

REMOTE ACOUSTIC URBAN SENSING - 04/03/17

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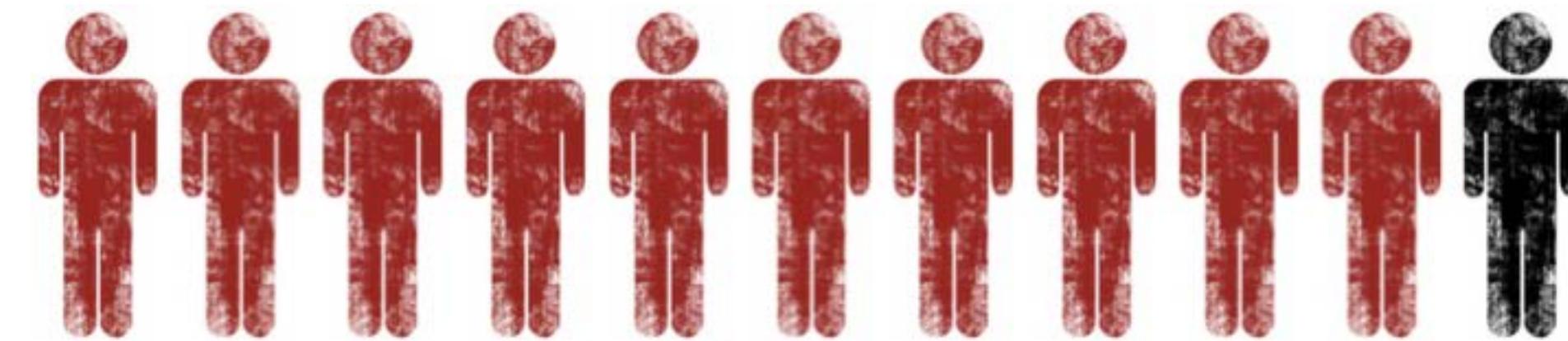
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ACOUSTIC REMOTE URBAN SENSING

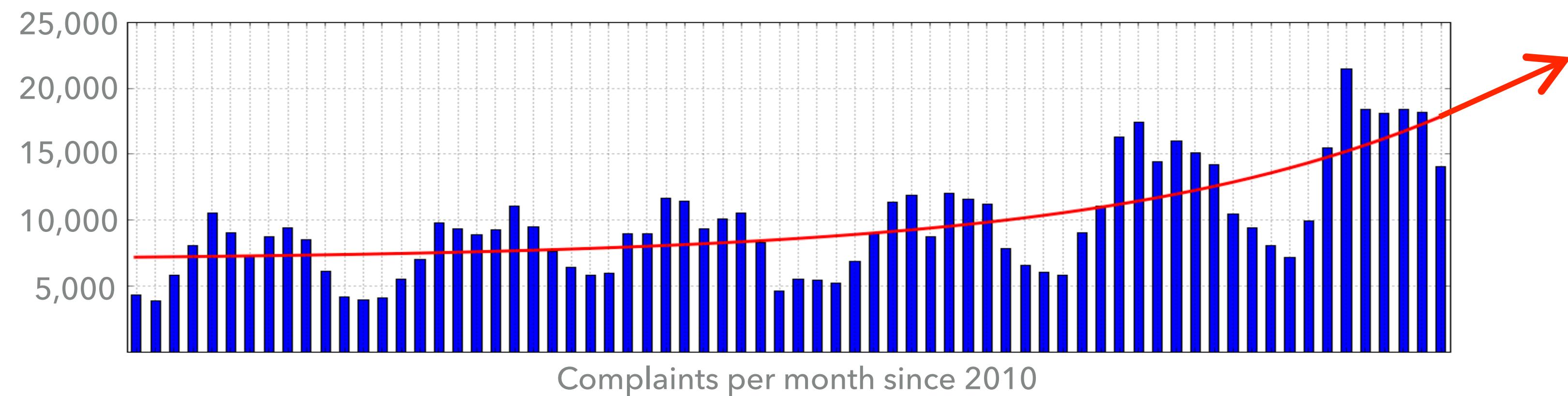
- ▶ **Noise monitoring** - why noise? sounds of new york city
- ▶ **Sensing sound** - what can we use? what are we sensing? what are the metrics?
- ▶ **Calibration** - how do we collect accurate data? what happens over time?
- ▶ **Sampling** - how do we digitize sound data?
- ▶ **Frequency** - what frequencies matter? how do we hear?
- ▶ **Analysis** - how do we handle sound data?

WHY NOISE?

Estimated **9 of 10** adults in **NYC** exposed to **HARMFUL** levels of **NOISE**



Over **3.4 MILLION** complaints since 2003 [based on 311 data]



SLEEP LOSS

HEARING LOSS

PRODUCTIVITY

LEARNING IMPAIRMENT

STRESS



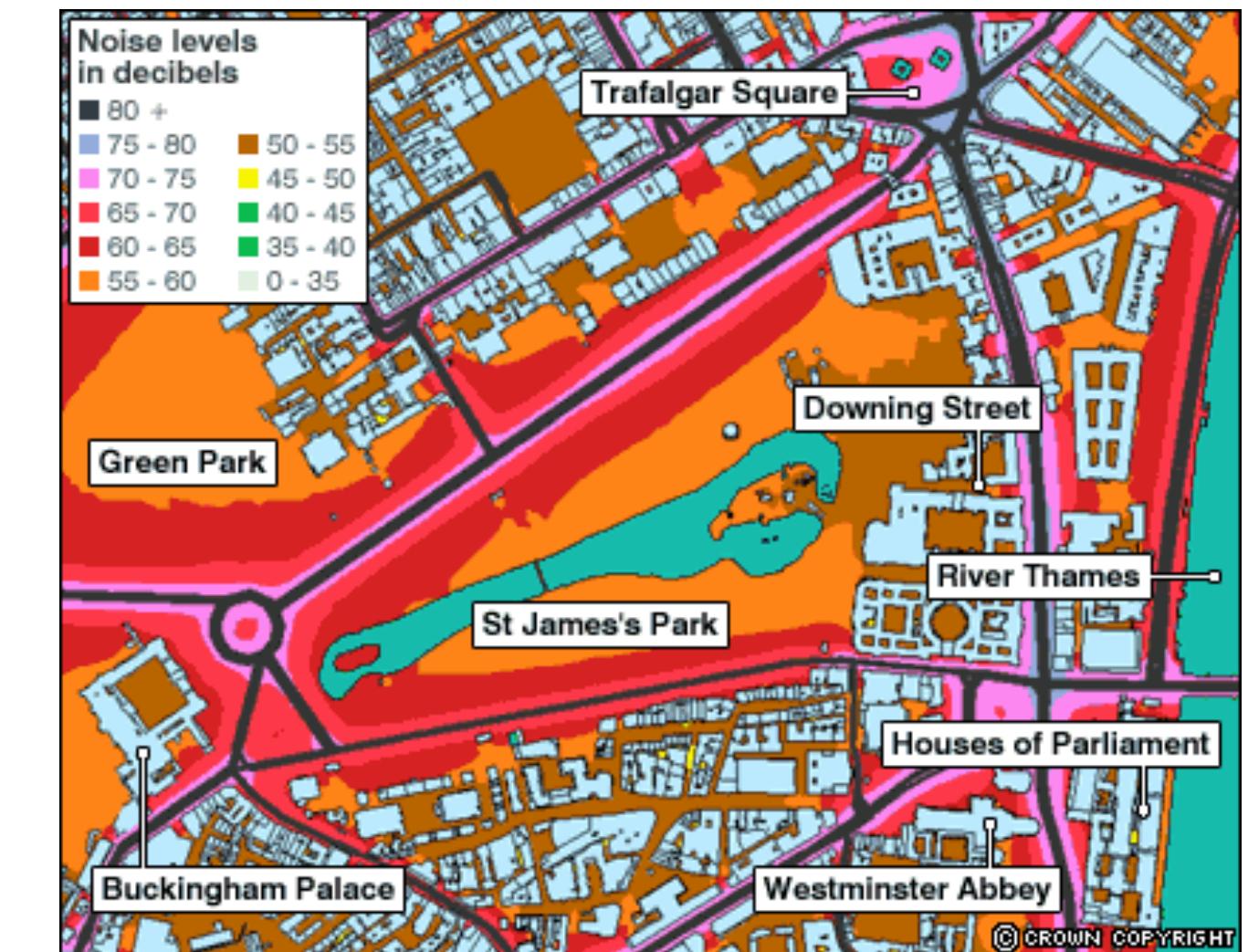
NOISE SURVEYING



NOISE SURVEYING



Expensive equipment

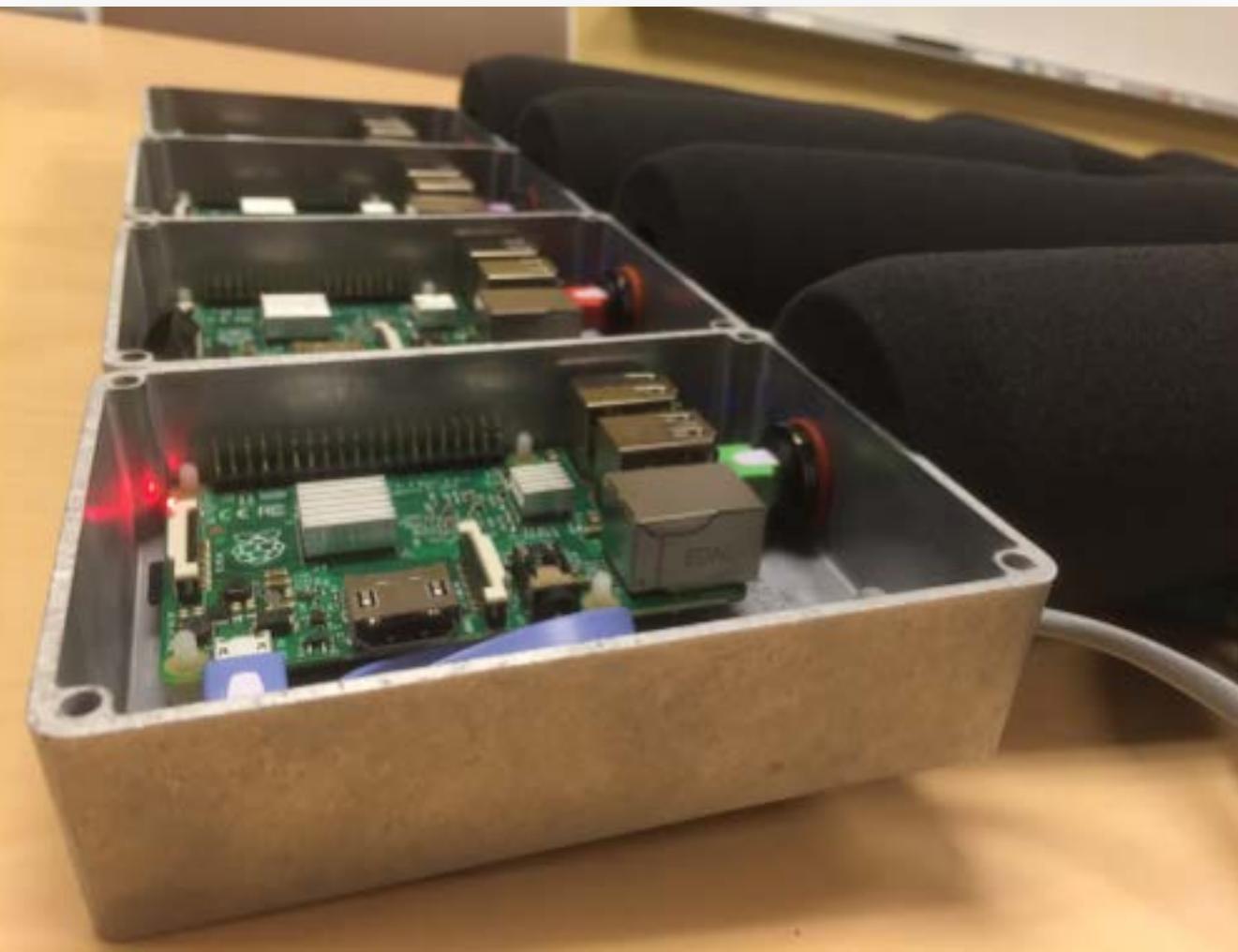


Expensive people

Inadequate data

SONYC — ACOUSTIC SENSING DEVICES

- ▶ Design focussed on:
 - ▶ Accuracy
 - ▶ Low cost
 - ▶ Resilience
 - ▶ Scalability

