



# Multimedia Systems

# About the Lecturer



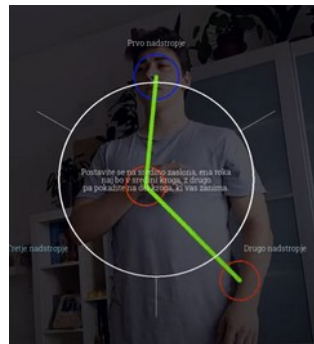
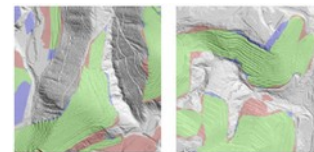
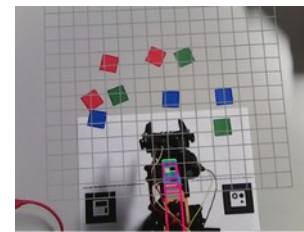
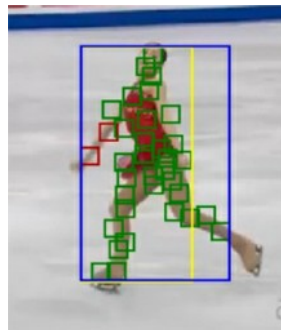
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# Course requirements

- **Laboratory exercises / project work - 50%**
  - Practical exercises - grading throughout semester
  - Single project – grading at the end of the semester
  - *Only valid for the current school year*
- **Exam (written + oral) -50%**
  - Must pass laboratory exercises to attend
  - Theoretical and practical assignments
  - Optional oral exam for borderline students (50% to ~65%)
  - Only oral exam for less than ~10 students

# Laboratory exercises

- Teaching assistant: **Me**
- Practical consolidation of selected topics
  - Python (Jupyter, SciKit, NumPy, ...)
  - Hosted Jupyter instances at [lab.vicos.si](http://lab.vicos.si)
  - Local installation (virtualenv, Docker)
  - Google Colab
- Each exercise is due in two weeks (approximately)
  - Timely assignment hand-in encouraged
  - Labs = Presentation + Consultations + Defenses

# Project assignment

- Alternative to regular laboratory exercises
- In-depth project work on a selected topic
  - You have to pace your work yourself
  - Meetings can be arranged to discuss topic
- Work has to be finished by the end of semester
  - Presentation in classroom
  - Demonstration
  - Code hand-in

# Project topics

- Sketch-based Image Retrieval
- Image blending using deep learning
- Deep learning for compression



Contact me  
if you are interested!







