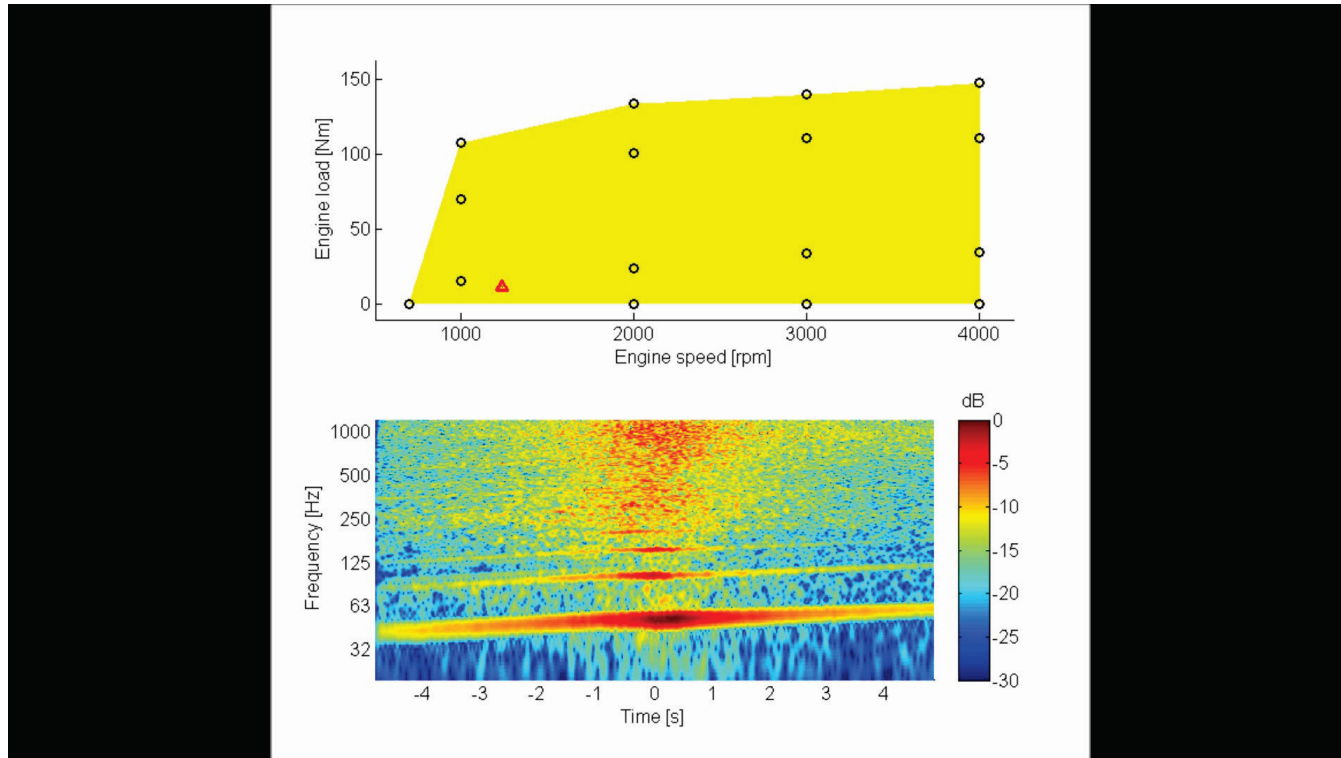
ZH-459093

# Chassis dynamometer measuring points



# Auralization of accelerating passenger car

0.5 m/s<sup>2</sup>, eco driving style

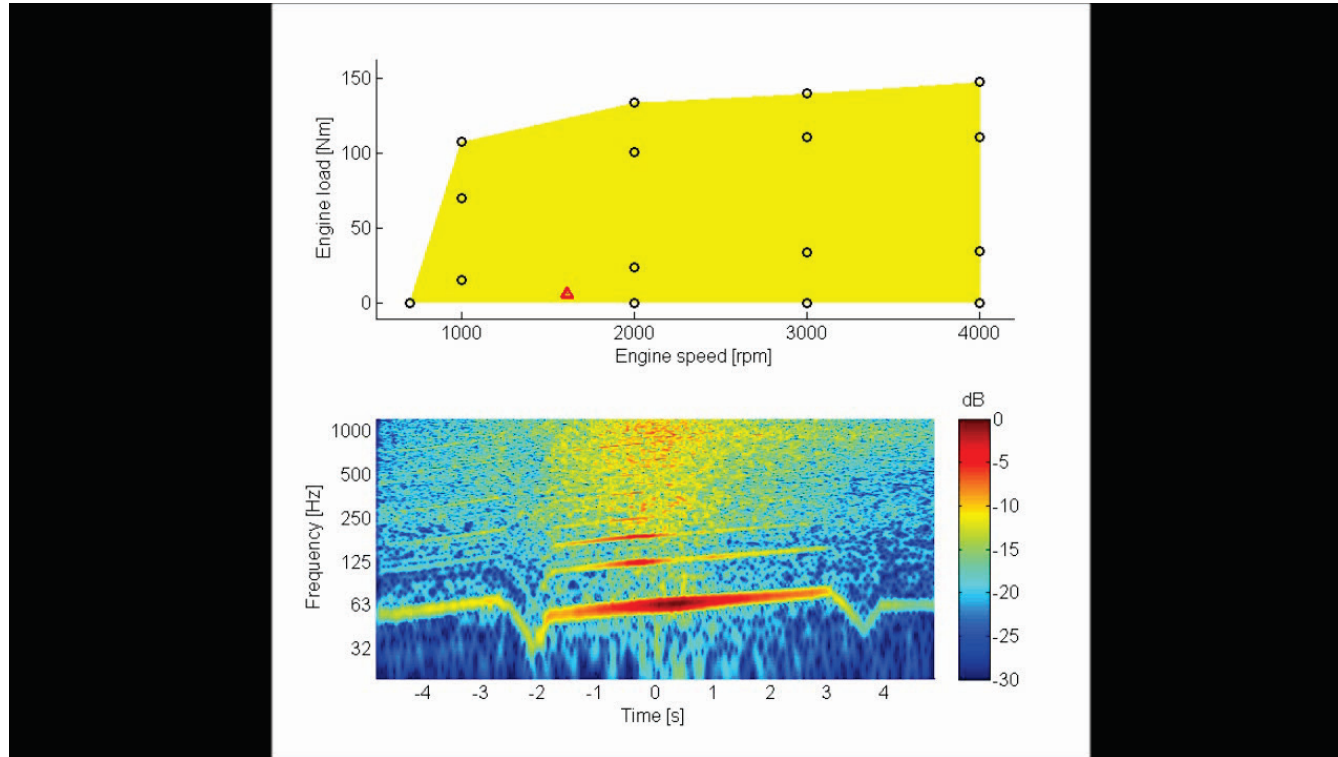


Ford Focus 1.8i,  
Michelin Alpin A4,  
7→50 km/h



# Auralization of accelerating passenger car

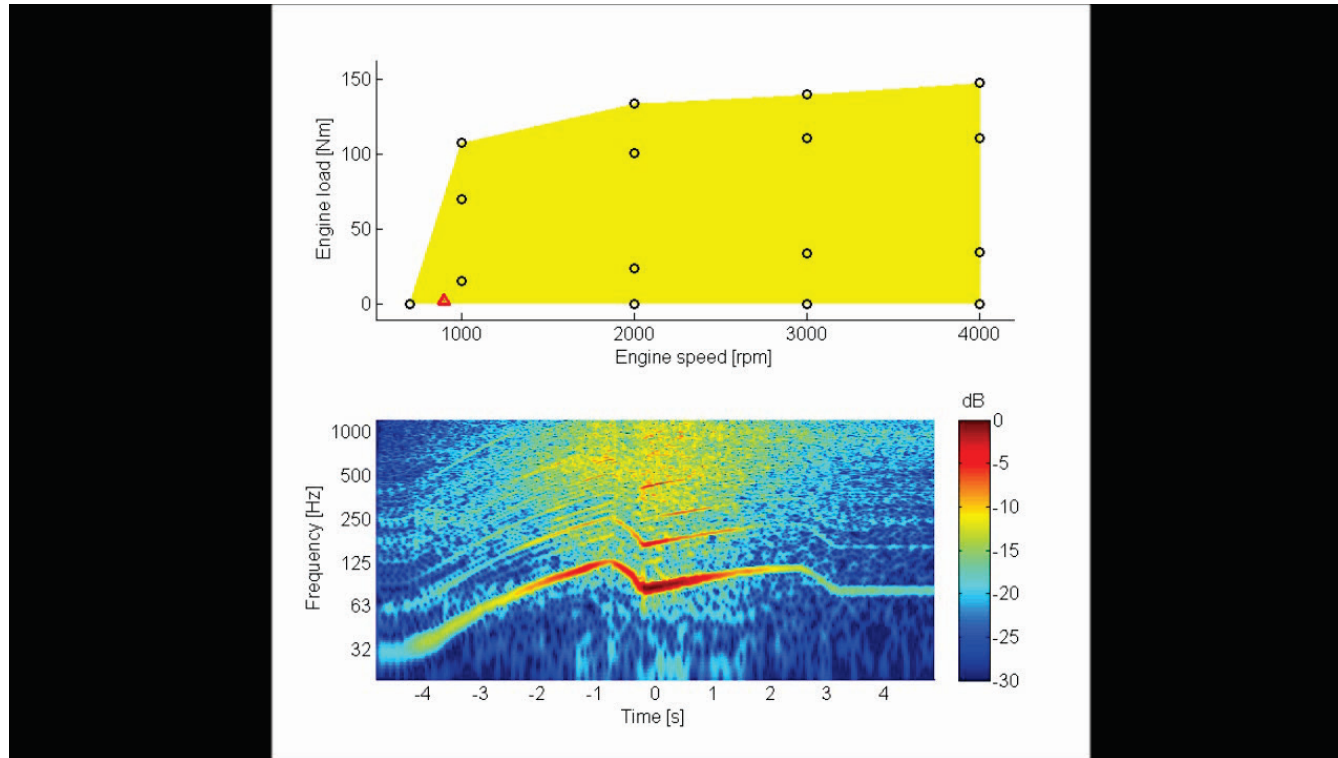
1.0 m/s<sup>2</sup>, medium driving style