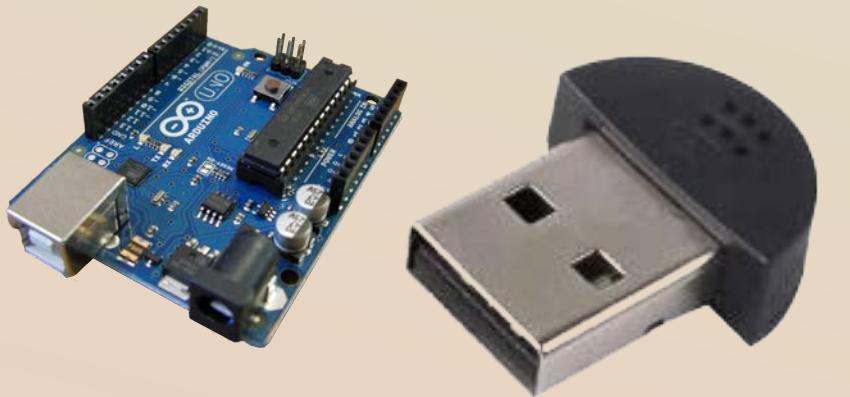


SONYC — ACOUSTIC SENSING DEVICES

Affordability



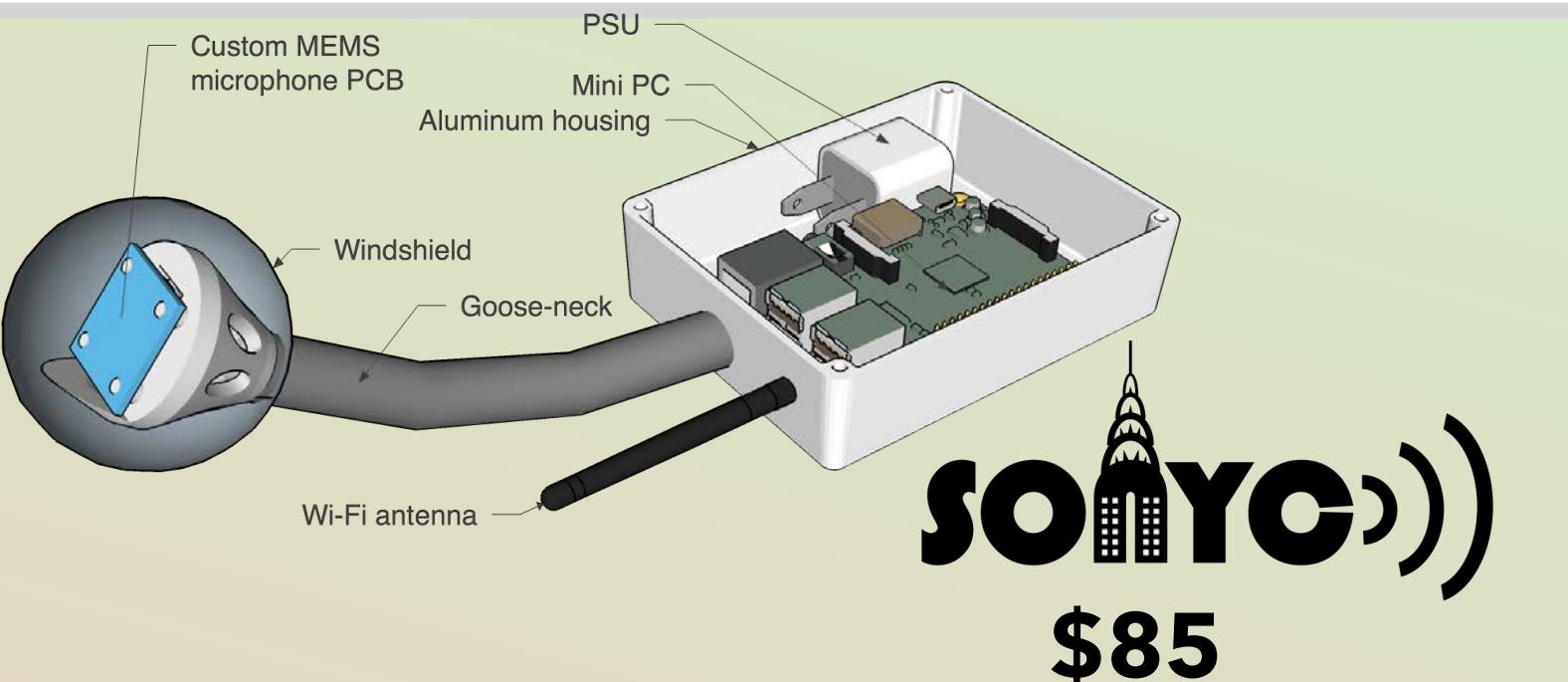
smart phones
\$500



generic IoT
\$100



commercial acoustic sensors
\$600



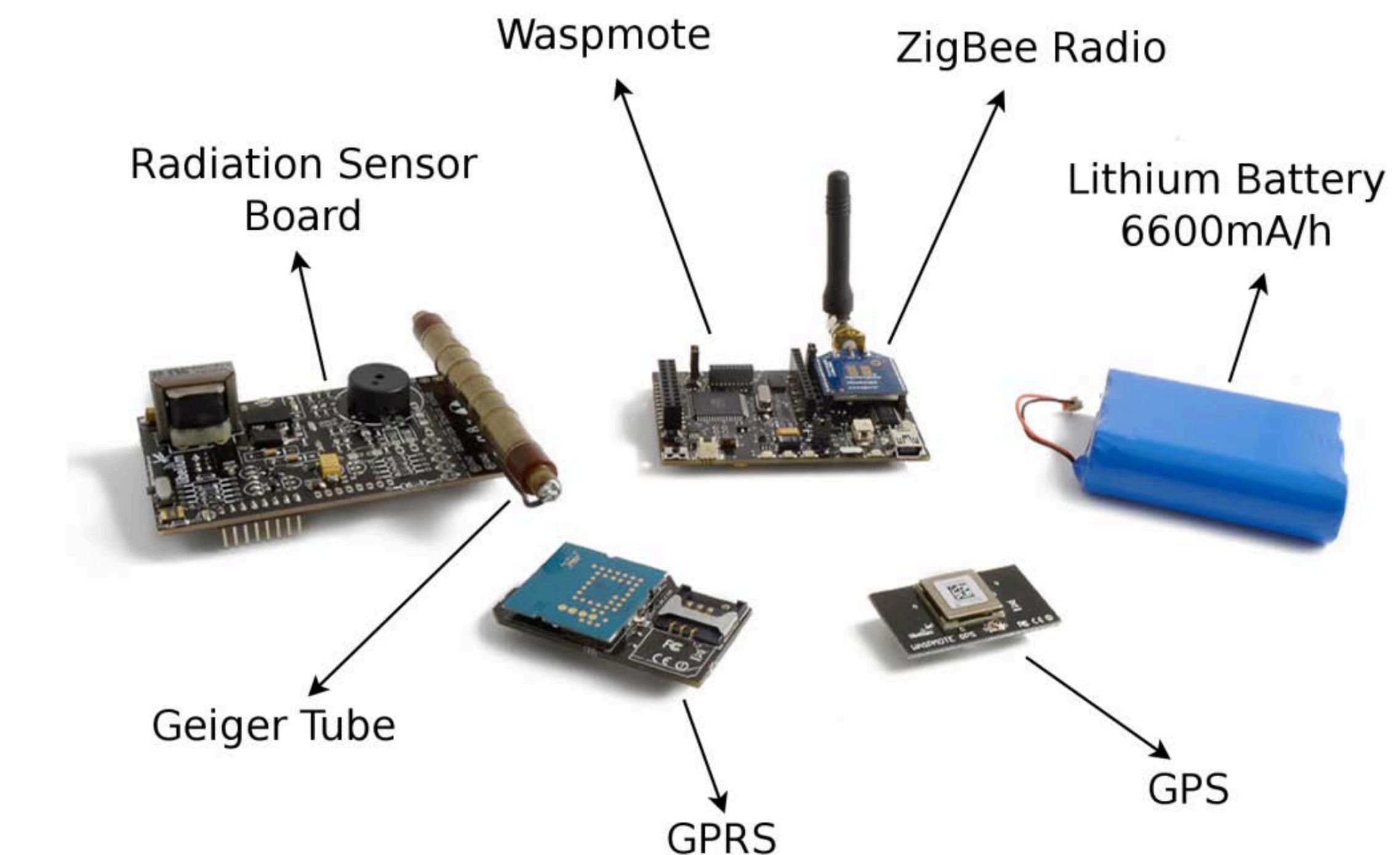
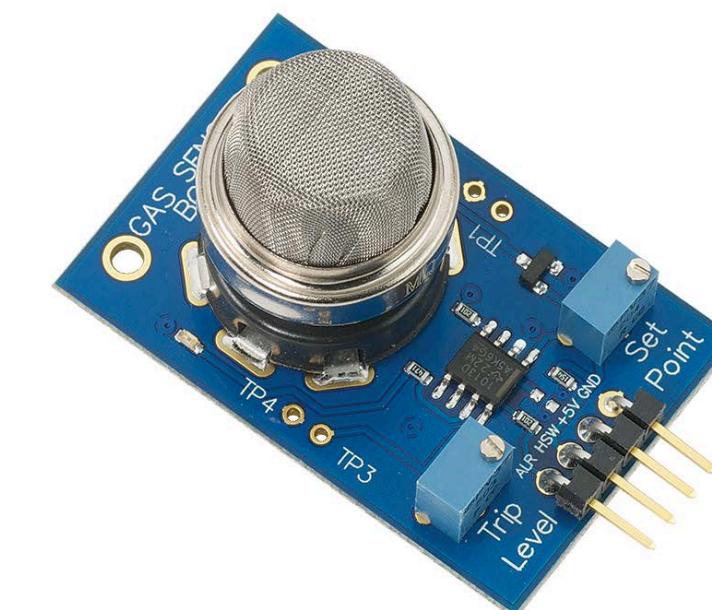
high-end acoustic sensors
\$15,000



Accuracy

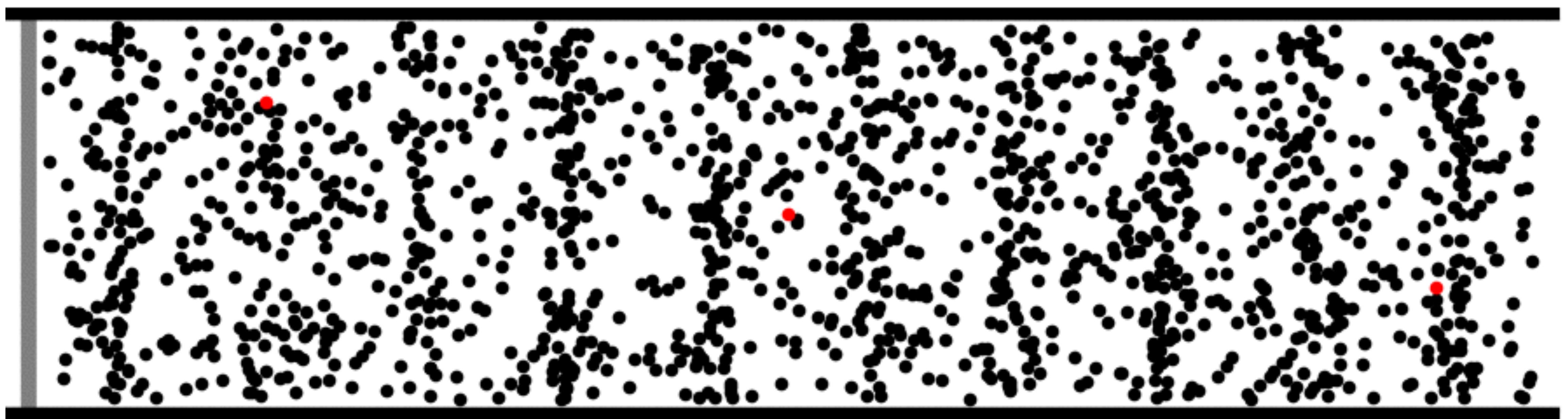
SENSORS & TRANSDUCERS

- ▶ Sensor - a device that converts some physical phenomenon into an electrical signal
- ▶ Transducer - a component that converts one type of energy into another type of energy



WHAT IS SOUND?

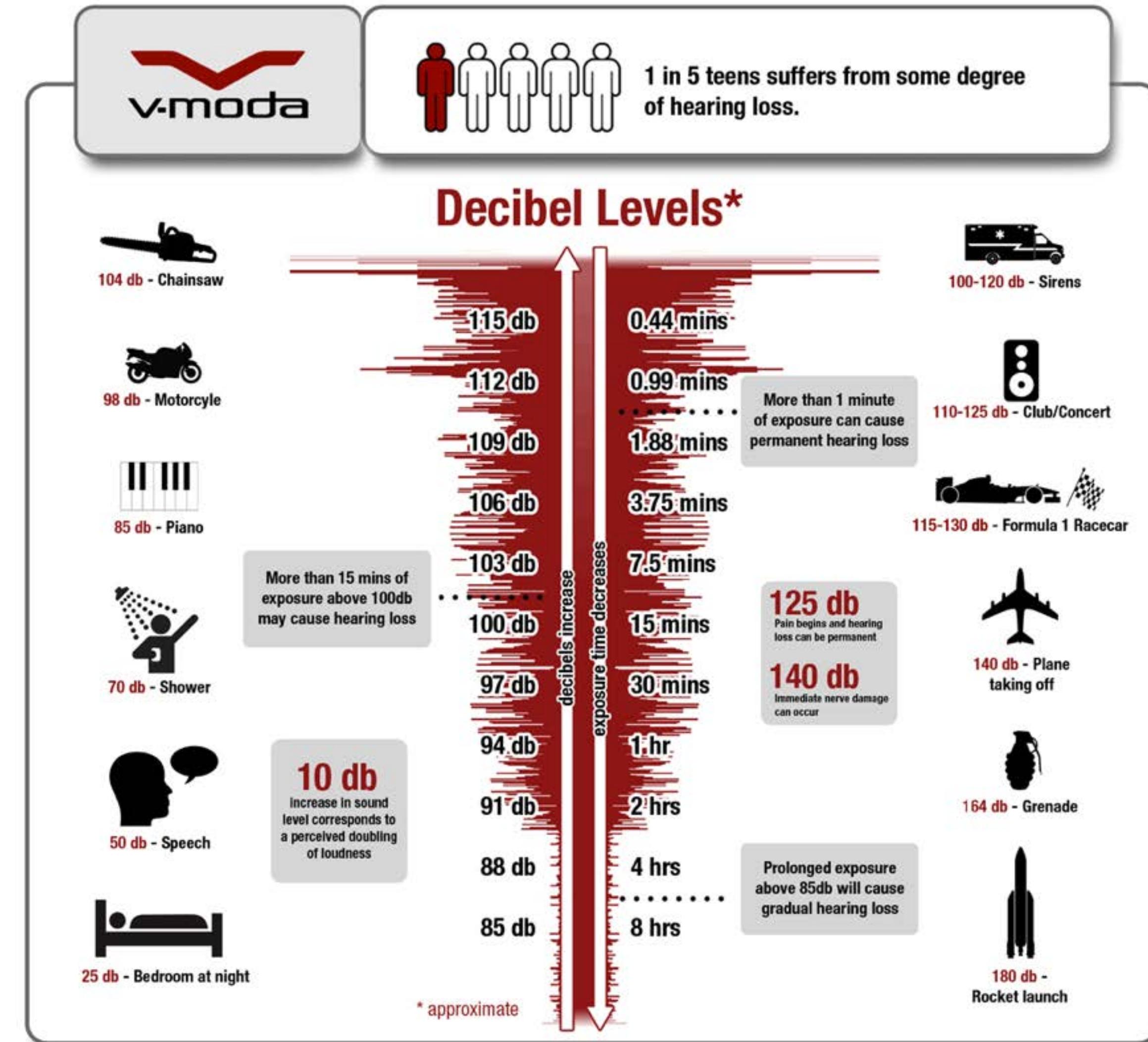
Sound is the energy transferred when something vibrates in a medium