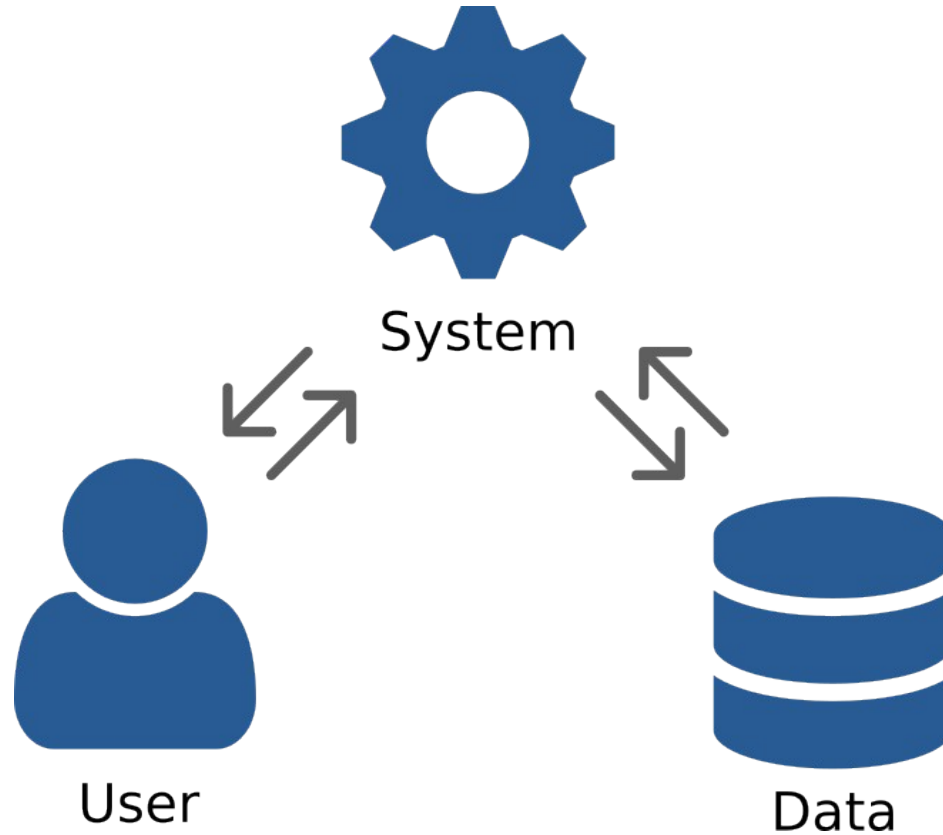
multimedia (*Latin*)  
multum + medium

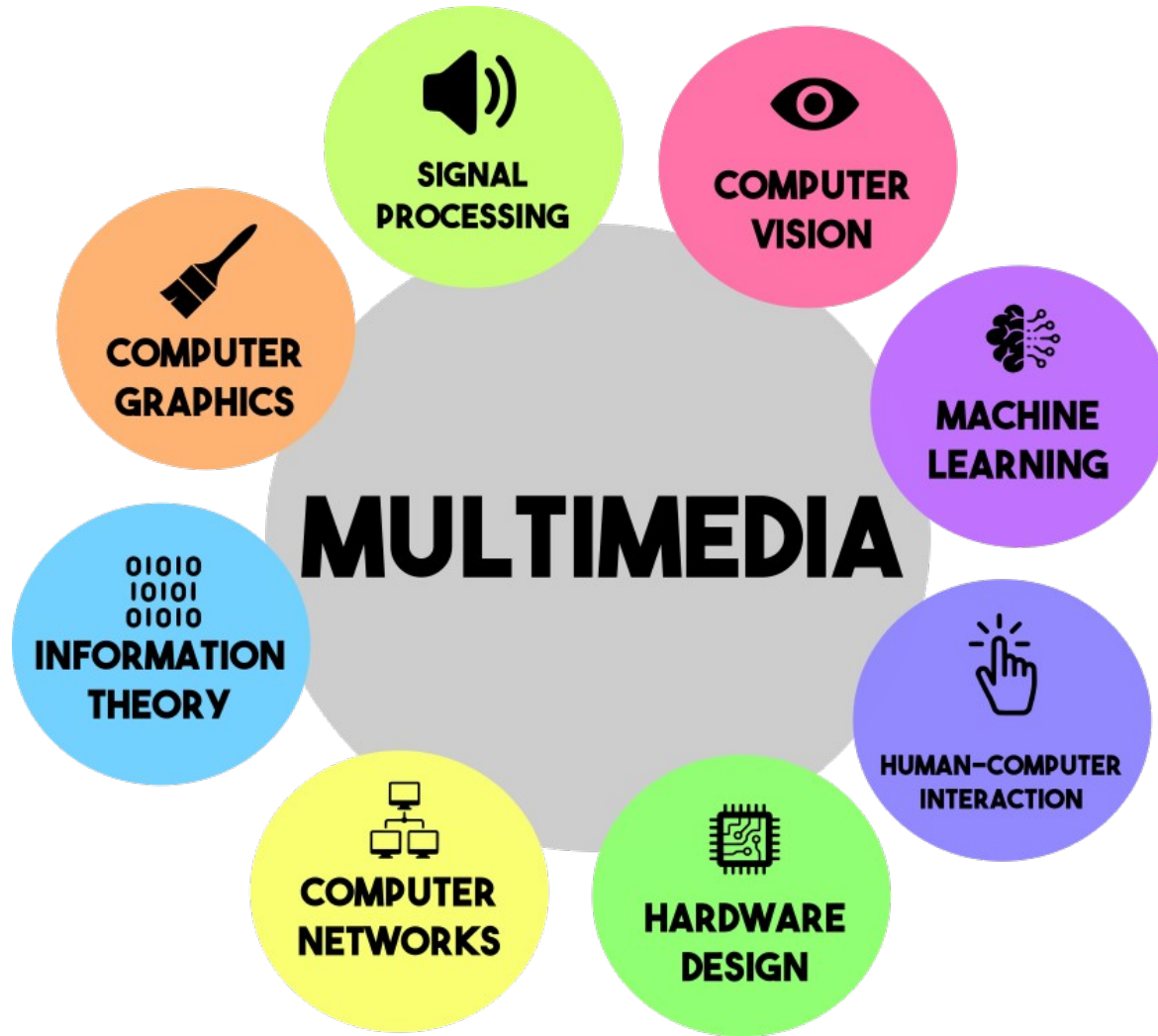
# Hypermedia

- Ted Nelson (~1965): HyperText
  - Book: linear medium
  - HyperText: non-linear (interactive)
- Hypermedia: not only text
  - Form of multimedia application
  - WWW – type of hypermedia application



# Multimedia Systems





# Application domains

- Digital television, video on demand (video + sound)
- Computer games (graphics + sound + interactivity)
- Teleconferences (video + sound)
- Remote lectures (video + sound + slides)
- Telemedicine (video + sound + haptic + manipulation)
- Large databases (e.g. Google, YouTube, Facebook, Amazon, Dropbox)
- Extended reality
- Data visualization (image + sound + interactivity)

# Research challenges

- **Processing**

Content analysis, information retrieval, enhancement, etc.

- **Storage, transmission**

Quality of service, compression, security, IO devices, etc.