Ford Focus 1.8i,  
Michelin Alpin A4,  
7→50 km/h

# Auralization of accelerating passenger car

2.0 m/s<sup>2</sup>, sportive driving style



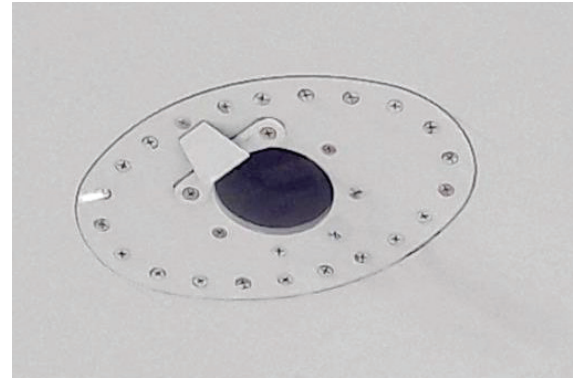
Ford Focus 1.8i,  
Michelin Alpin A4,  
7→50 km/h

# Example: Aircraft noise

[Pieren, R., et al. 2019. Improving future low-noise aircraft technologies using experimental perception-based evaluation of synthetic flyovers. Science of the Total Environment, 692.]

# Aircraft noise: Cavity tones

- Parasitic, narrow-band aeroacoustic airframe noise source
- Airflow-excited Helmholtz resonators
- Best documented case:
  - Wing cavity tones in A320 family
  - 4 openings in lower wing surface (FOPP)



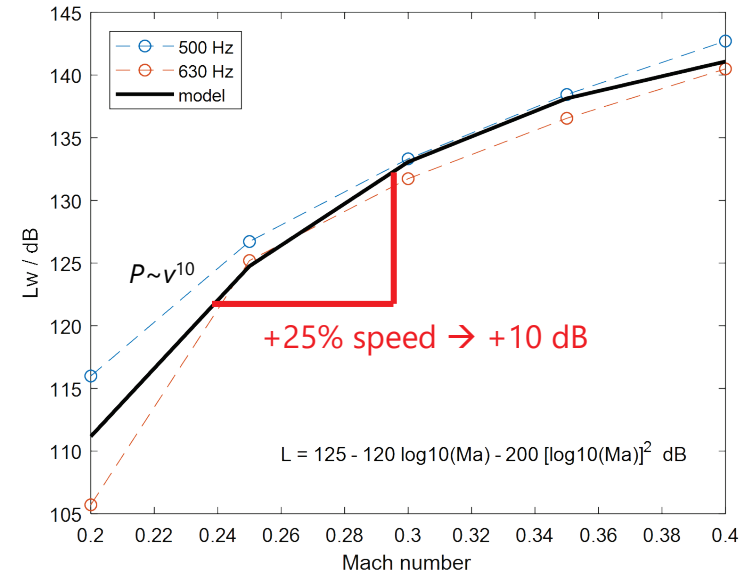
Fuel tank Over Pressure equalization Port (FOPP)  
of A320 with installed vortex generator