SOUND PRESSURE LEVEL

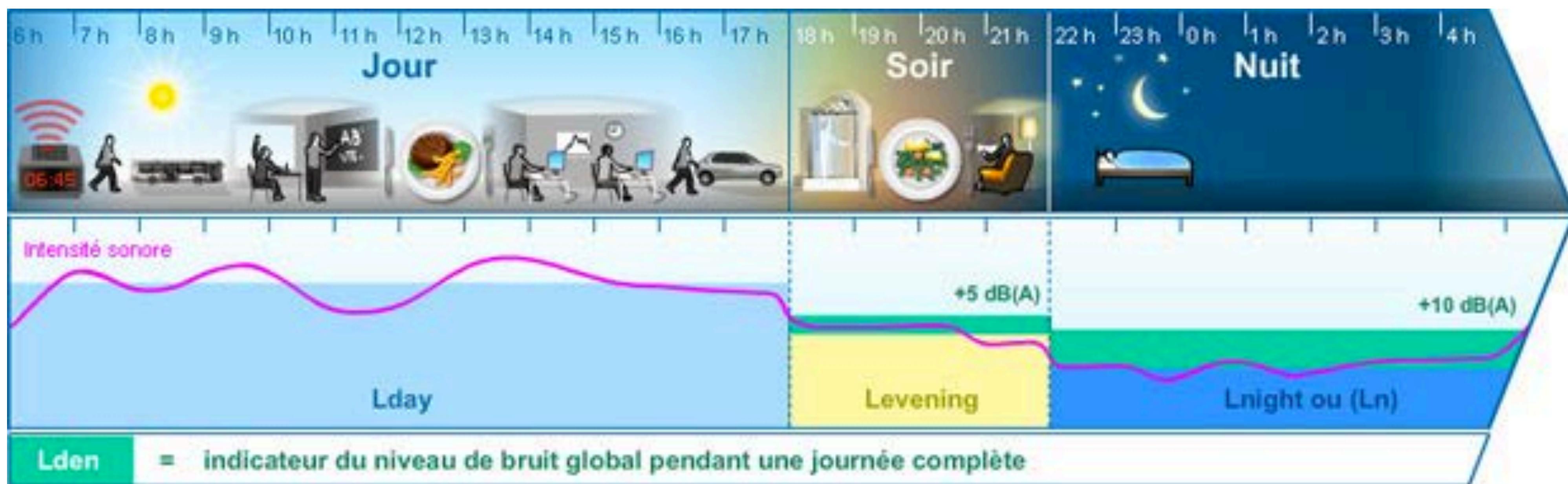
- ▶ Our ears response to sound pressure is $\sim \log_{10}$
- ▶ A 3dB increase doubles sound intensity
- ▶ For example:
 - ▶ 10dB is x10 more intense than 1dB
 - ▶ 20dB is x100 more intense than 1dB
- ▶ Sound pressure level in dB is a \log_{10} ratio relative to the threshold of hearing:

$$20 \log_{10} \left(\frac{p}{p_0} \right) \text{ dB}$$



SOUND PRESSURE LEVEL - DAY, EVENING, NIGHT

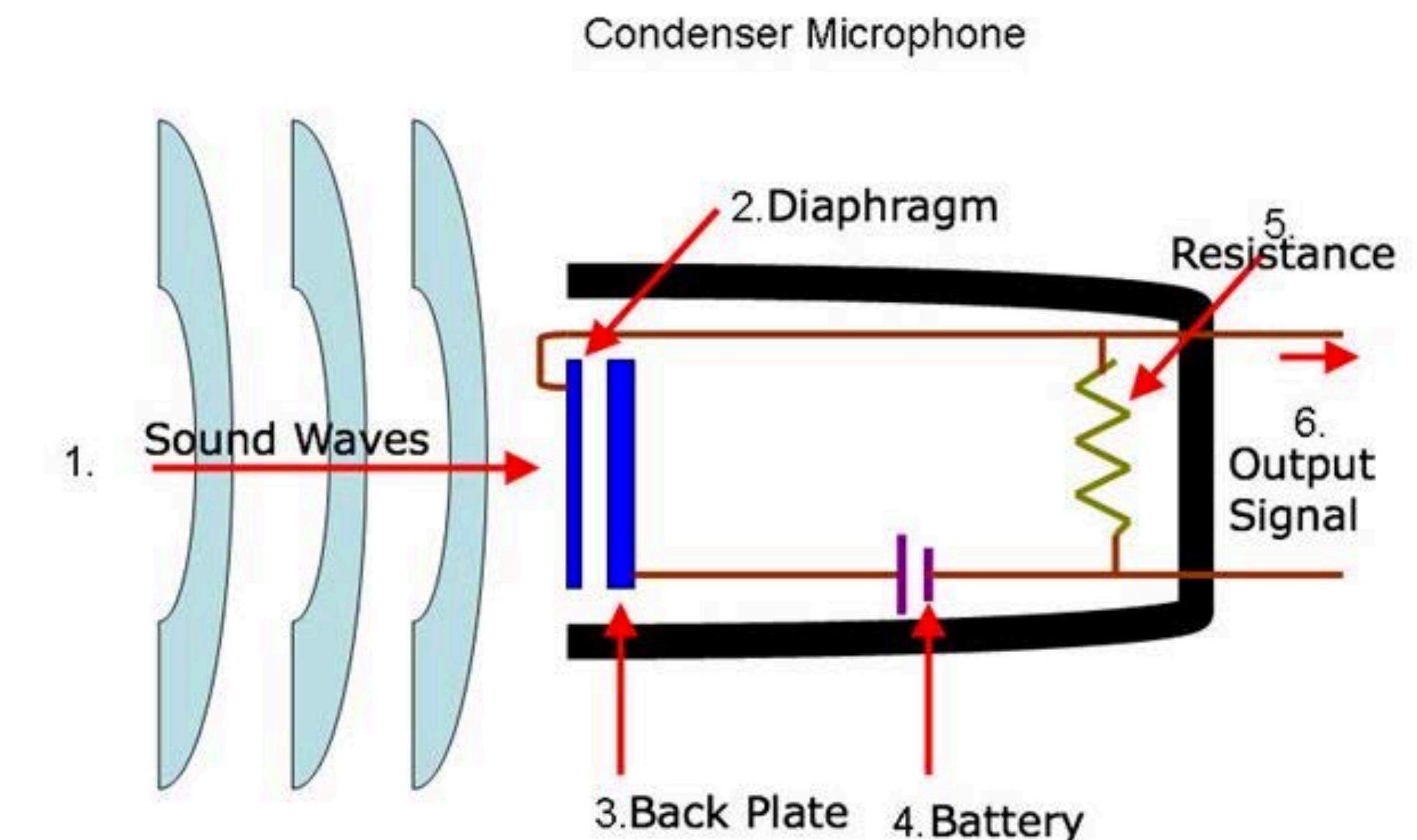
- ▶ Average equivalent sound pressure level over a 24 hour period
- ▶ Penalty added to reflect the increased impact of noise at different times of the day
- ▶ 5dB(A) added during the evening hours of 18:00 – 22:00
- ▶ 10dB(A) added during the nighttime hours of 22:00 – 07:00



ACOUSTIC TRANSDUCTION

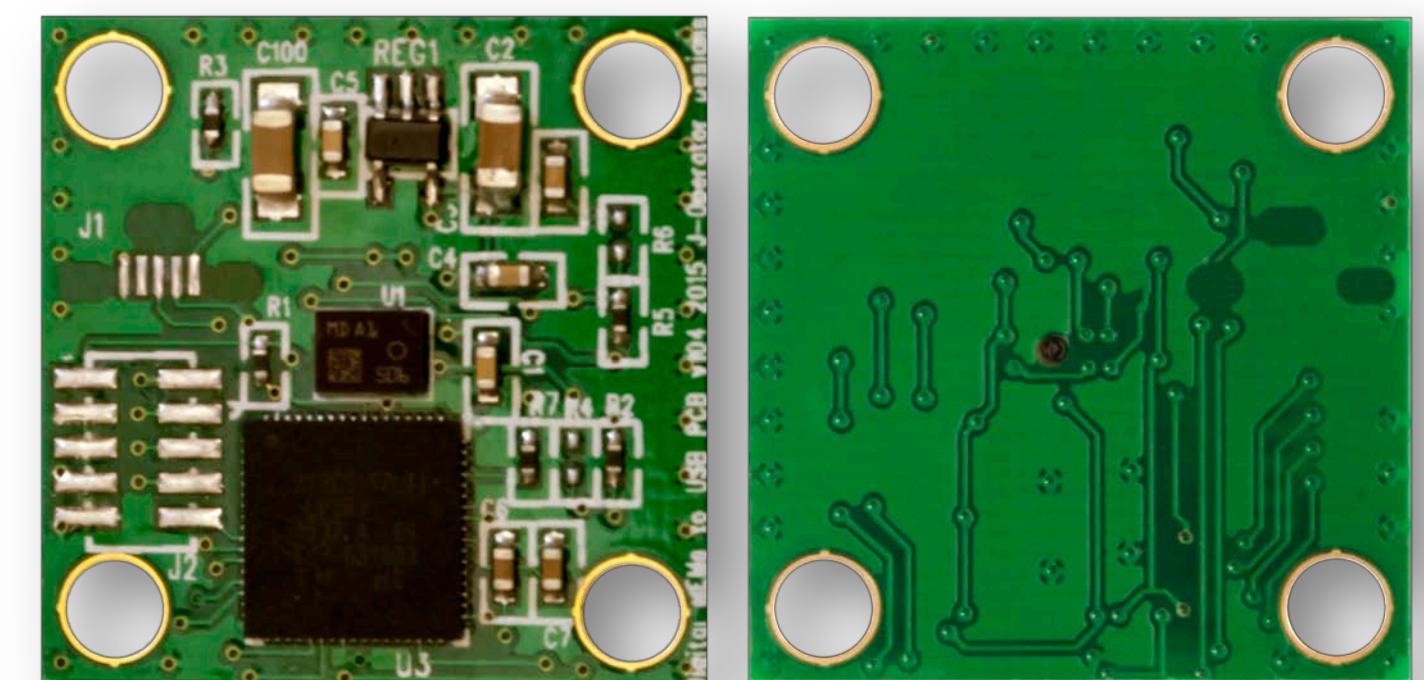
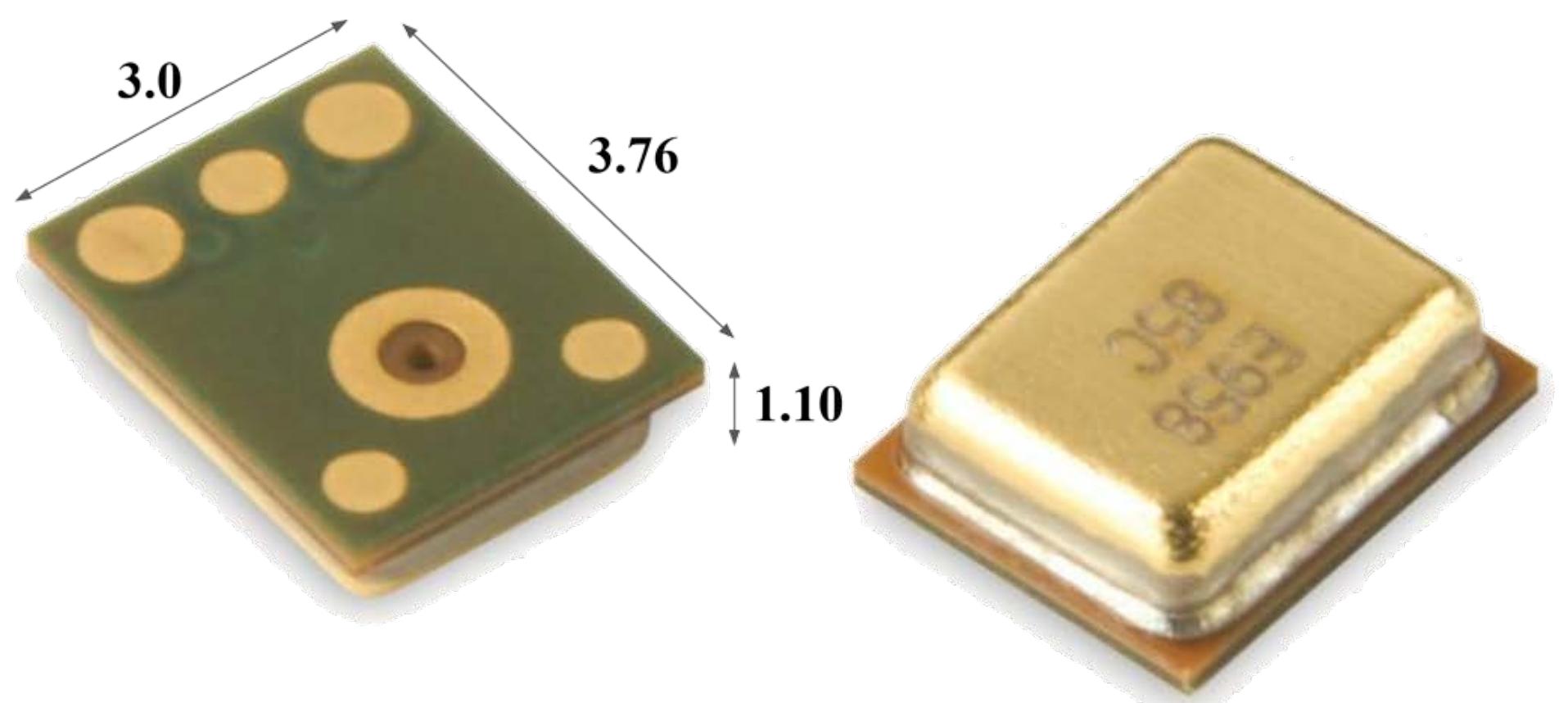
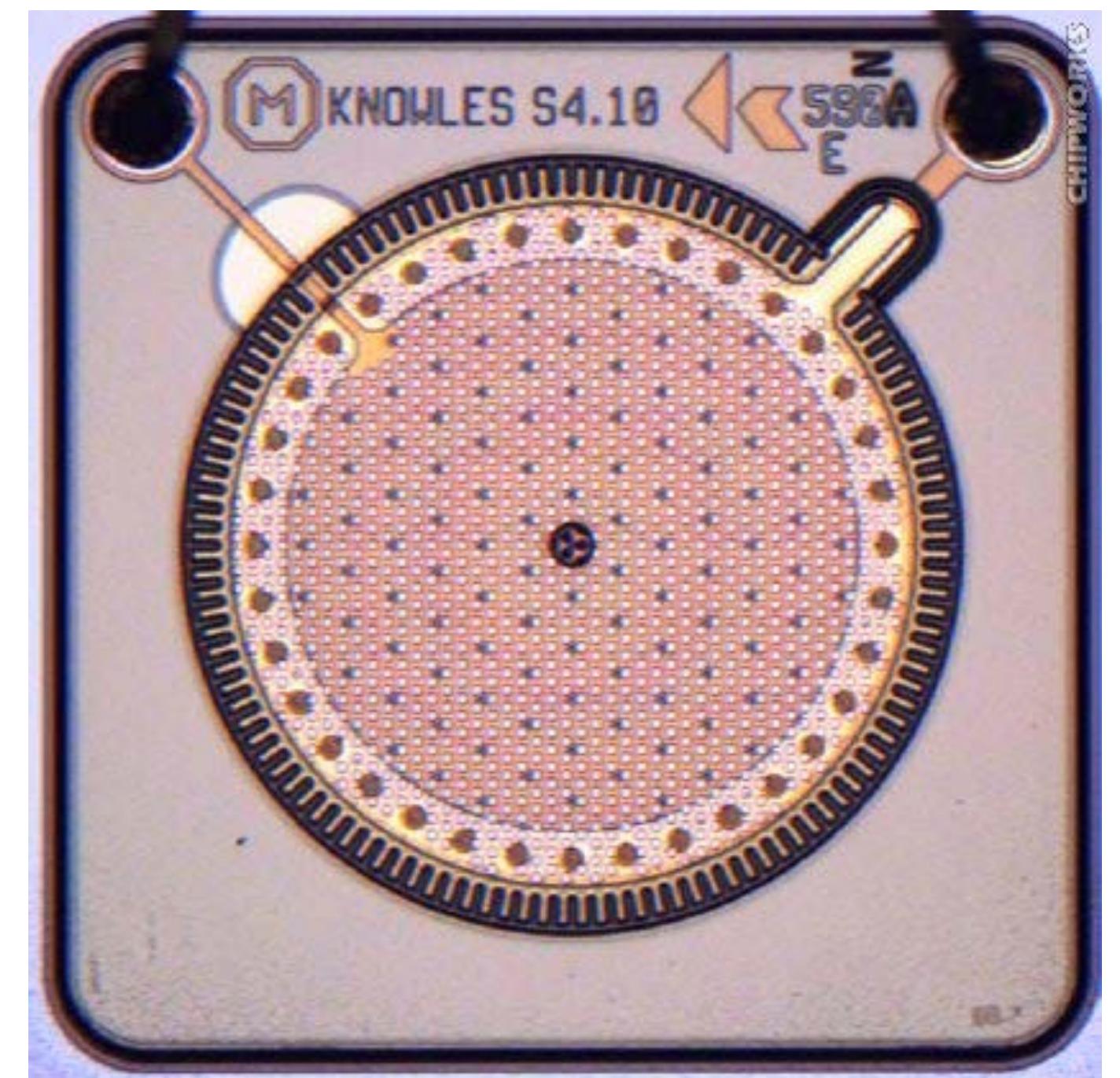
- ▶ The microphone diaphragm acts as a capacitor
- ▶ As the diaphragm vibrates a varying voltage is generated
- ▶ This varying voltage (± 1.0) is the audio signal
- ▶ Linear relationship between sound pressure and voltage
- ▶ You can convert to uncalibrated decibels using the formula below, where p = instantaneous voltage and p_0 = the reference voltage of 1.0