- **Tools, applications, methods**

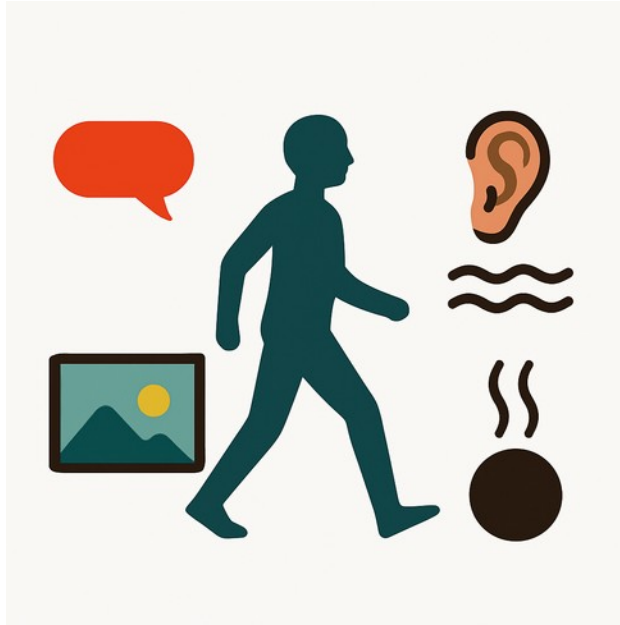
Content manipulation, user interfaces, multi-modal interaction, content production systems, collaboration systems, etc.

# Lectures overview

- Human Perception
- Signal Processing
- Multimedia Compression
- Information Retrieval
- Storage and Networking
- Hardware and Emerging Technologies

# Supporting Literature

- Slides + lecture notes available at online Classroom (Učilnica)
- Li Ze-Nian, M. S. Drew, Fundamentals of Multimedia, 2010 - *overview, general topics*
- C. D. Manning, P. Raghavan, H. Schütze, Introduction to Information Retrieval, Cambridge University Press. 2008. - *information retrieval concepts*
- Gonzalez and Woods: Digital Image Processing
- J. O. Smith III, Introduction to Digital Filters