Recording of approaching aircraft:



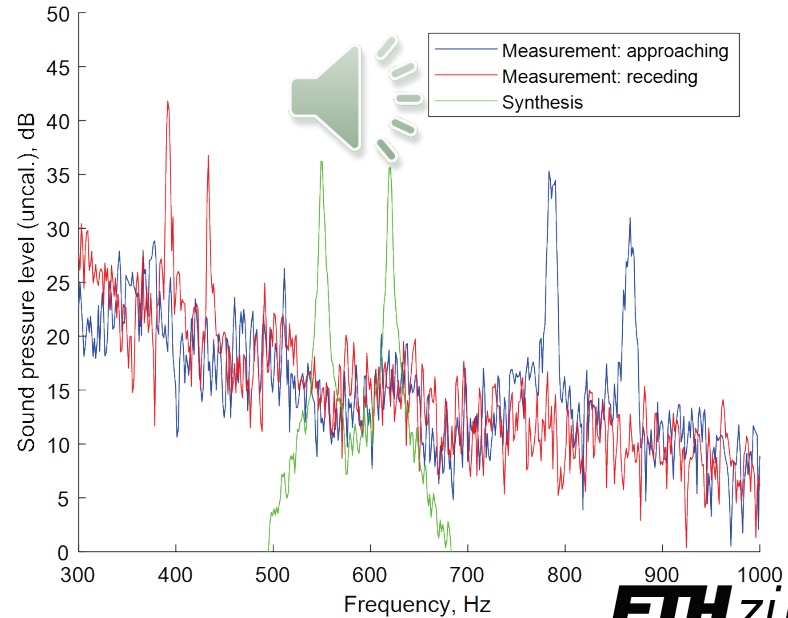
# Aircraft noise: Cavity tones

- Measurement data on A320 family:
  - Two frequency components around 600 Hz
  - Bandwidth 1–3 Hz
  - Sound power: strong airspeed dependence