$$20 \log_{10} \left(\frac{p}{p_0} \right) \text{ dB}$$



MEMS MICROPHONES

- ▶ Diaphragm is etched directly onto a silicon chip using Micro Electro Mechanical System techniques
- ▶ Variant of the condenser microphone type
- ▶ Extremely small
- ▶ Very rugged
- ▶ Very high part to part consistency



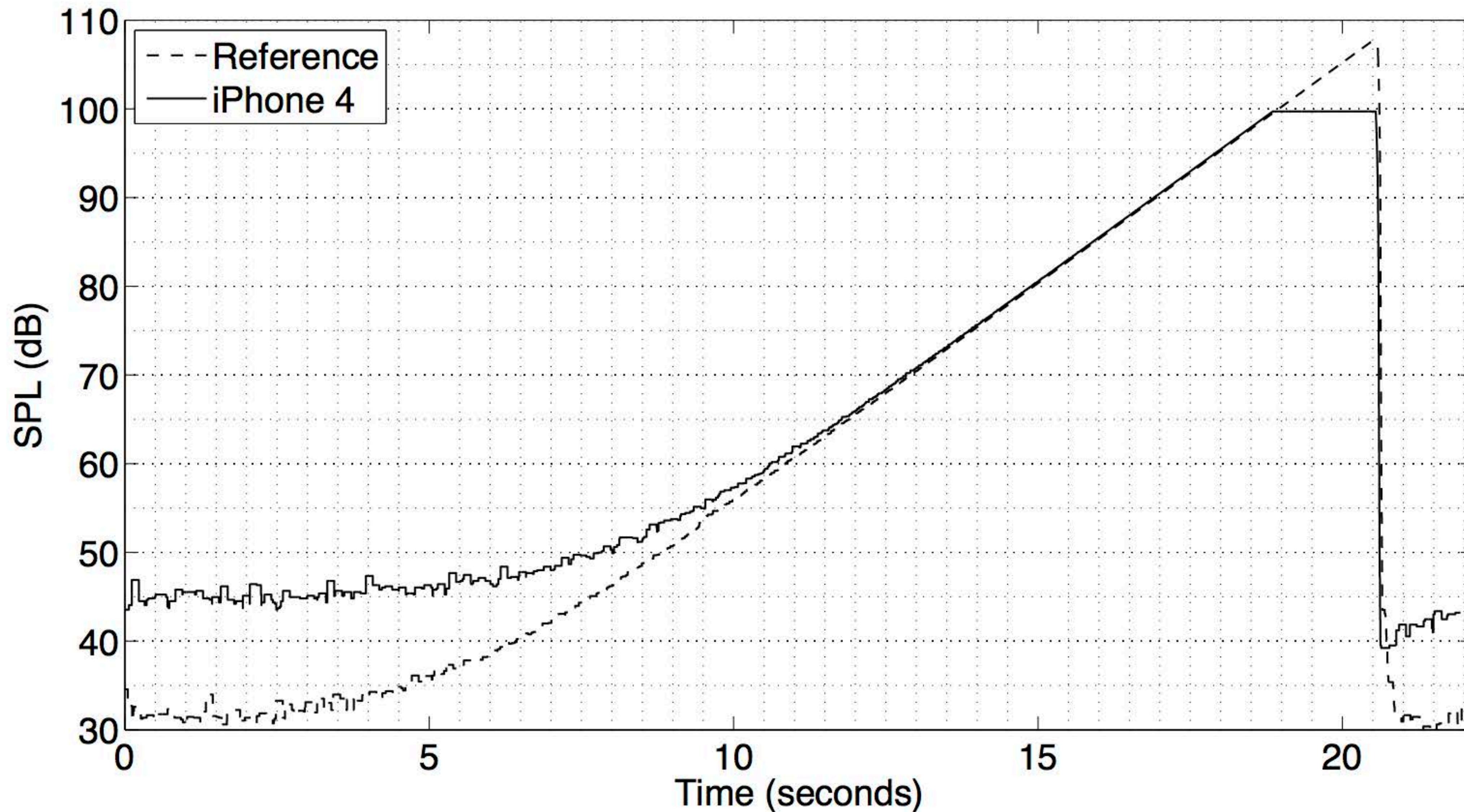
WHY DO WE NEED CALIBRATED SPL DATA?

- ▶ Need to be sure of the accuracy of a set of measurements
- ▶ American National Standards Institute (ANSI) specify 3 classes for SPL measurements:
 - ▶ 0 = laboratory grade ($\pm <1\text{dB}$)
 - ▶ 1 = precision field measurement grade ($\pm 1\text{dB}$)
 - ▶ 2 = general purpose measurement grade($\pm 2\text{dB}$)
- ▶ Involves the generation of a known SPL in comparison to a reference device such as a class 1 sound level meter (SLM)



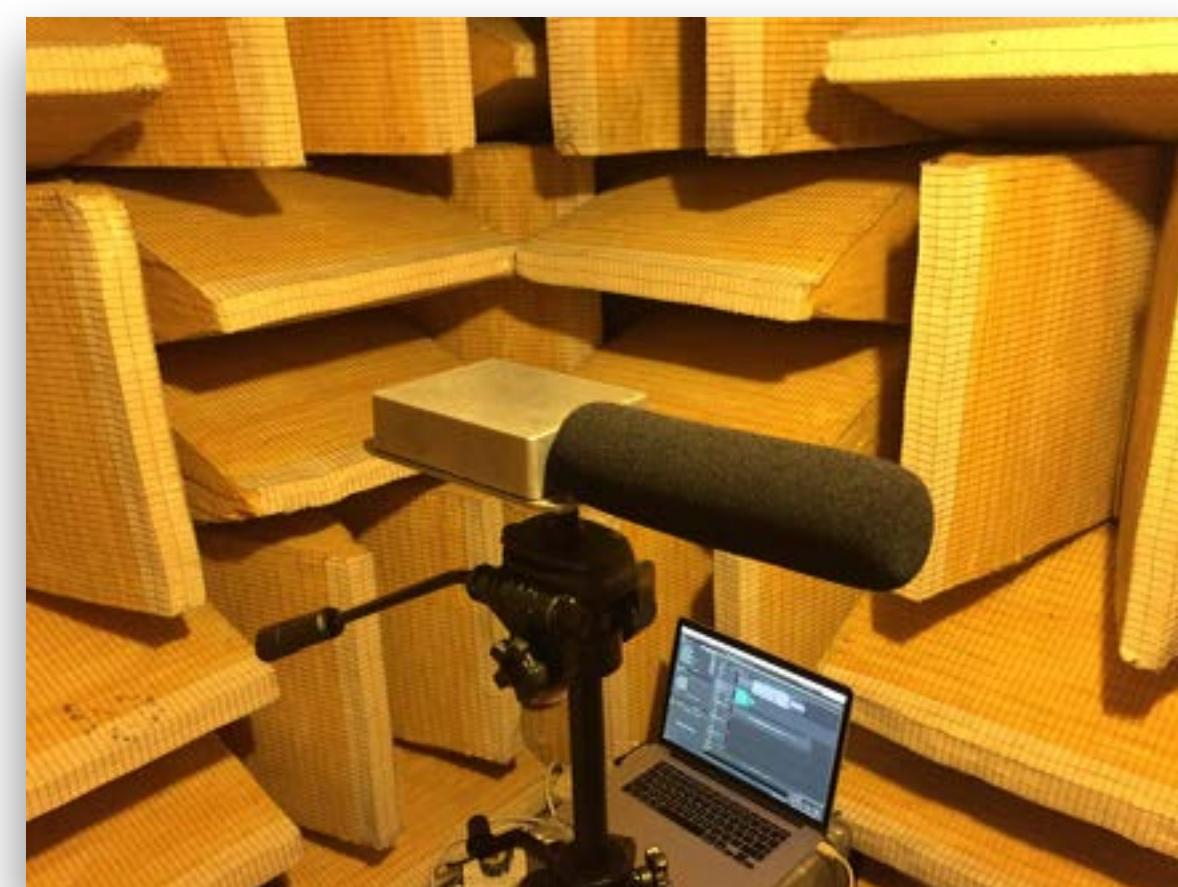
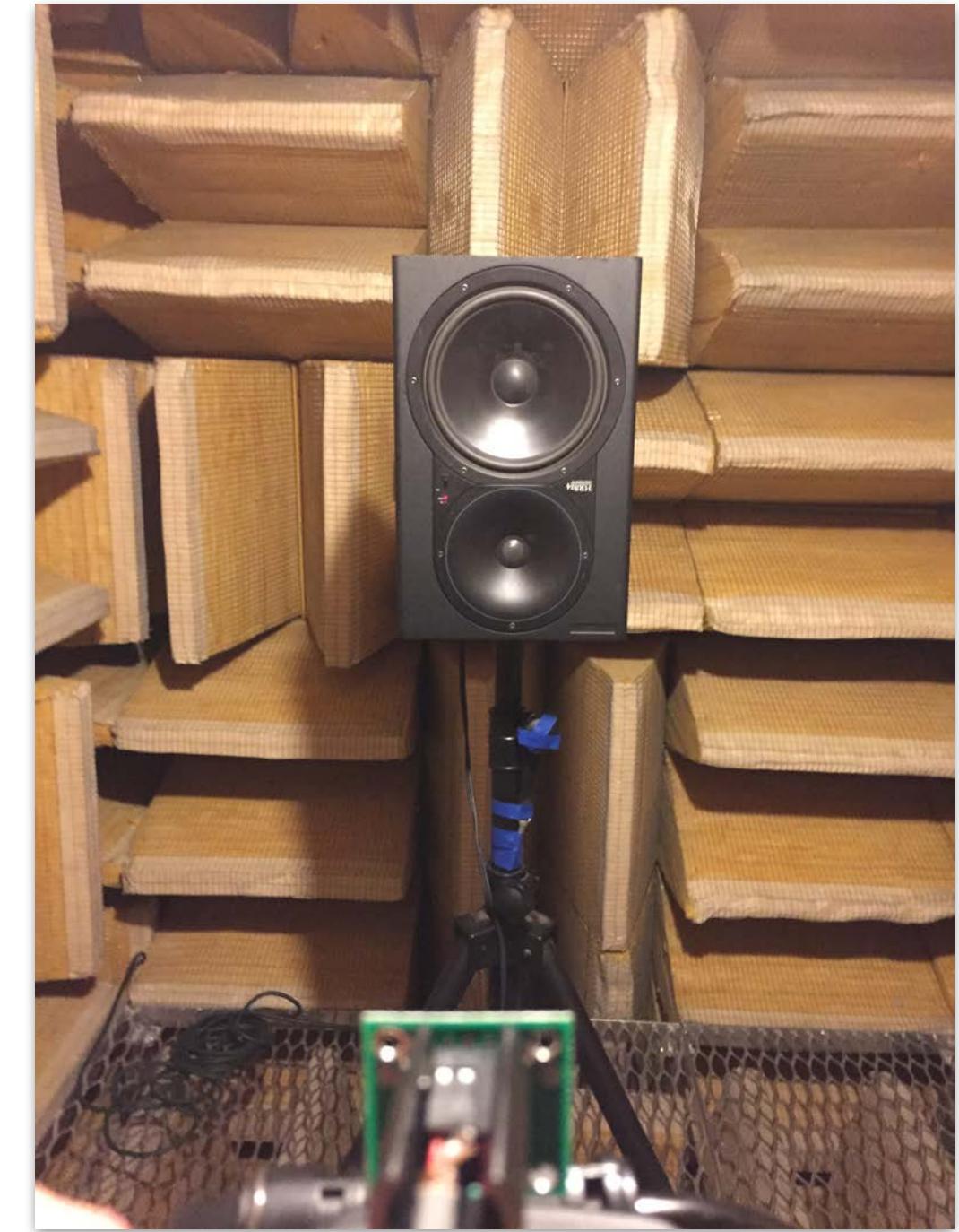
**Why Calibrate?
What is the risk
of not calibrating?**