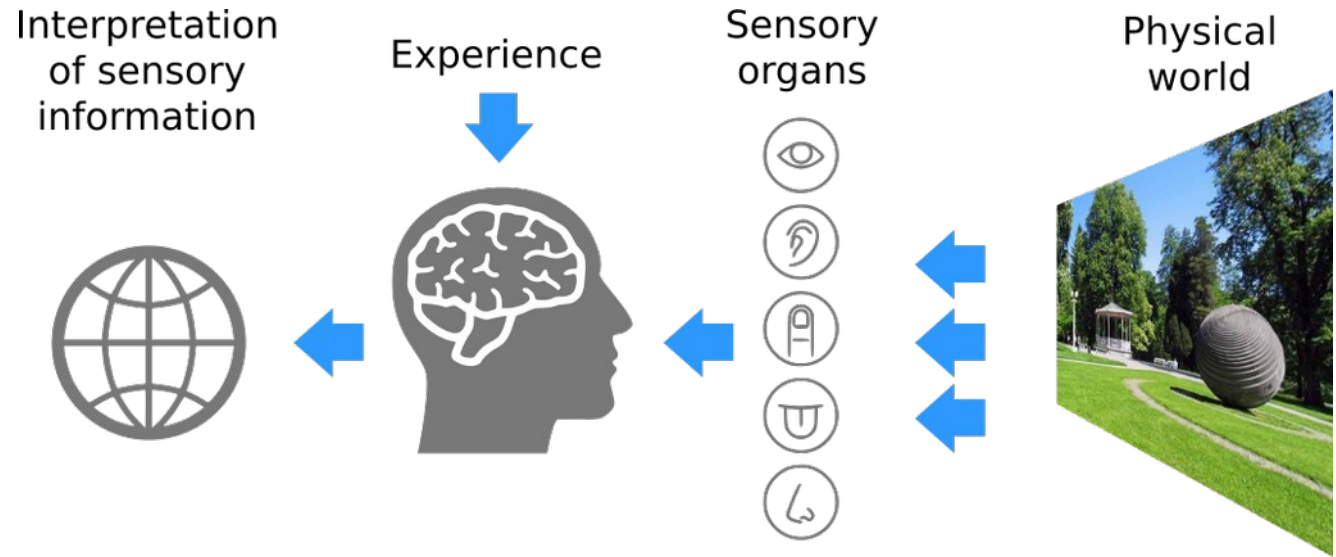


# Humans and Multimedia

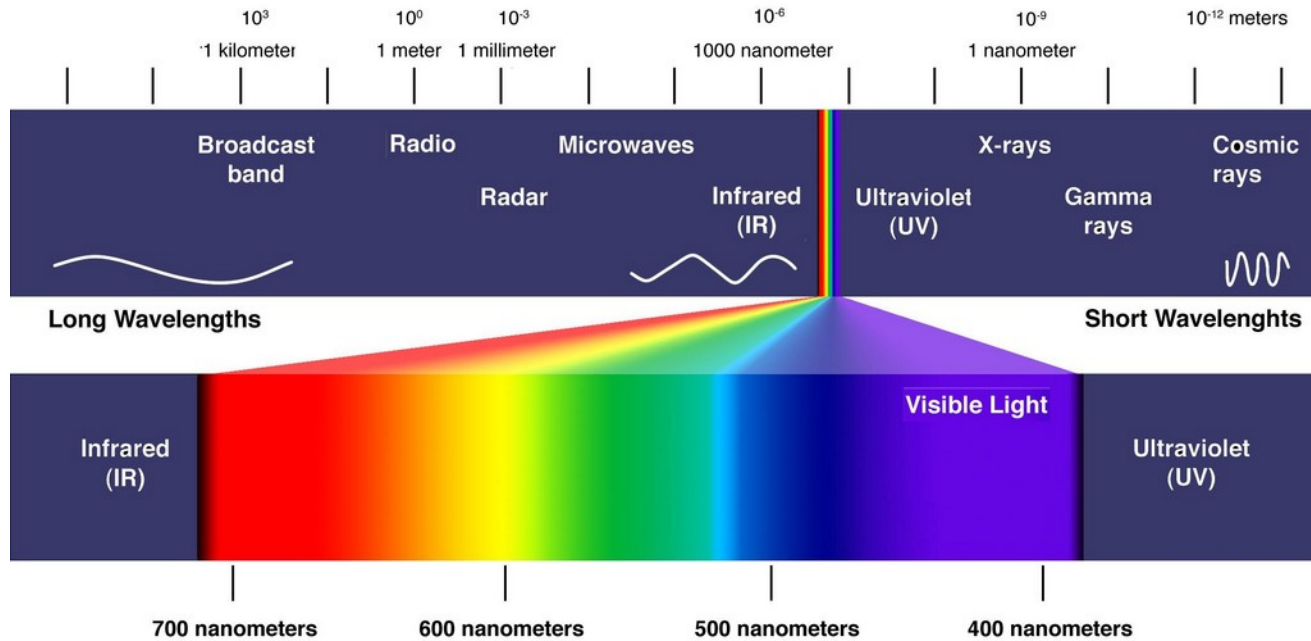


# Human Perception

- Reality is subjective
  - Sight
  - Hearing
  - Haptics
  - Chemical
  - Balance



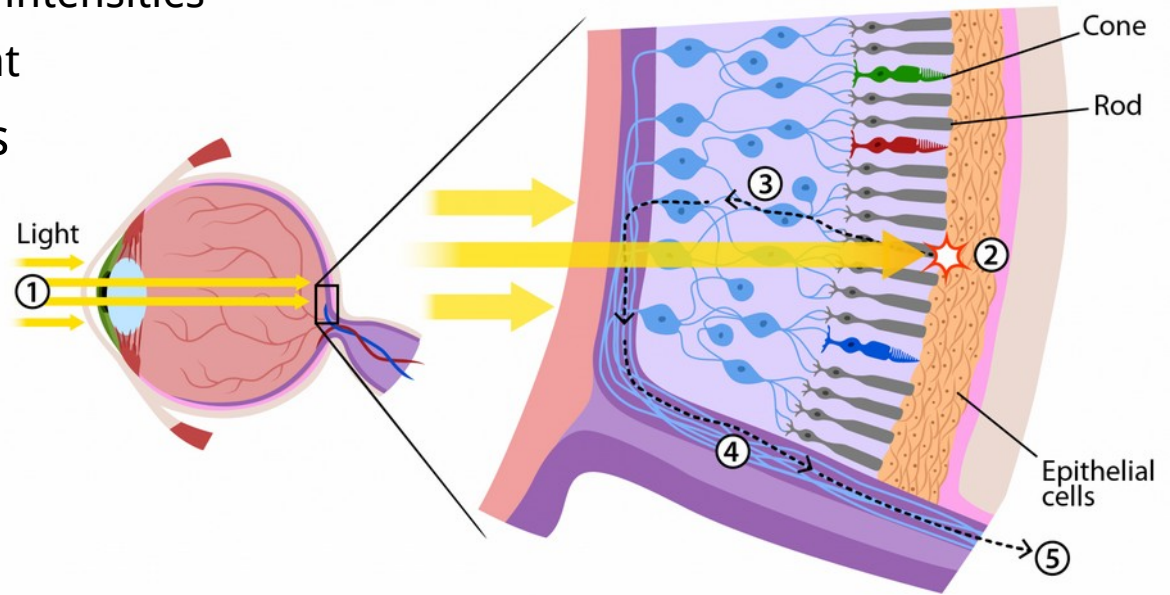
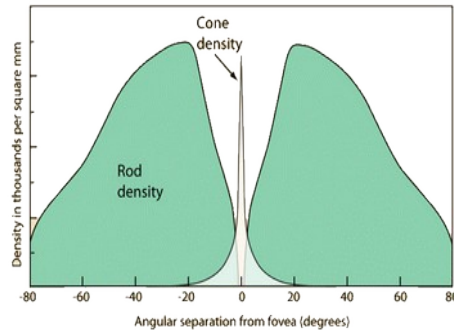
# About Light



- Light is electromagnetic waves / particles (photons)
- Visible light is light with wavelength from ~400nm to ~700nm

# Perceiving Light

- Eye perceives light that falls on the retina
- Retina is composed of two types of cells
  - Cones - Sensitive to color and large intensities
  - Rods - Sensitive to low intensity light
- There are more rods than cones
- Not uniform distribution



# Why are we Trichromatic?

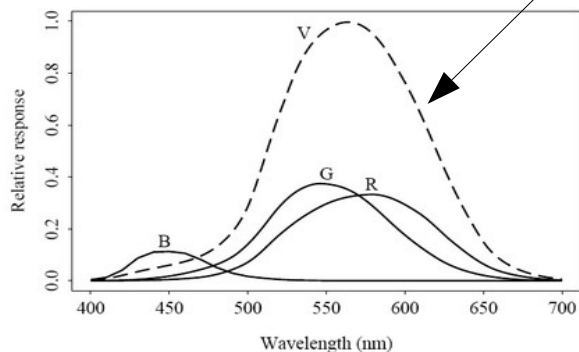
- Young-Helmholtz theory (19th century)
- Three types/lengths of cones
  - Different wavelengths (R=L, G=M, B=H)
- It is not yet entirely clear how brain combines color information
  - Ganglion trigger to differences R-G, G-B, B-R (opponent theory)
- All three channels are combined into achromatic information

# Spectral Sensitivity of the Eye

- Eye is most sensitive to the middle of visible spectrum
- Cone distribution approximately R:G:B == 40:20:1 (varies from human to human)
- Rods are more sensitive to wavelengths closer to the red part of the spectrum.