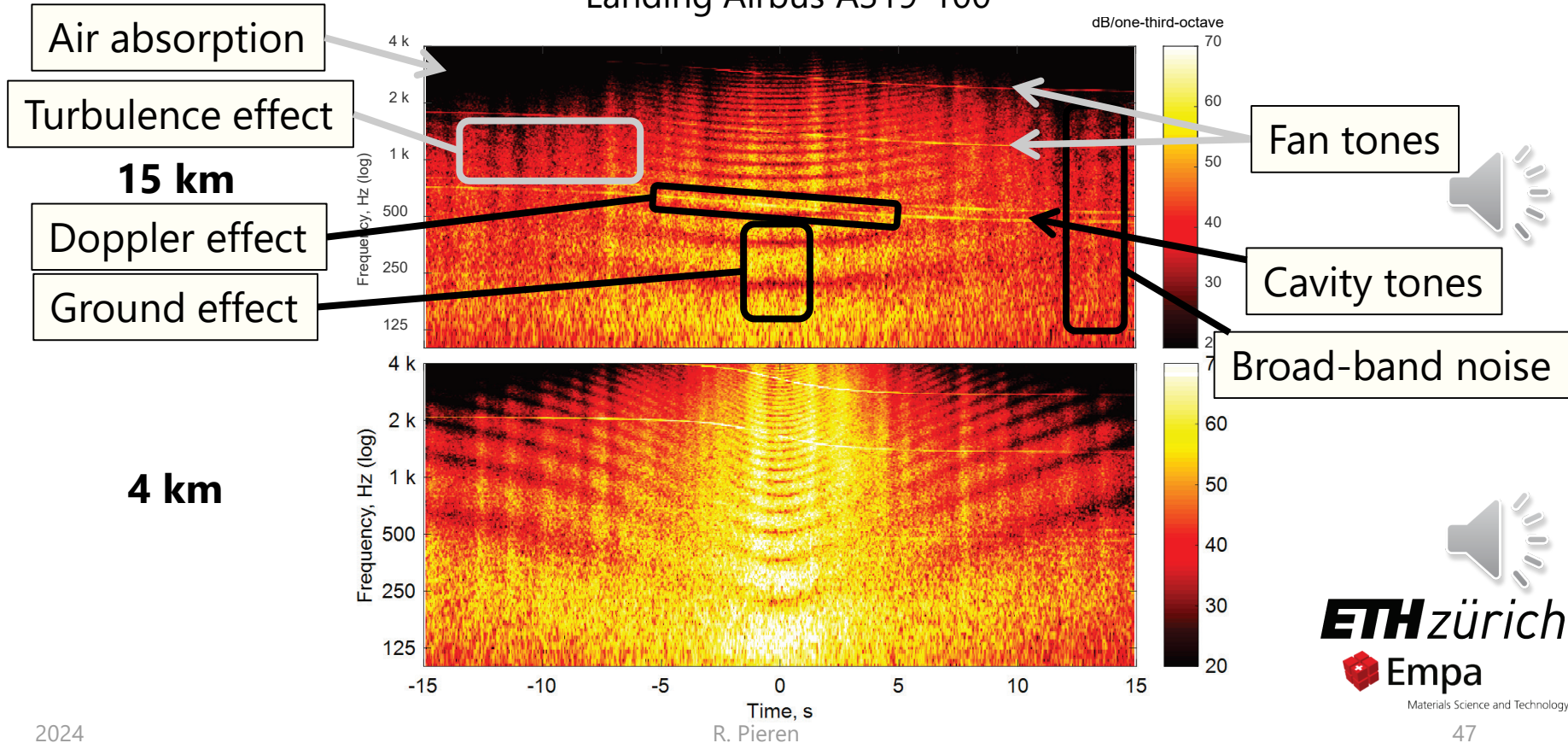
# Aircraft noise: Cavity tone synthesis

- Subtractive synthesis using resonance filters
  - Controlled peak frequencies, bandwidths and powers
  - Stochastic phase relations



# Sounds of virtual aircraft flyovers

Landing Airbus A319-100



# 3. Physics-based synthesis



# Physics-based synthesis

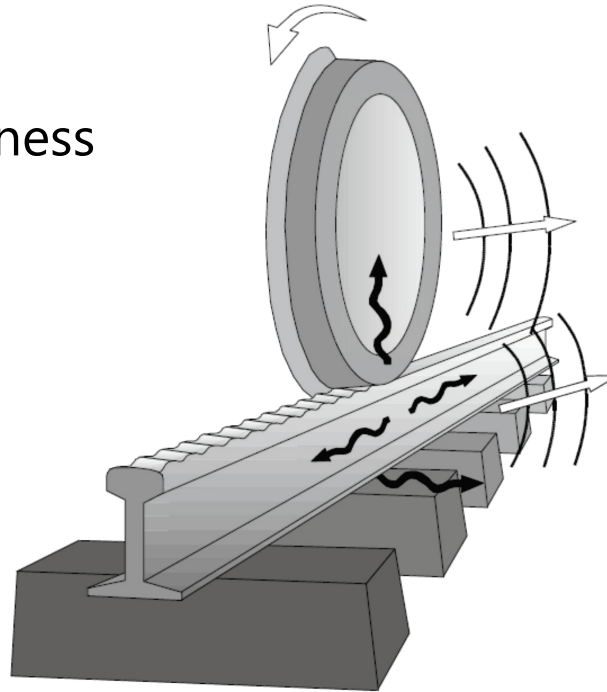
- Simulation of physical sound generation processes
- Mainly used for musical instruments
  - Stringed instruments using delay lines or FDTD
  - Percussion
  - Voice, but still with limited quality

# Example: Railway noise synthesis

[Pieren, R., Heutschi, K., et al. 2017. Auralization of railway noise: Emission synthesis of rolling and impact noise. Applied Acoustics, 127.]

