

## L1

Applications of audio ML:

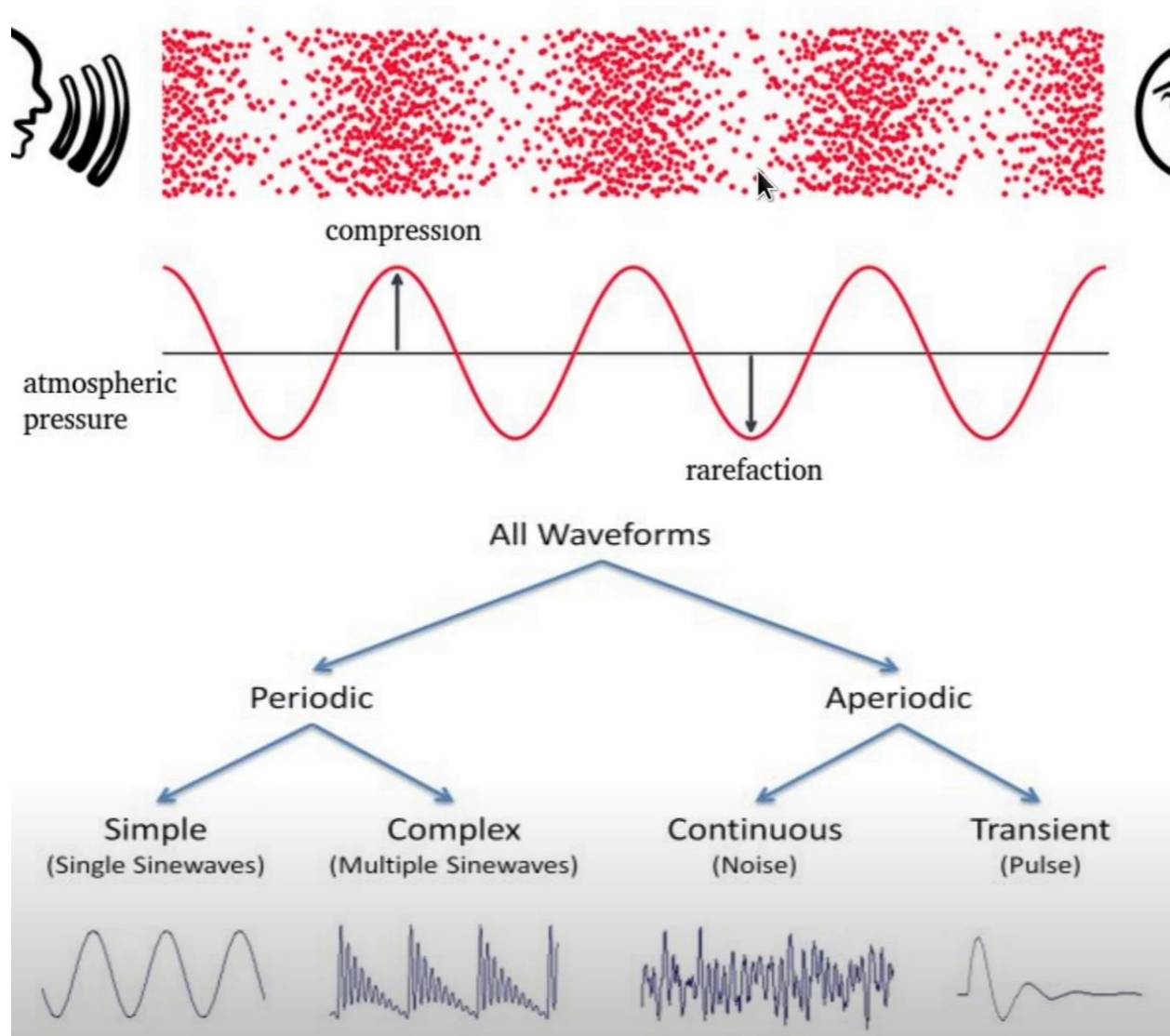
- Classification, speech recognition, denoising/upsampling, music information retrieval
  - o Music has sub applications: instrument recognition, etc.

Topics:

- Sound waves, DAC/ADC, time-frequency domain audio features
- Audio transformations
  - o Fourier/STFT, Constant-Q, Mel Spectrograms, Chromograms

## L2

Sound is produced by vibrations, causing air molecules to oscillate. Changes in air pressure create a mechanical wave.



Equation for a simple sine wave

$$y(t) = \text{Amplitude} * \sin(2\pi * \text{frequency} * \text{time} + \phi \text{ (phase)})$$

The **period** is between each peak or dips. **Frequency** is the inversion of the period, number of cycles per second. **Amplitude** is the vertical distance between 0 and the peak or dip of the current point. **Phase** tells us the position of the waveform at time 0, and we are able to shift the waveform.

Perceptually, **larger amplitudes** will have **larger sounds**. This makes sense, because amplitude measure change in air pressure, which in perception results in higher noise.

**Pitch** is the perception of frequency. It's logarithmic and is perceived similar if differ by a power of 2. Beginning concept of octave. Each increase in octave, the same note will have double the frequency in Hz.