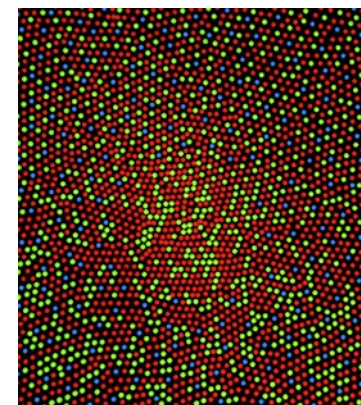
## Cones sensitivity

The curve for blue is not plotted on the correct scale, it is much lower than the curve for red or green.



## Rods sensitivity

Sensitivity of rods is similar to the overall sensitivity curve V for cones, it is only shifted towards the red spectrum.



Cone distribution

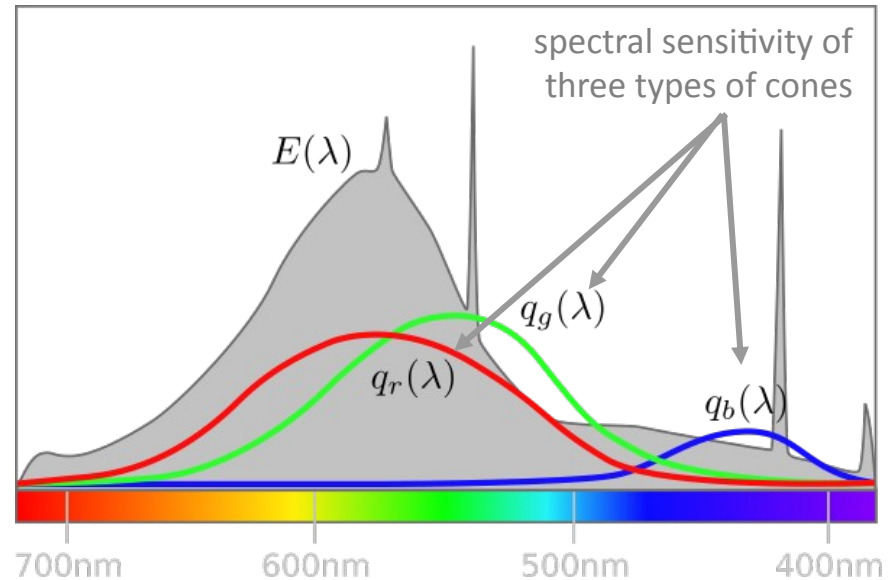
# Cones Sensitivity

- Cones are triggered with different intensity with respect to the light's wavelength
- Filtering color spectrum  $E(\lambda)$

$$R = \int E(\lambda) q_r(\lambda) d\lambda$$

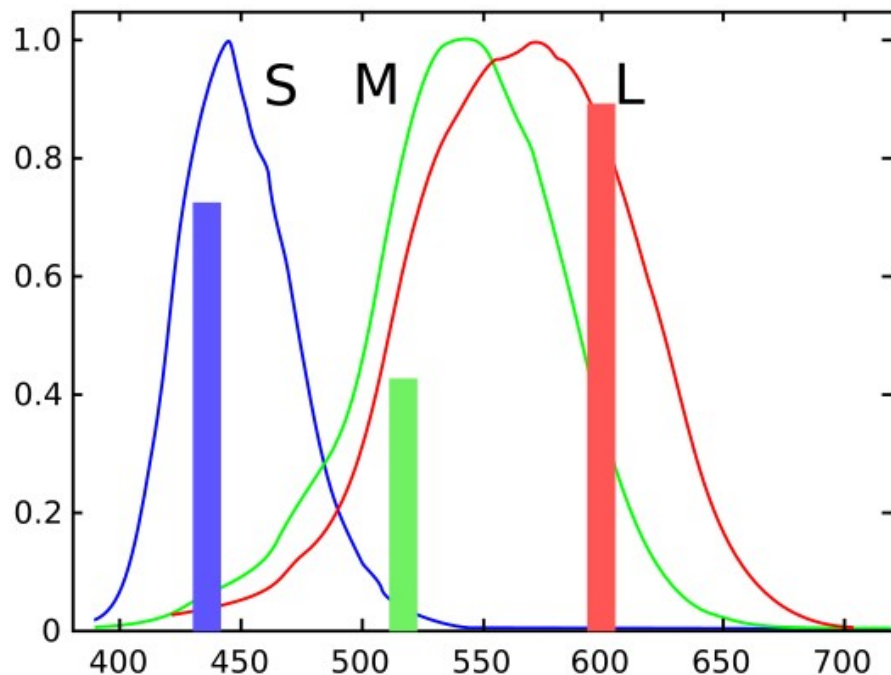
$$G = \int E(\lambda) q_g(\lambda) d\lambda$$