# Railway noise synthesis: Rolling noise

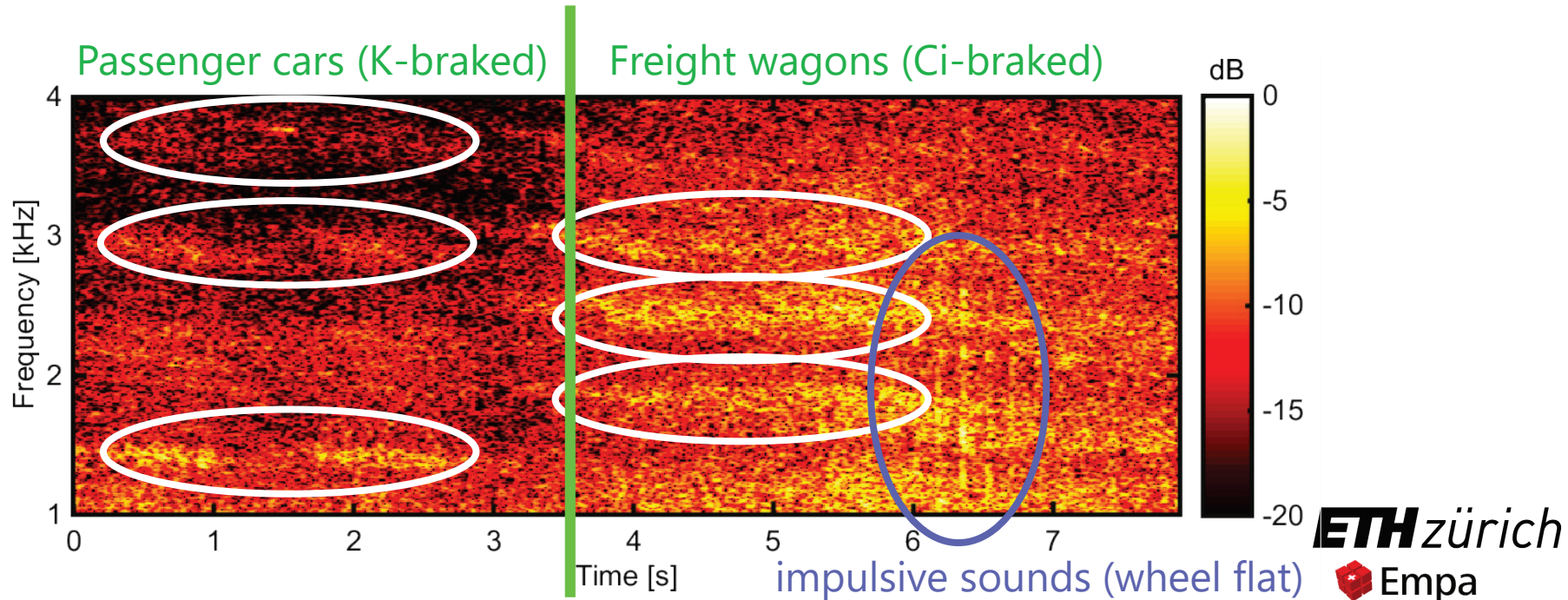
- Most relevant source
- Wheel and rail unevenness leading to vibrations



[Thompson, D. 2008. Railway Noise and Vibration. Elsevier Science.]

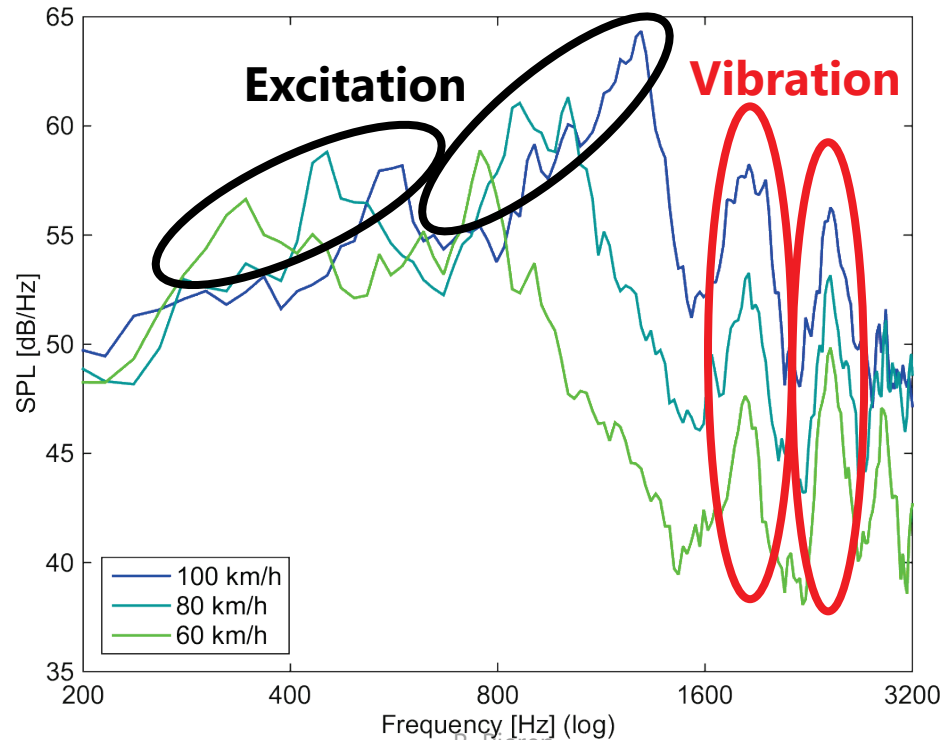
# Railway noise synthesis: Spectro-temporal patterns