COMPARISON TO A CALIBRATED DEVICE



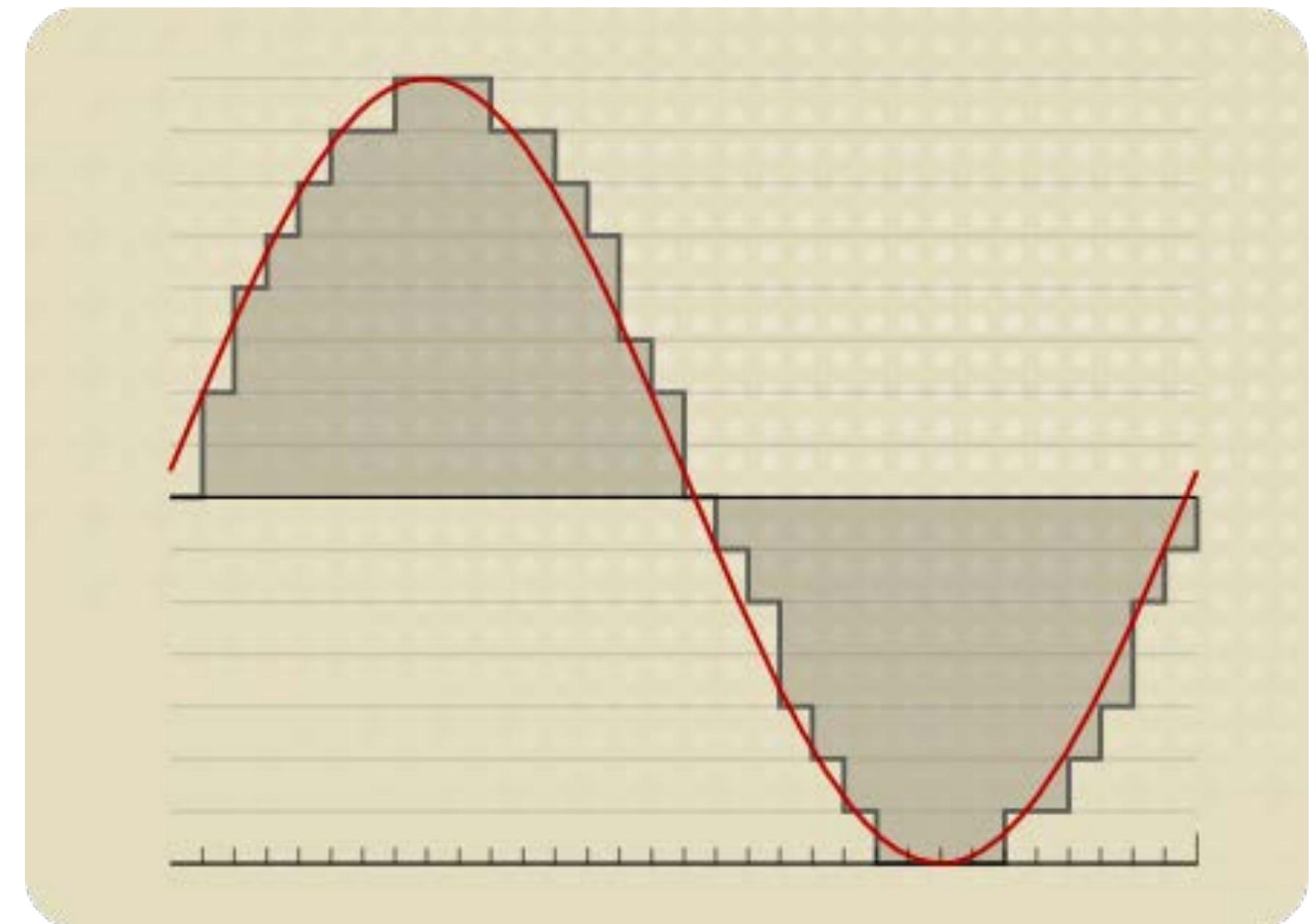
ACOUSTIC SENSOR CALIBRATION

- ▶ Repeat measurements using ref. meter & device under test (DUT)
- ▶ Determine dB offset
- ▶ Use of MEMS microphone simplifies network calibration
- ▶ Noise floor of the system
- ▶ How does the microphone perform after 6 months in the field?



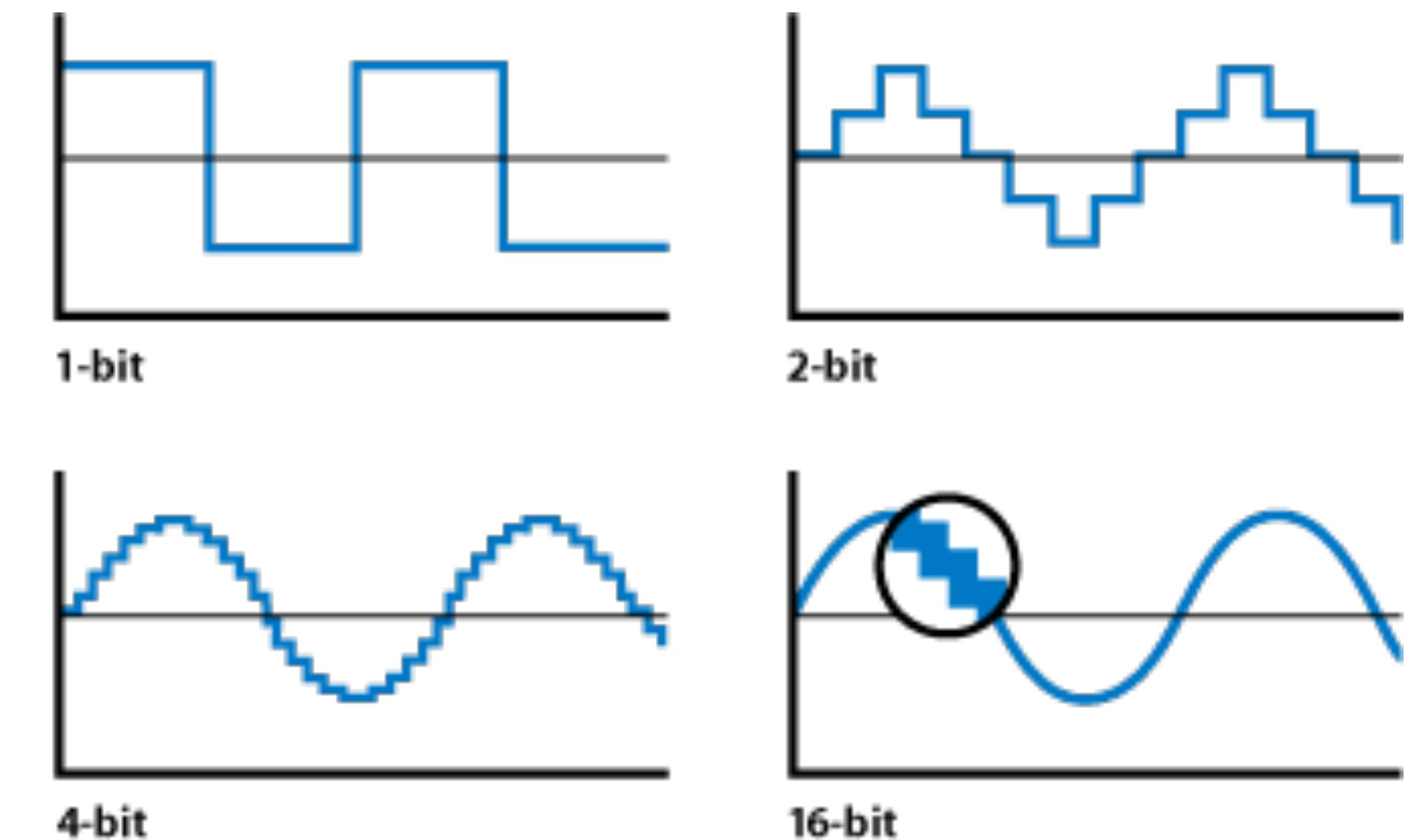
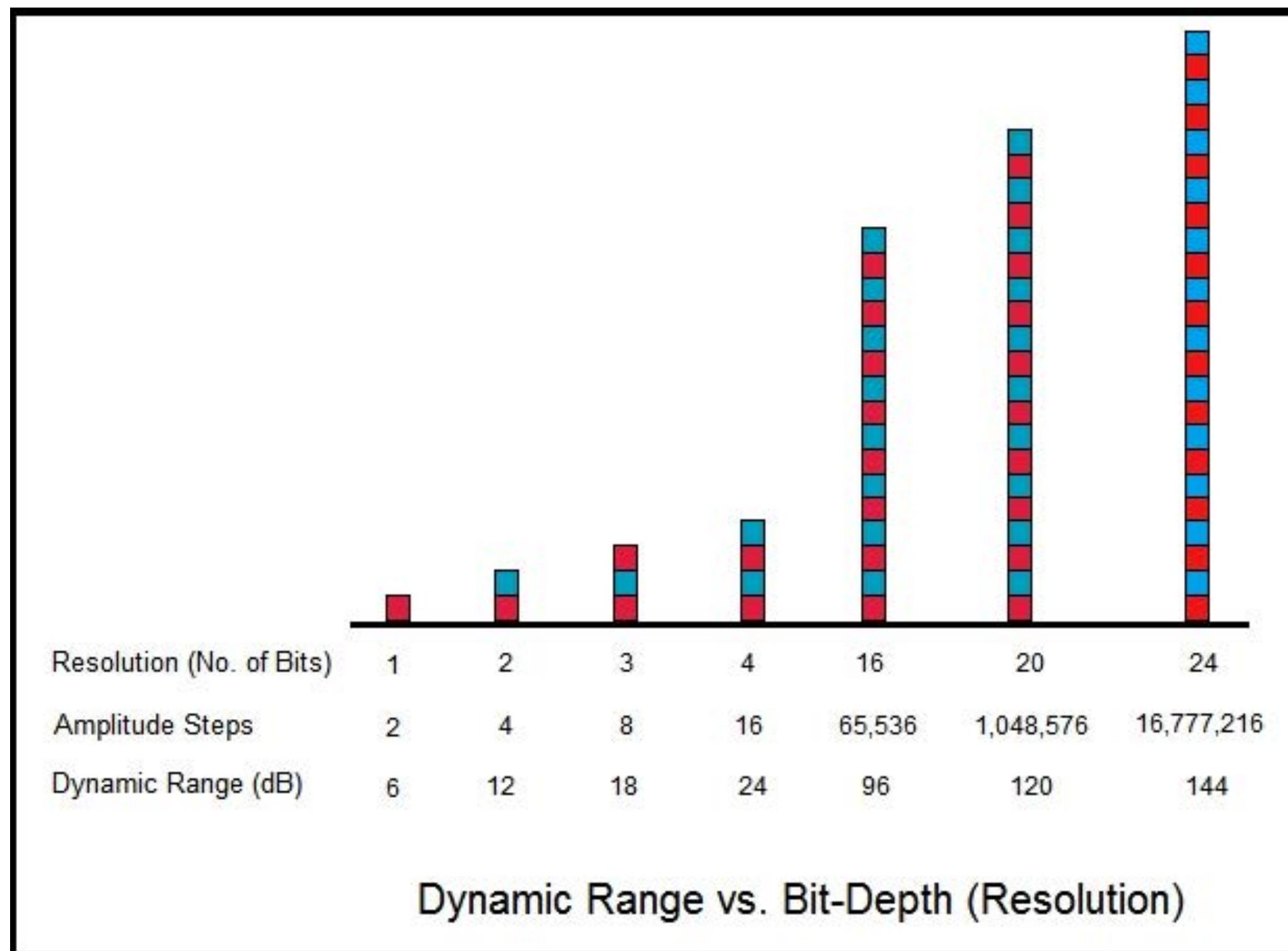
DIGITAL AUDIO SAMPLING (ADC)

- ▶ The reduction of a continuous signal to a discrete signal (sequence of samples)
- ▶ A sample represents an amplitude in time
- ▶ The sample rate determines how often a sample is measured in time
- ▶ CD quality audio is sampled at 44,100 times per second (Hz)

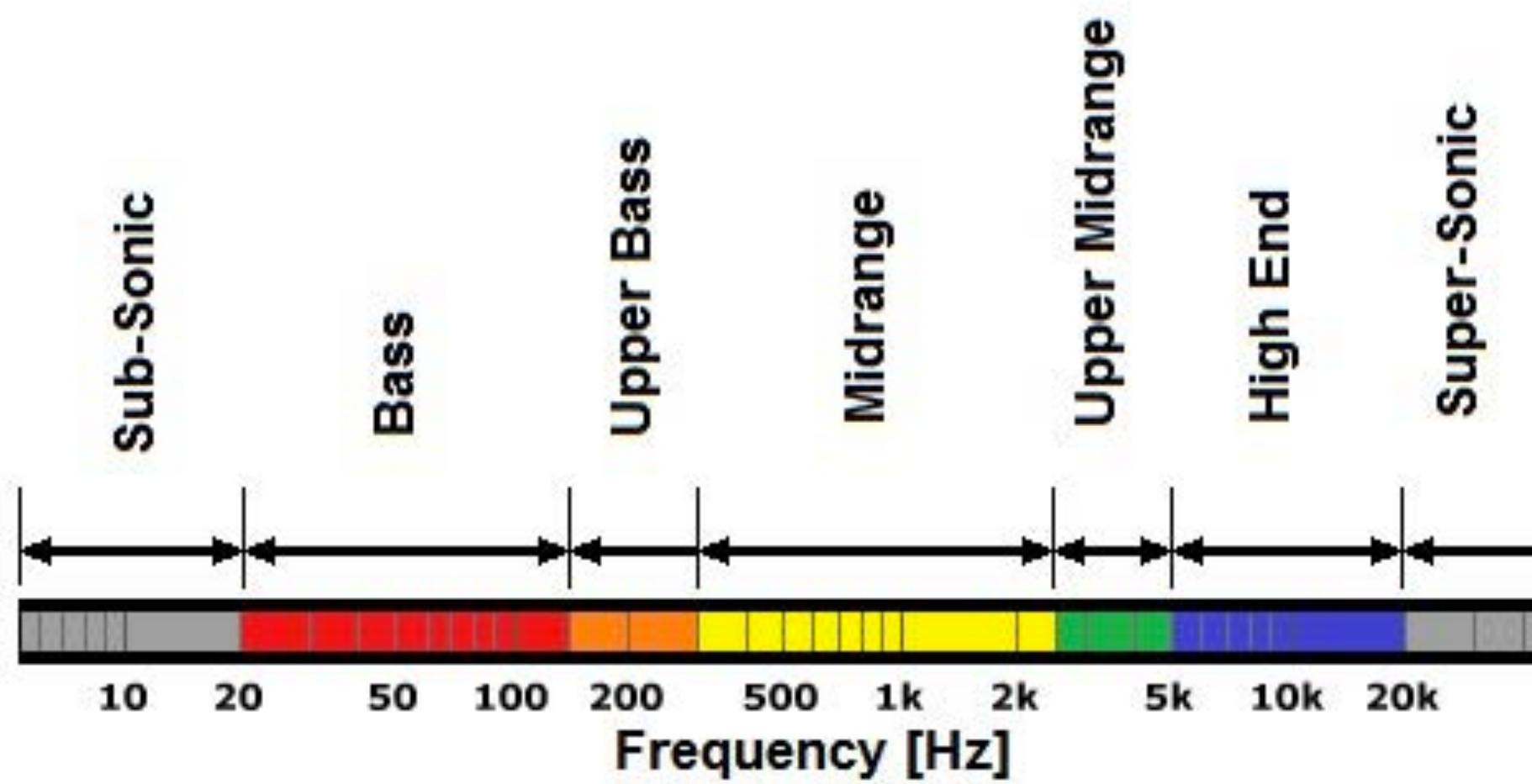


DIGITAL AUDIO SAMPLING (ADC)