$$B = \int E(\lambda) q_b(\lambda) d\lambda$$



# Simulating Color

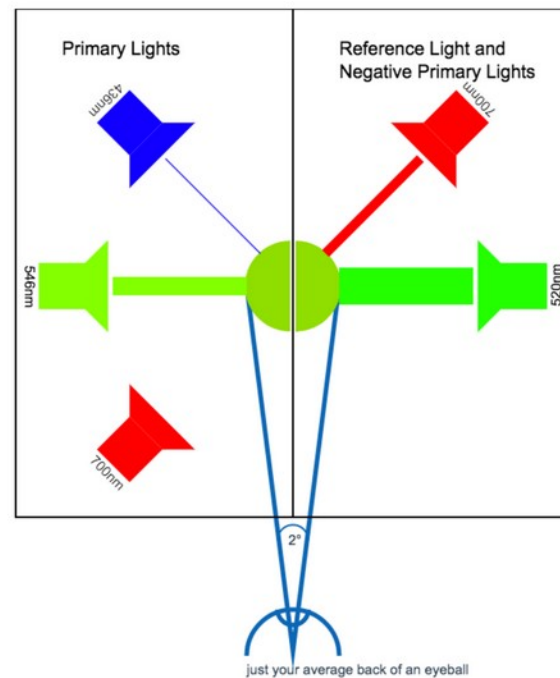
- Stimulating cone cells
- Metamerism
- Color primaries
  - Trichromatic (3+)
  - Different standards



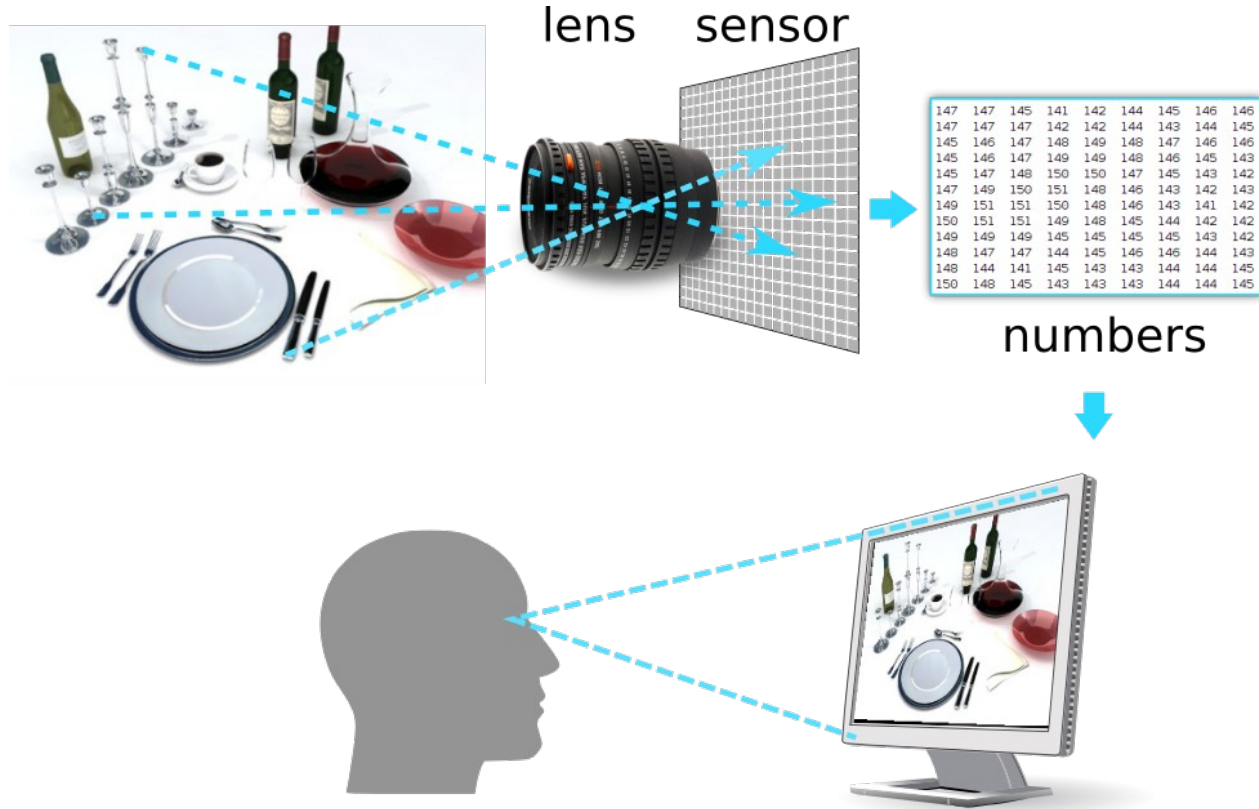


# Measuring color perception

- Color reproduction evaluation
- Quantitative evaluation in terms of human perception
- The tristimulus colorimeter experiment
  - Matching reference color
  - A person is controlling the intensity of three color channels
  - Standard observer (field-of-view)
  - Negative light