Train passby: Excerpt of sound pressure recorded at 7.5 m



# Railway noise synthesis: Spectro-temporal patterns

SPL spectra of flat freight wagons at different travelling speeds



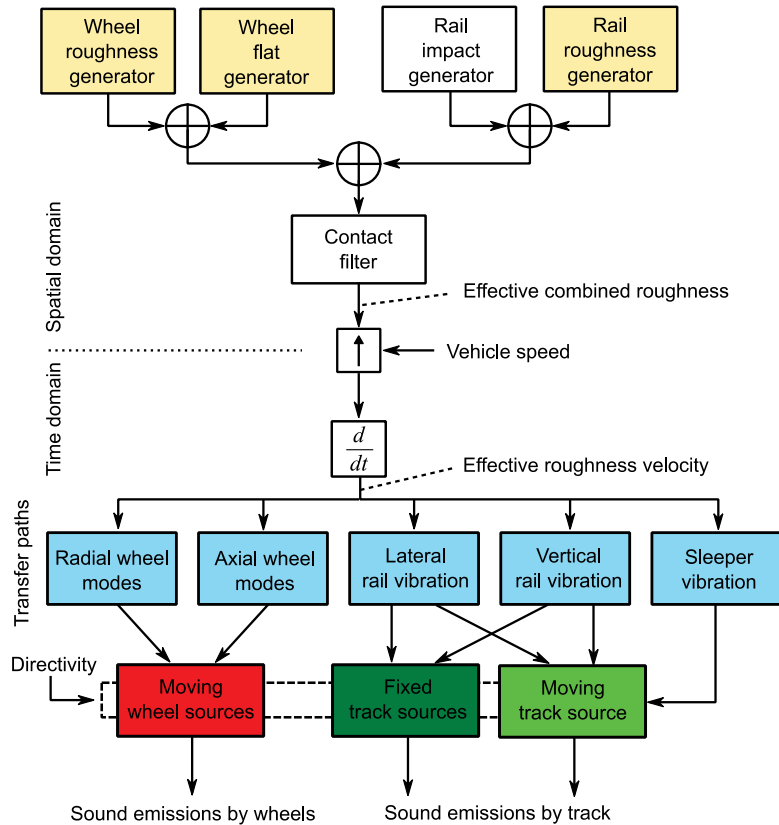
# Railway rolling noise synthesis: Approach

- Excitation and vibration related effects → Motivation for a physics-based approach