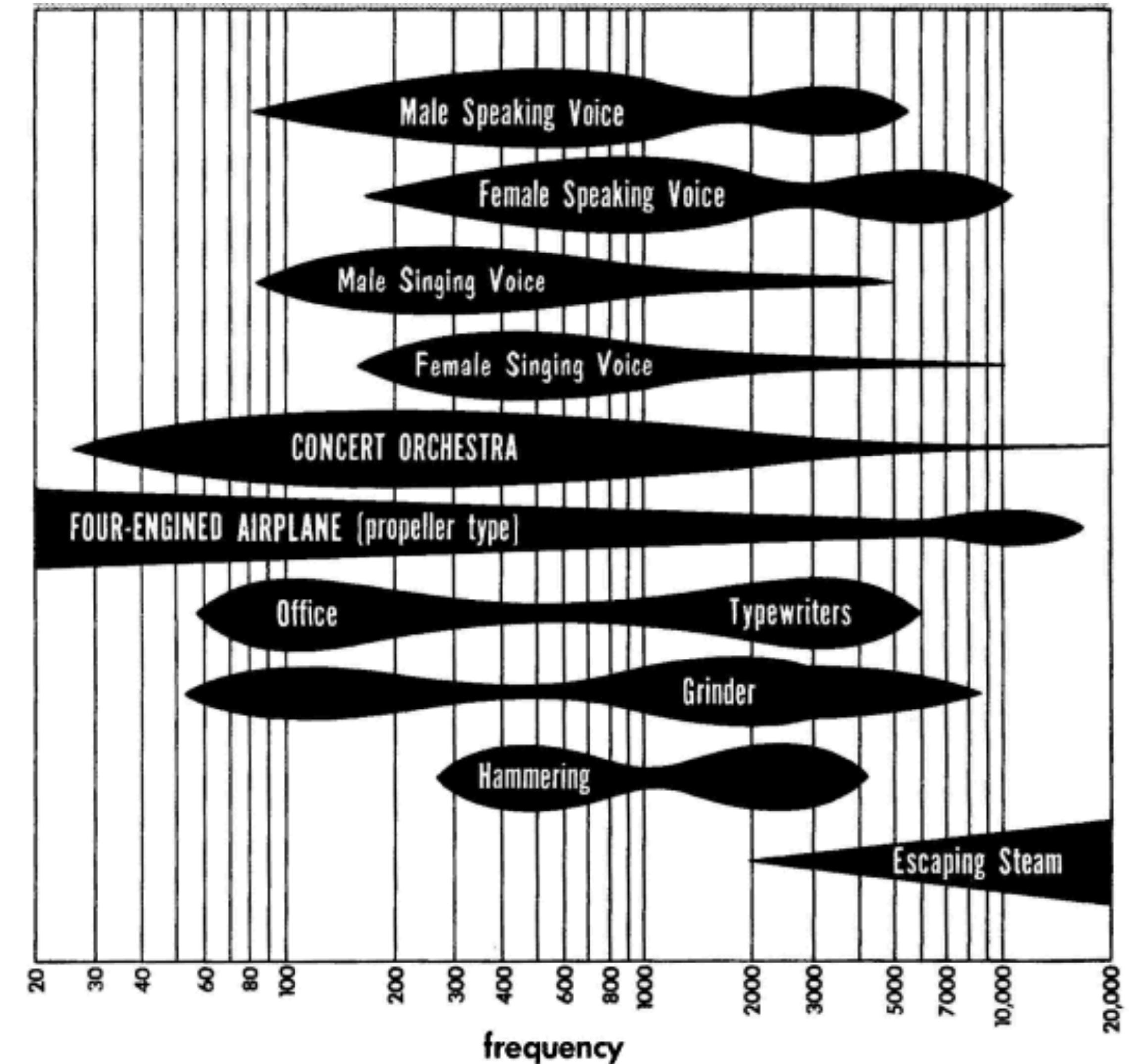
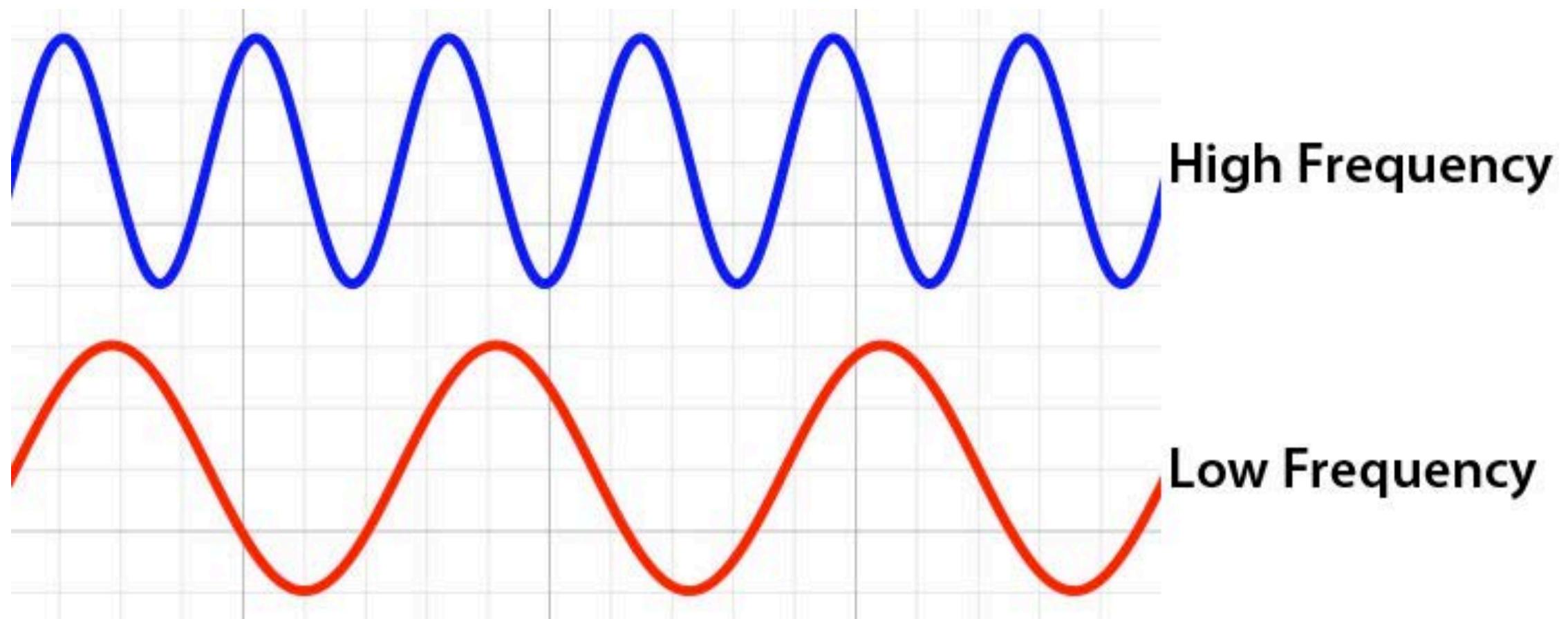
- ▶ The number of bits of information used to represent each audio sample
- ▶ CD quality audio uses 16 bits of information per audio sample (0 ± 32768)
- ▶ Lower bit depths reduce the signal to noise ratio