# World, image, eye



# About Sound

- Wave of pressure in medium
  - Particles repeatedly compressed and expanded
  - Longitudinal waves
  - Requires medium (air, water)
  - Electronic representation - audio
- Wave phenomenon
  - Reflection – bouncing
  - Refraction – angle change when entering different medium
  - Diffraction – bending around obstacle

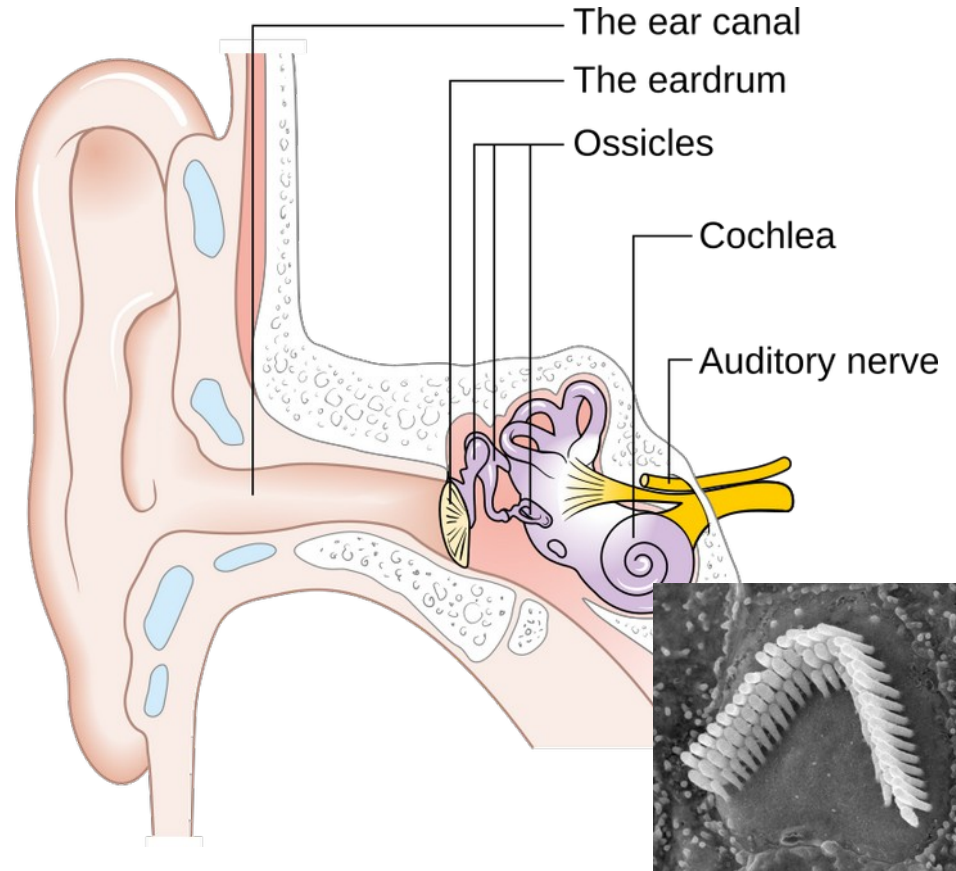
# Measurable Sound Characteristics

- Frequency (Hz)
  - Number of occurrences of a repeating event per unit of time
- Amplitude, pressure, intensity ( $\text{W/m}^2$ )
  - Amount of change over a period
- Duration (seconds)
- Direction
- Speed
  - Speed based on medium
  - Air:  $\sim 331 \text{ m/s}$



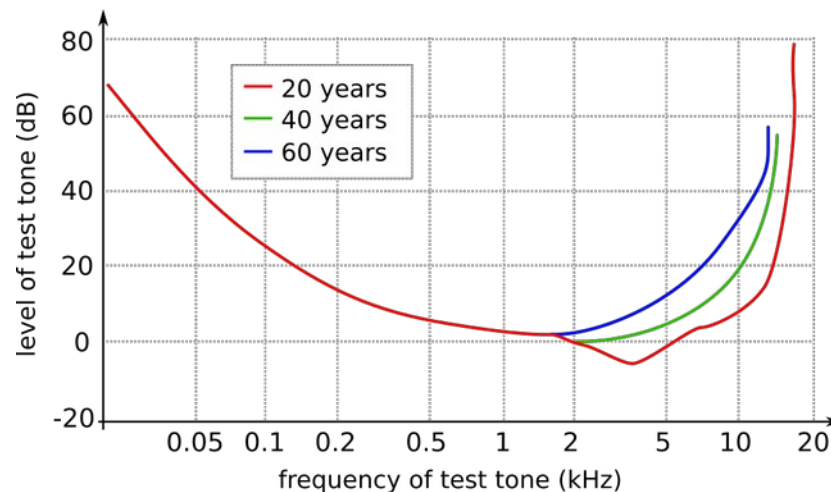
# Human auditory perception

- Sound travels the ear canal to the eardrum that vibrates
- Ossicles amplify the vibration
- Cochlea contains liquid that vibrates
- Liquid shakes hair cells
- Hair cells are sensitive to different frequencies
- Responses are transmitted via auditory nerve