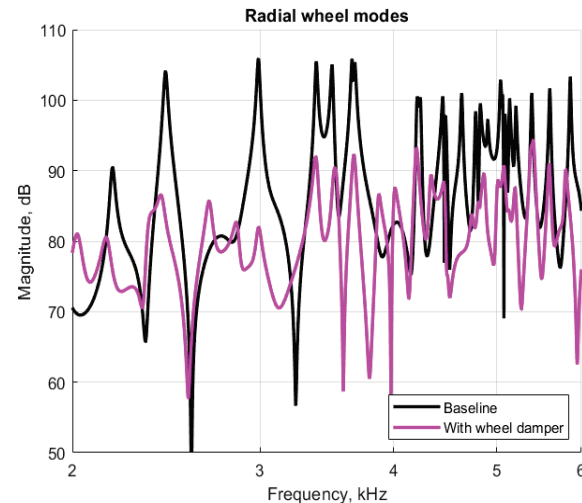
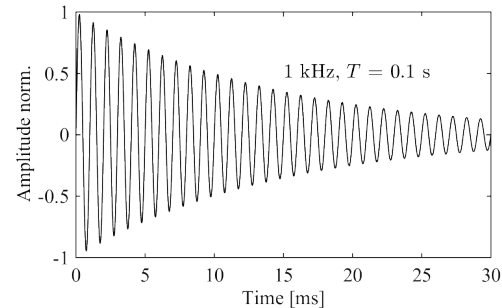
## Physical approach

1. Generation of surface microstructure of rail and wheels
2. Determination of mechanical excitation of track-wheel structure
3. Transformation from spatial into time domain
4. Modal behaviour of the structure
5. Radiation

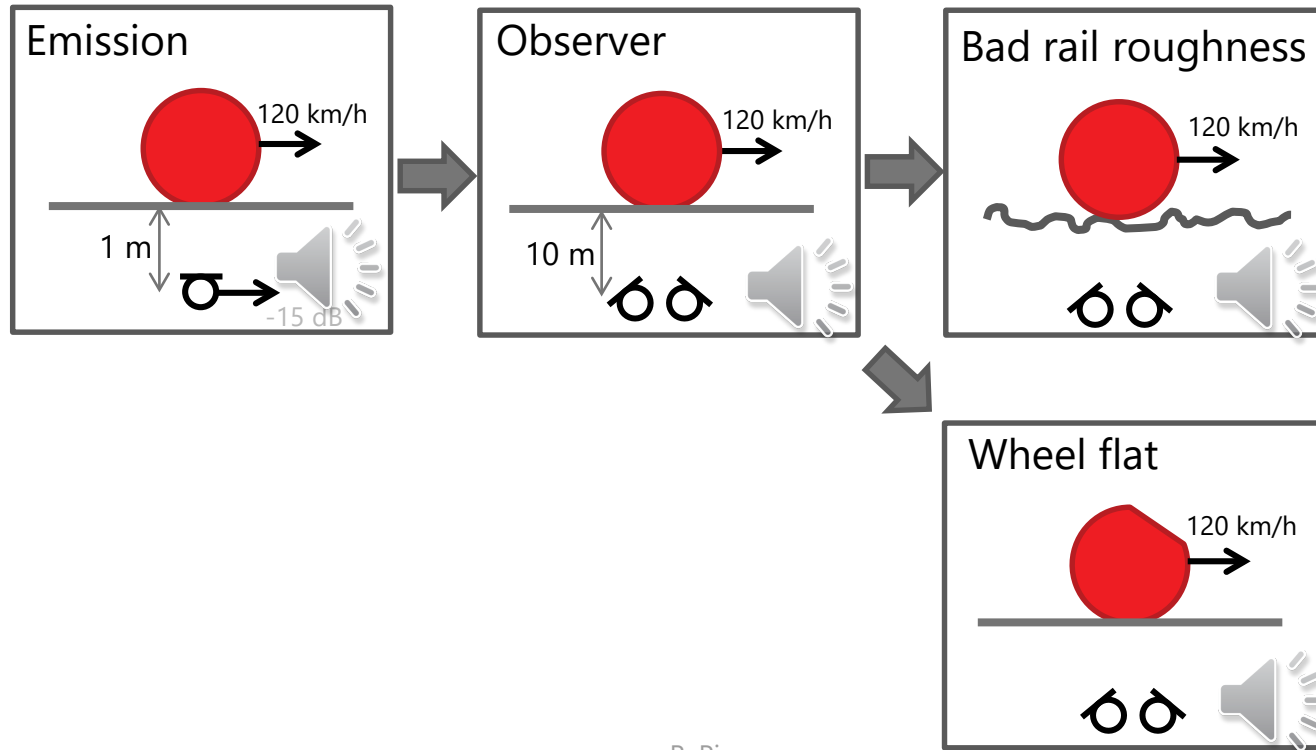
# Railway rolling noise synthesis



## Modal resonator



# Railway rolling noise synthesis: Examples





# Train pass-by noise synthesis example