AUDIBLE FREQUENCY RANGE

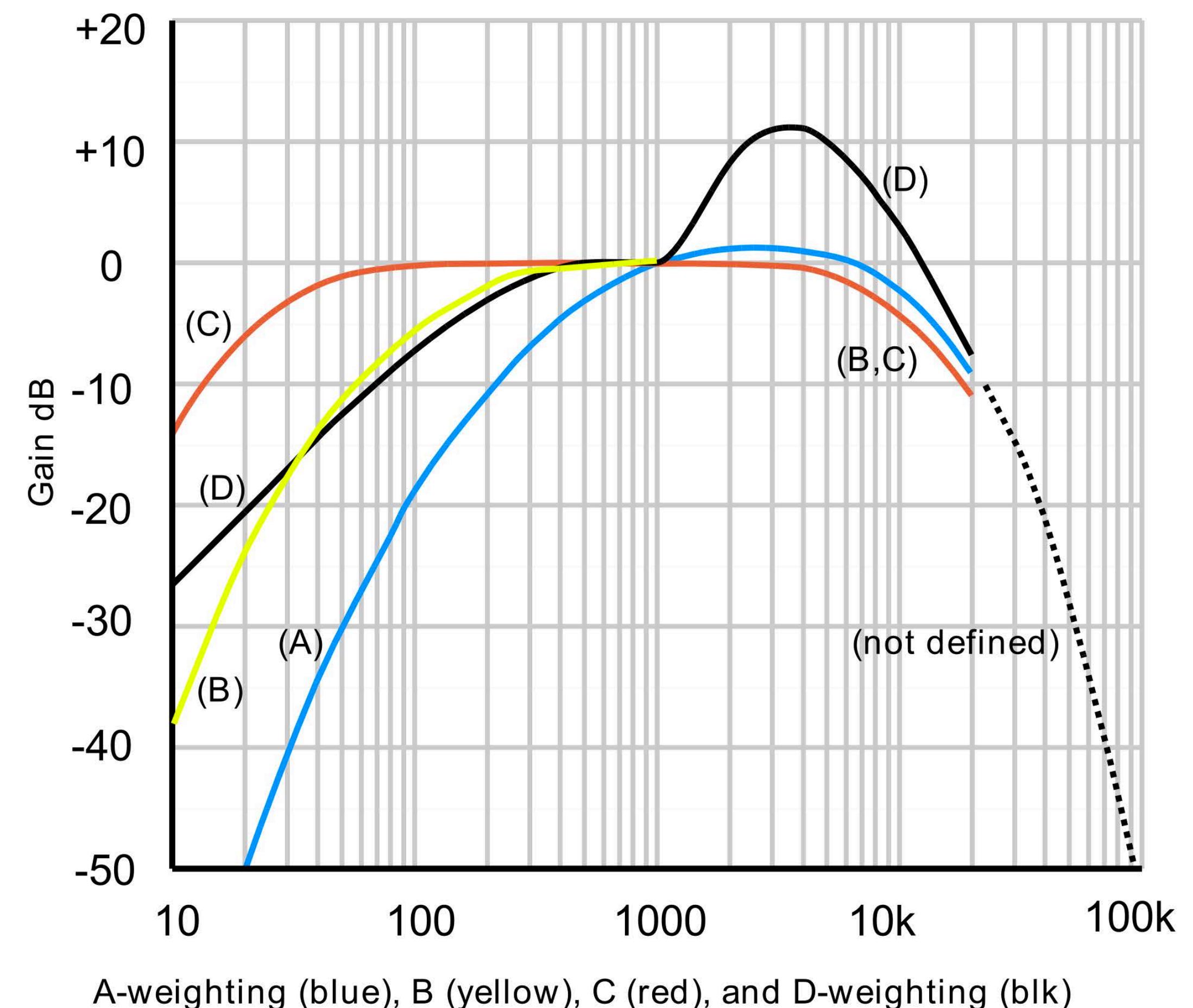


Audio Spectrum

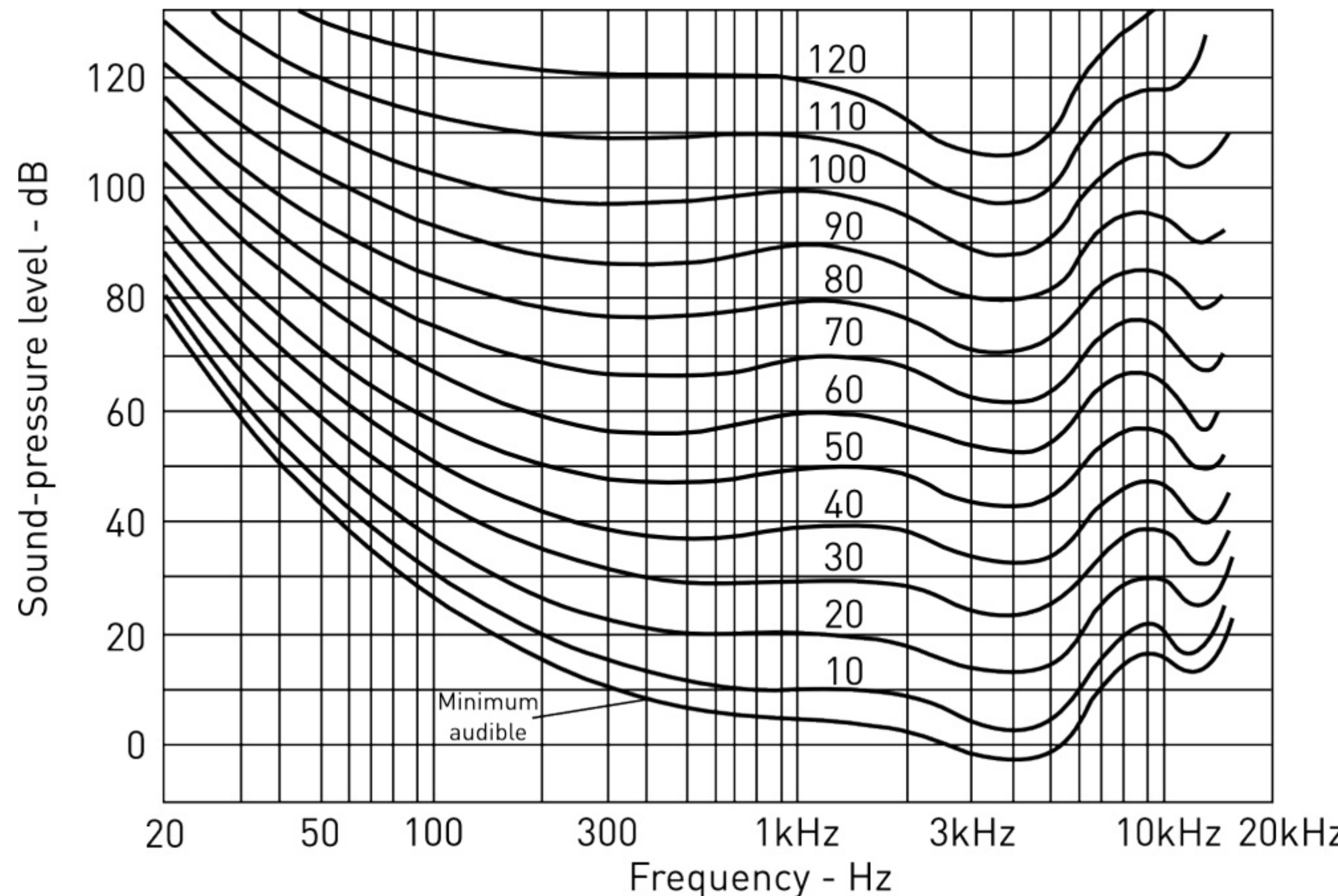


SOUND PRESSURE LEVEL METRICS

- ▶ Human ear more sensitive to frequencies between 500Hz - 8kHz
- ▶ Urban noise policies rely on the use of A weighted sound pressure level
- ▶ Approximates the response of the human auditory system
- ▶ Dated standard
- ▶ Low frequency noise annoyance isn't accounted for - wind turbine noise



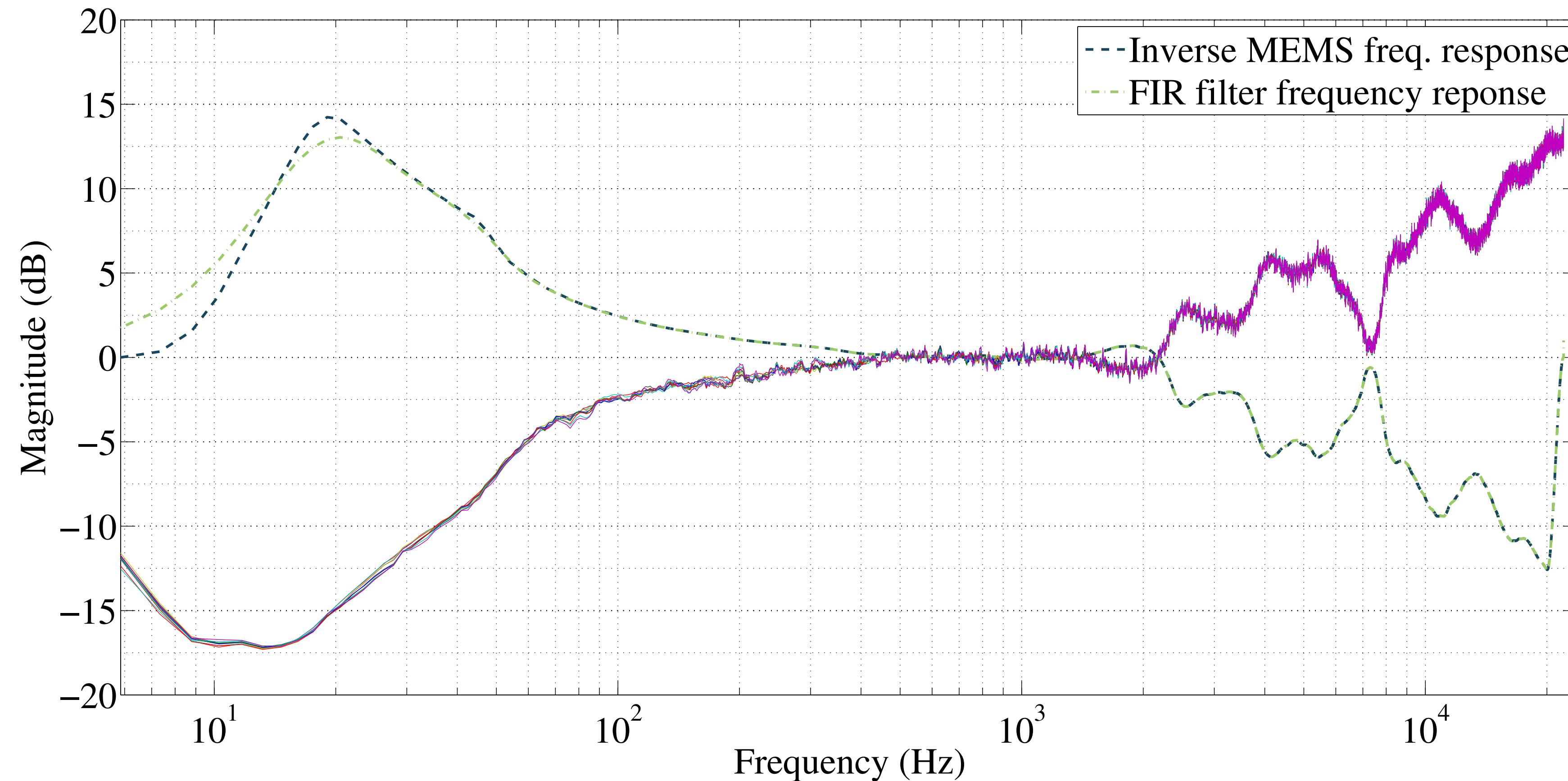
EQUAL LOUDNESS CONTOURS



Robinson and Dadson curves (1956)

MICROPHONE FREQUENCY RESPONSE

- ▶ Characterizes a microphone's sensitivity/output level across the audible frequency range
- ▶ Accurate sensing requires as close to a "flat" response as possible



PRESBYCUSIS - AGE RELATED HEARING LOSS

- ▶ The auditory system's sensitivity to high frequency sound degrades over time
- ▶ Hearing damage also results in high frequency losses
- ▶ The evil mosquito anti loitering device
- ▶ How young are your ears...



FREQUENCY DOMAIN ANALYSIS

- ▶ In 1807, Jean Baptiste Joseph Fourier, a French mathematician and physicist stated that:

Any periodic function can be rewritten as a weighted sum of sines and cosines of different frequencies

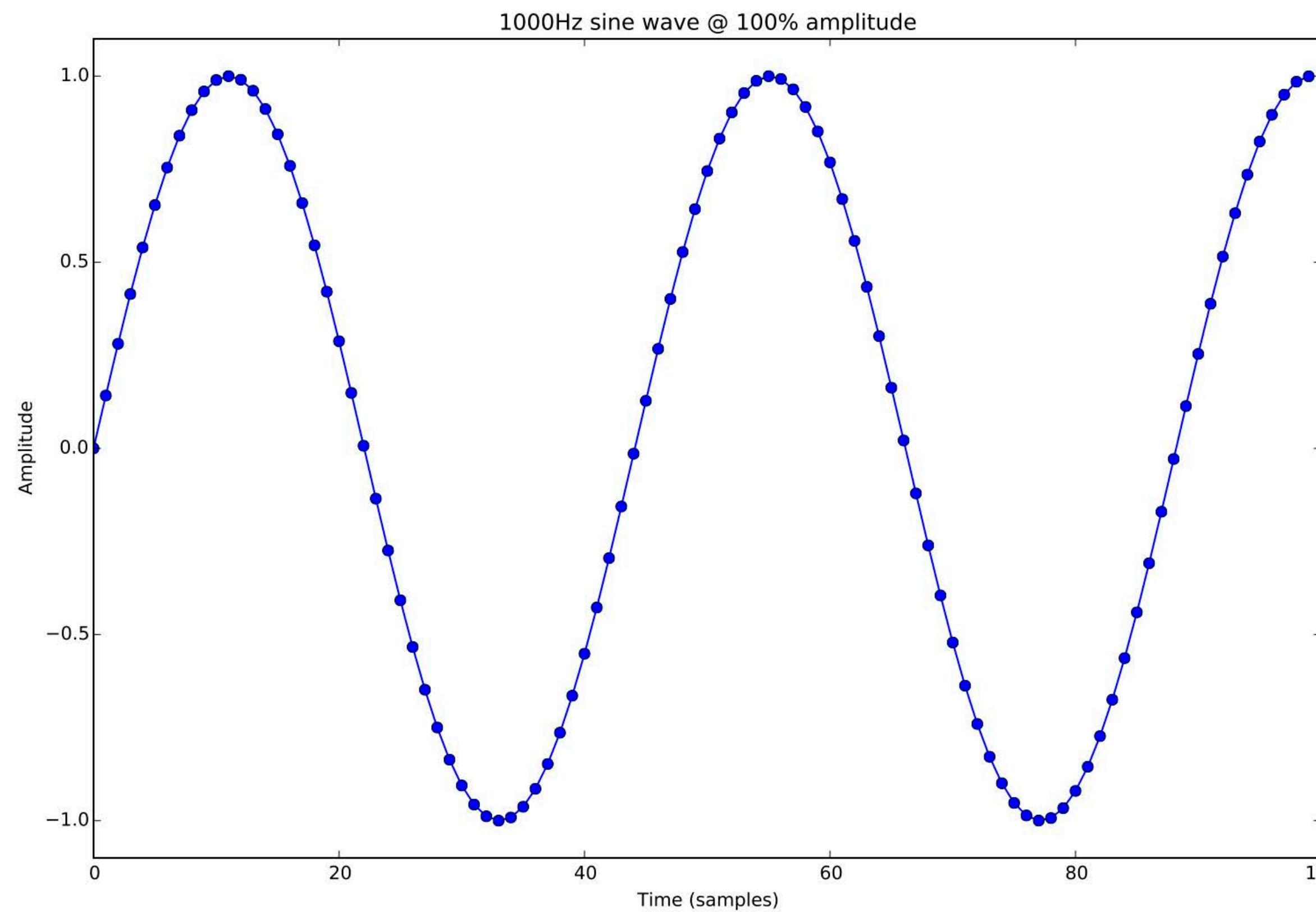
- ▶ *This was called Fourier Series and is one of the most important tools in science*



SUMMATION OF SINUSOIDS

- ▶ According to Fourier we can recreate any complex waveform using a weighted combination of the most fundamental audio components:

$$A \sin(2\pi fT + \phi)$$

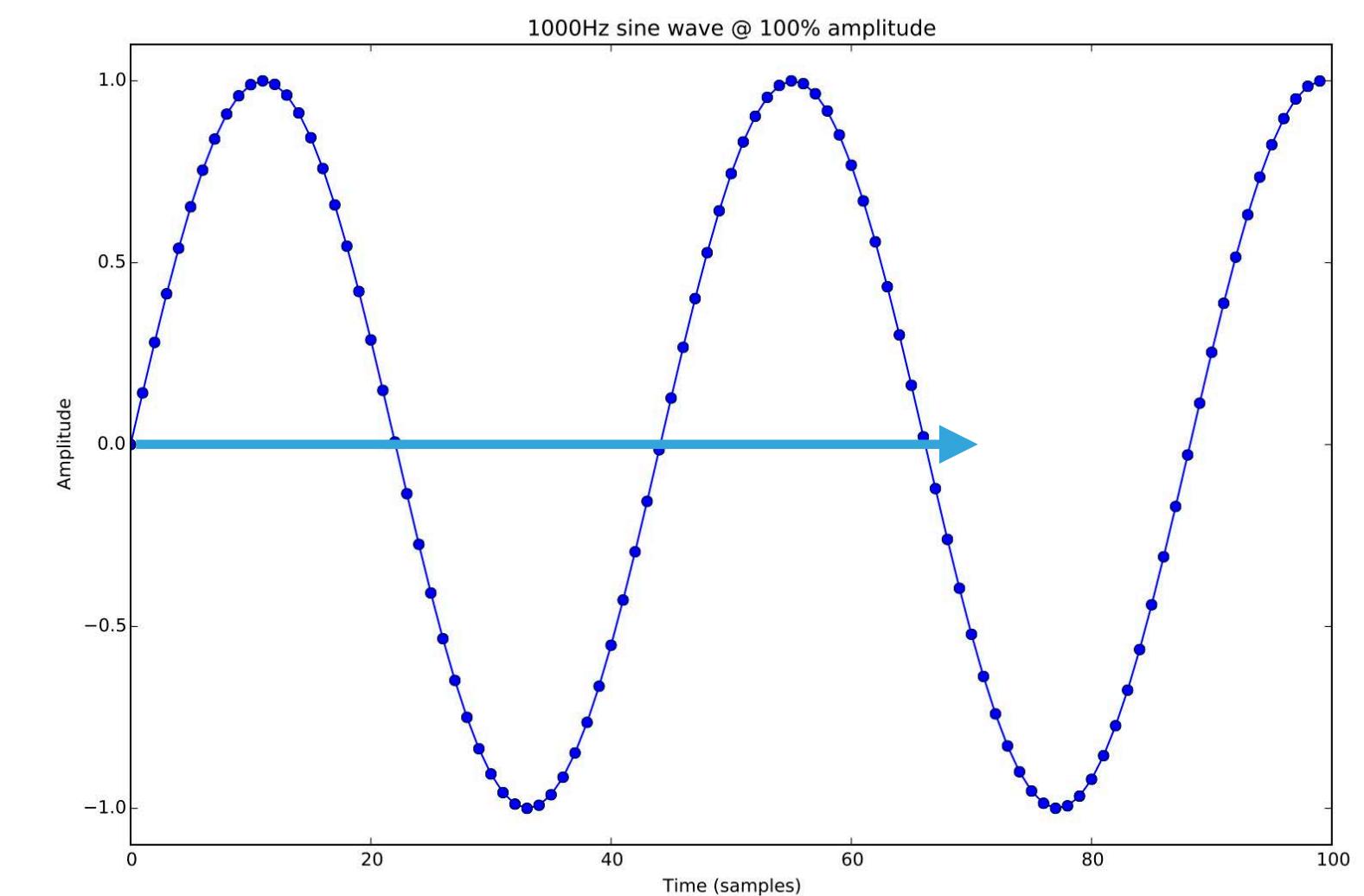


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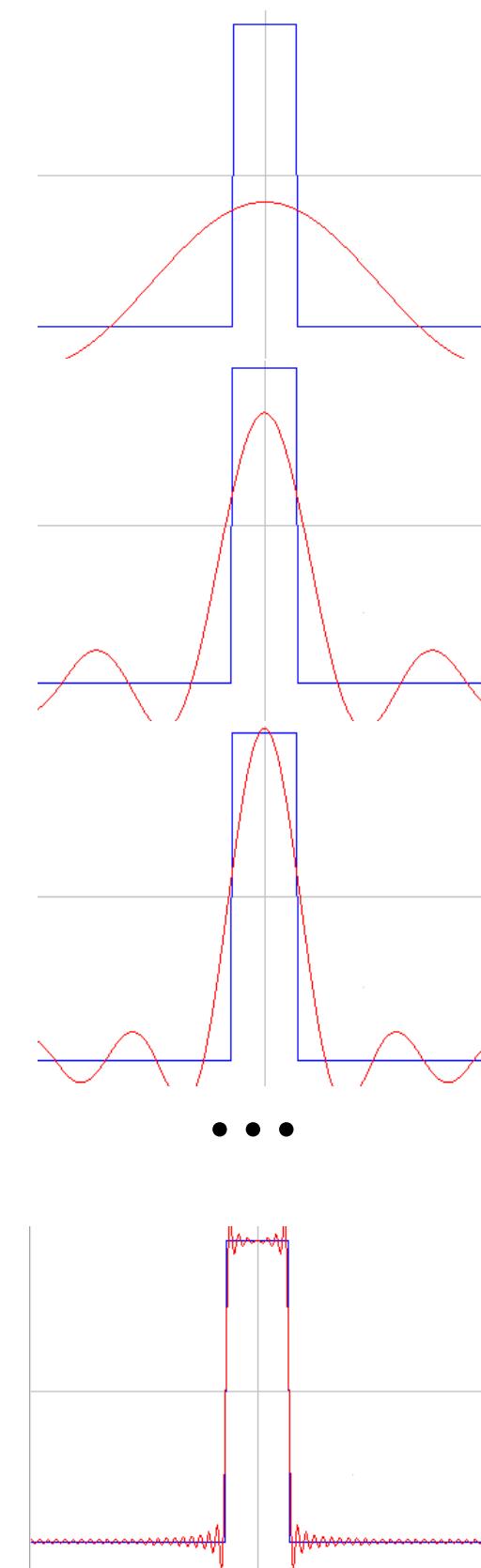
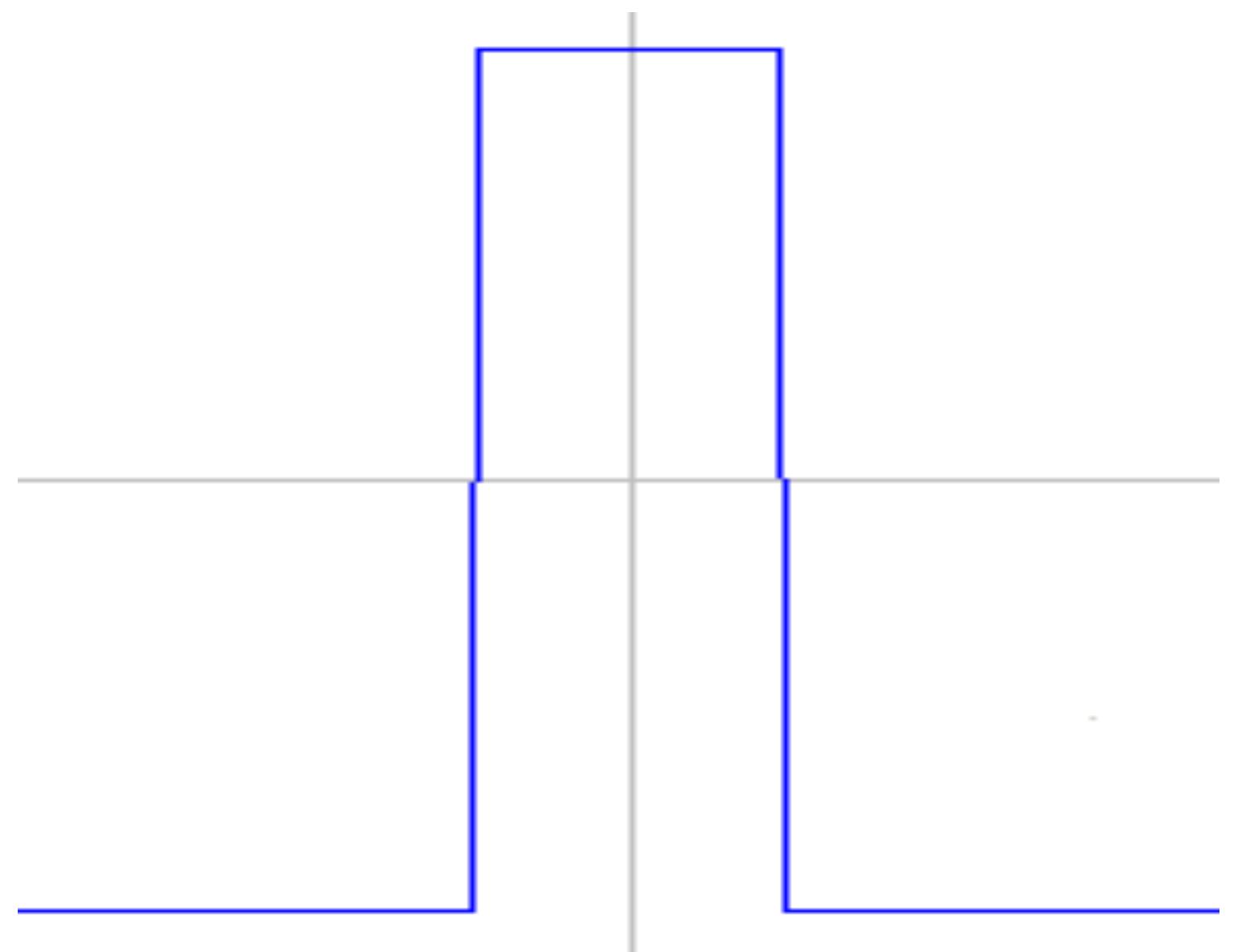
$$A \sin(2\pi fT + \phi) \quad \text{← phase component}$$

```
for i in range(sample_len):  
    sine_samples[i] = A * np.sin(2 * np.pi * freq * T[i])
```



FREQUENCY DOMAIN ANALYSIS

- If you sum an infinite number of weighted sine and cosine waves, you can recreate any complex waveform, such as: human speech, car horn, siren, music, urban soundscapes, etc., etc., etc...



$$a_0 + a_1 \cos(x)$$

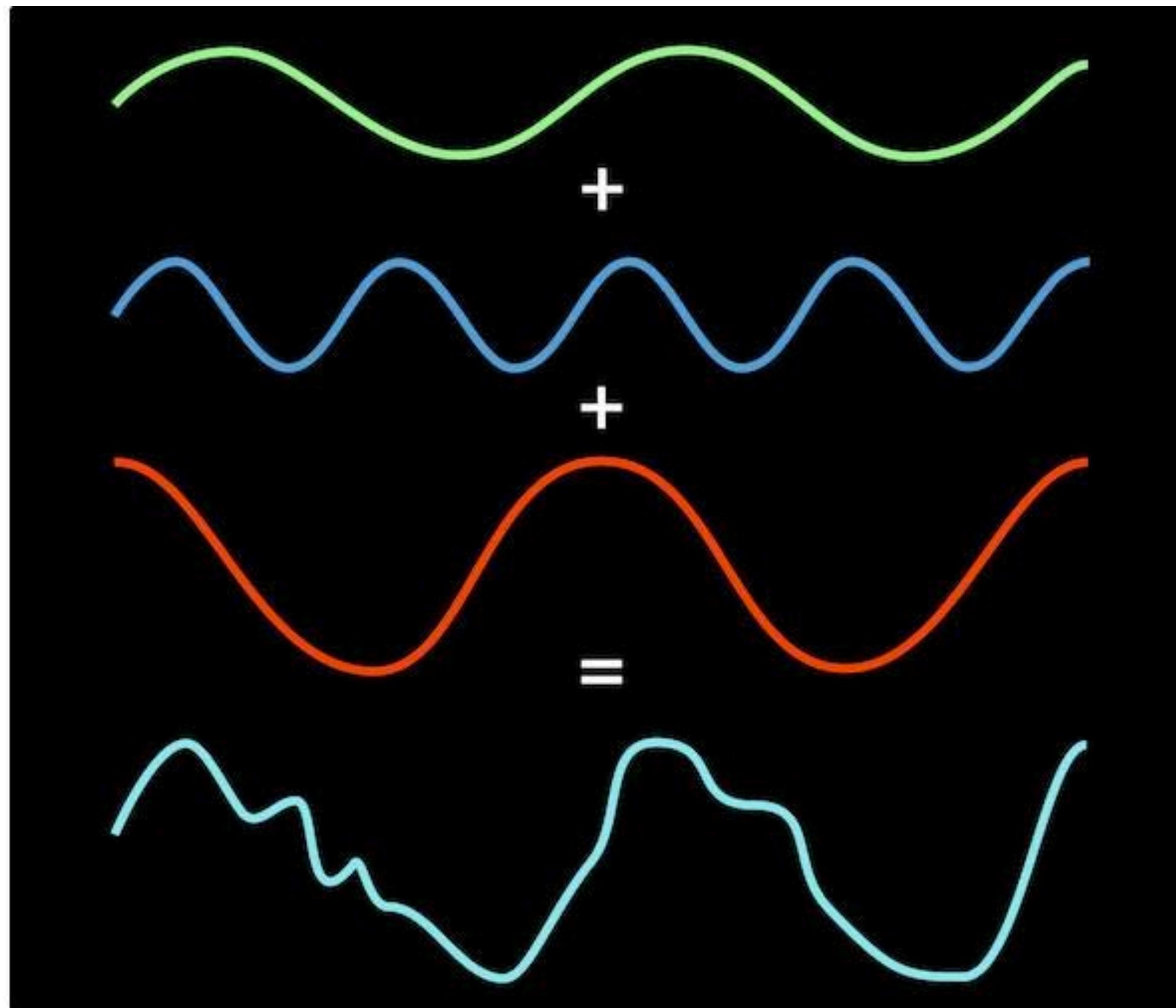
$$\dots + a_2 \cos(2x)$$

$$\dots + a_3 \cos(3x)$$

$$\dots + a_n \cos(nx) + \dots$$

FREQUENCY DOMAIN ANALYSIS

- ▶ The sound wave generated by a piano note may look complex, but it is simply a combination of a number of sine waves



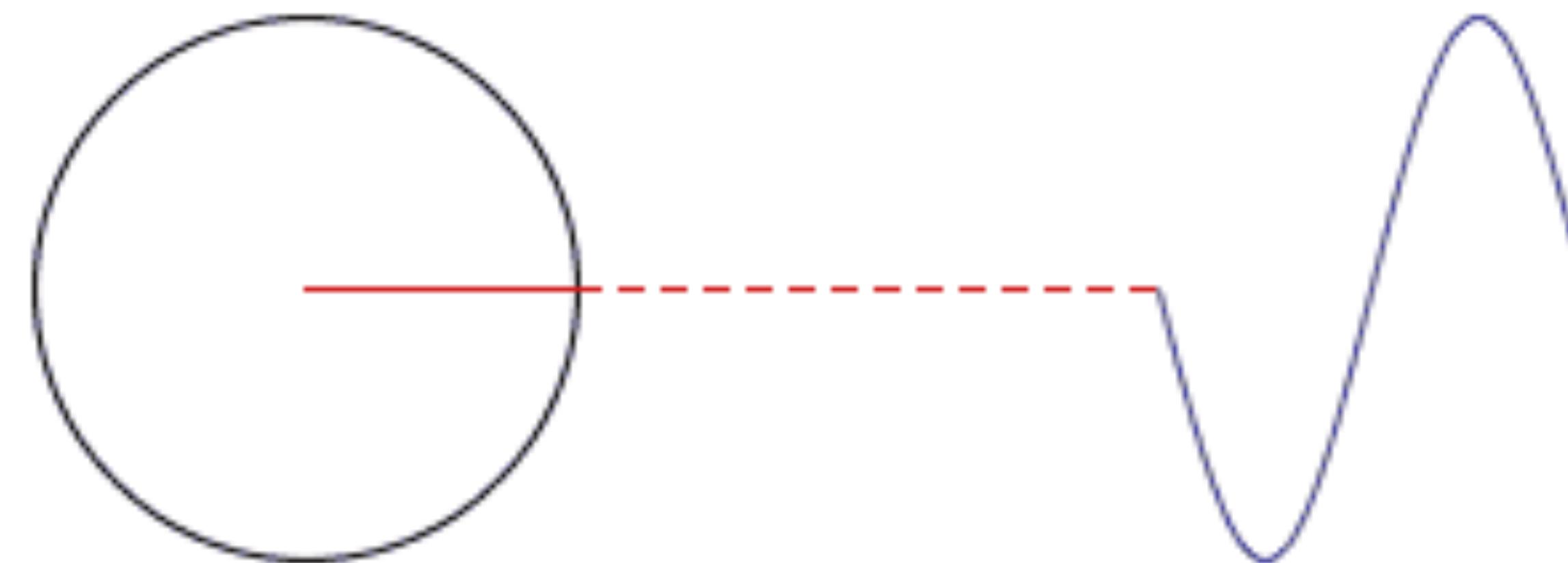
FREQUENCY DOMAIN ANALYSIS

- ▶ Take a look at this gif showing the decomposition (and Fourier transform) of a square wave:



FREQUENCY DOMAIN ANALYSIS

- ▶ Thought of in another way, the combination of simple sinusoids can be represented as a set of rotating circles of different sizes, where:
 - ▶ Its size = the sinusoids amplitude
 - ▶ Its rotational speed = the sinusoids frequency



WORKING WITH AUDIO

- ▶ Download the free audio software Audacity: audacityteam.org
- ▶ Have a go at recording some audio and inspecting it in the time domain...
- ▶ Now switch over to the frequency domain...