Pitch to Frequency Equation:  $F(p) = 2^{\frac{p-69}{12}} * 440$

Ratio between two subsequent semitones:  $\frac{F(p+1)}{F(p)} = 2^{1/12} = 1.059$

**Cents** are a subdivision of semitones. There are 1200 cents in Octaves, and 100 cents in semitone.

### L3

Intensity, loudness, and timbre

**Sound power** is the rate at which energy is transferred. Energy per unit of time emitted by a sound source in all directions. Measured in watts (W).

**Sound intensity** is sound power per unit area. Measured in watts/meters squared (W/m<sup>2</sup>)

Questions: How much power is there in thunder, concerts? Answer: Only 1 Watt.

Humans can perceive sounds with very small intensities.

- Threshold of hearing (TOH):  $10^{-12}$  W/m<sup>2</sup>
- Threshold of pain (TOP): 10 W/m<sup>2</sup>
- Humans can perceive an incredible amount of intensity range before reaching TOP.

**Intensity level** is measured in decibels (dB) and is logarithmic in scale.

**Decibel** is a ratio between two intensity values.

**Intensity of Reference** (TOH) is used as a baseline to create a decibel measurement.

Equation for intensity level:  $dB(I_{TOH}) = 10 \log_{10} \frac{I}{I_{TOH}}$

At 0 decibel, the threshold of hearing is reflected. Every 3 decibel, intensity doubles.

Source	Intensity	Intensity level	× TOH
Threshold of hearing (TOH)	$10^{-12}$	0 dB	1
Whisper	$10^{-10}$	20 dB	$10^2$
Pianissimo	$10^{-8}$	40 dB	$10^4$
Normal conversation	$10^{-6}$	60 dB	$10^6$
Fortissimo	$10^{-2}$	100 dB	$10^{10}$
Threshold of pain	10	130 dB	$10^{13}$
Jet take-off	$10^2$	140 dB	$10^{14}$
Instant perforation of eardrum	$10^4$	160 dB	$10^{16}$

From: Fundamentals of Music Processing Fuller

**Loudness** is a subject measure of intensity. It is the perception of a sound's intensity. Depends on duration/frequency of a sound and age. It is measured in phons.

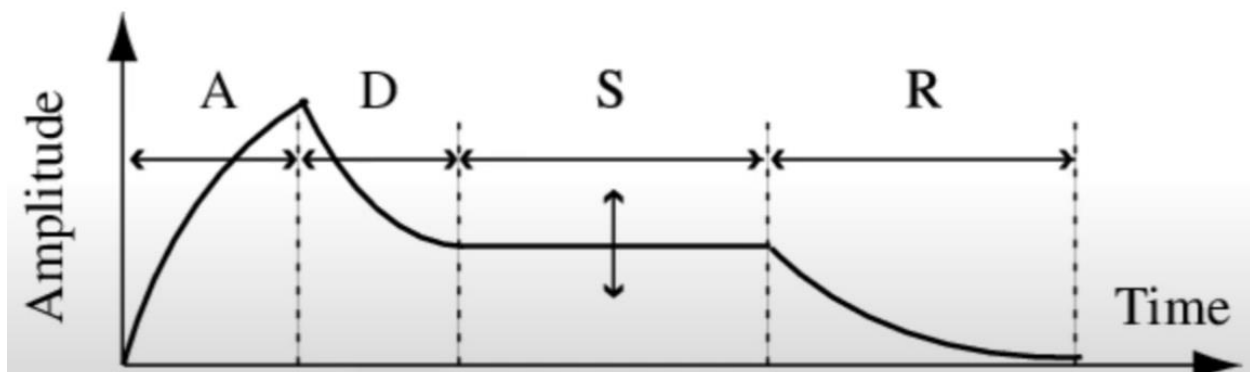
**Phons** are a measure of perceived loudness, even at different intensity levels. At lower frequencies, sounds are perceived less loud even at the same intensity.

**Timbre** is the 'color' of sound. The remaining difference between two sounds with the same intensity, frequency and duration. Words such as 'bright, dark, dull, harsh, etc.' describe timbre. Multi-dimensional measure of sound.

- Sound envelope
- Harmonic content
- Amplitude/frequency modulation

### Sound Envelope

Attack-Decay-Sustain-Release Model



## Harmonic Content

**Complex Sound** is a superposition of sinusoids. A **partial** is a sinusoid used to describe a sound.

**Fundamental frequency** is the lowest partial.

**Harmonic partial** is a frequency that is a multiple of the fundamental frequency.

- i.e.  $f_1 = 440 \text{ Hz}$ ,  $f_2 = 2 * 440 = 880$ ,  $f_3 = 3 * 440 = 1320$ , ...
- Inharmonicity indicates a deviation from a harmonic partial.

**Spectrograms** show the intensity of a frequency at a specific time in the duration of an audio sample.

- One reason why two sounds may be different, despite having the same intensity, frequency and duration, is the distribution of harmonic partials. This can be shown with a spectrogram.

**Frequency Modulation** is periodic variation in frequency, aka vibrato. Apply a messenger signal with frequency modulation on a carrier signal to achieve effect.

**Amplitude Modulation** is a periodic variation in amplitude, aka tremolo. Apply a messenger signal with amplitude modulation on a carrier signal to achieve effect.