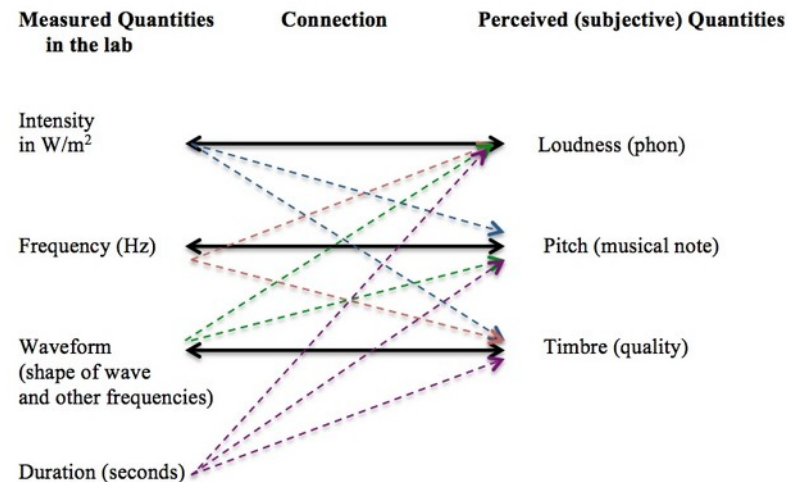
# Human ear sensitivity

- Frequencies between 20Hz and 20kHz
  - Some have to be louder than other
- Threshold of hearing
  - Amplitude where a pure tone is detected with 50% accuracy



# Perception of sound

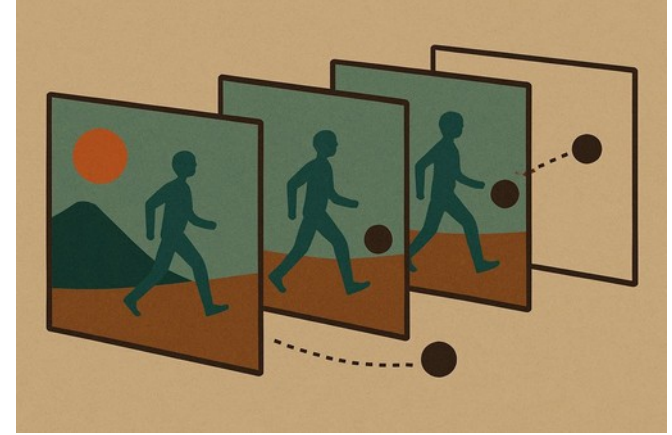
- Pitch (low/high)
- Loudness (loud/soft)
- Timbre, tone color
  - Combination of multiple frequencies
  - Change over time
- Sonic texture
  - Multiple sources
  - Unison, polyphony, homophony, cacophony
- Spatial location





# Sensing in Space and Time

- Sight
  - Changing scene
  - Temporal resolution
  - Integration of motion
- Hearing
  - Spatial sound
  - Echolocation



# Video Temporal Resolution

- Human perception system (eye+brain) can perceive about 10 - 12 images per second as separate images.
- Persistence of vision
  - Image „remains“ in cortex for  $1/25s$
  - Neuron saturation



# Sight and Hearing Characteristics

	Sight	Hearing
Spatial	Fovea density: ~150,000 cones/mm <sup>2</sup> 1 m distance = about 0.3 mm detail	Horizontal (azimuth): ~1–2° Vertical (elevation): ~10°–15° Poor distance perception
Temporal	Photopic (well-lit) conditions 50–60 Hz	Sensitive to fine temporal structure Range: 20 Hz – 20 kHz Discrimination ~2 Hz at 1 kHz

# Touch

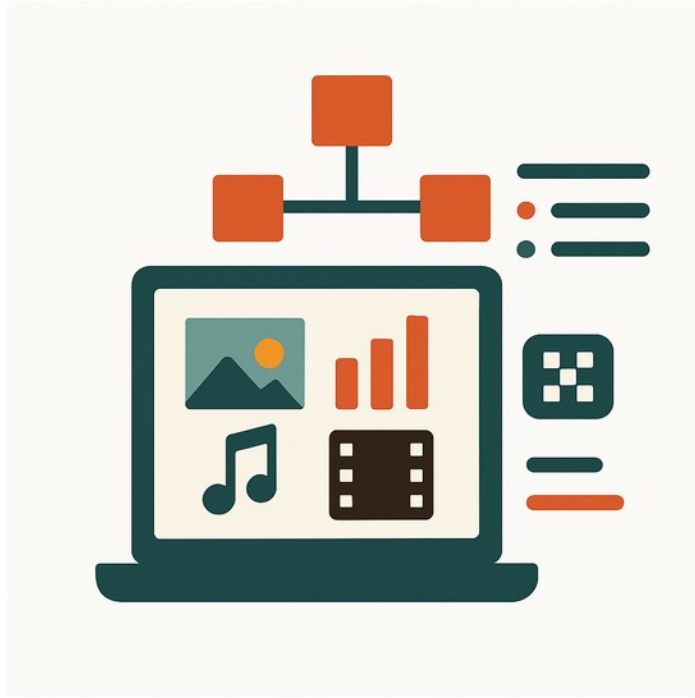
- Pressure, vibration, texture, and temperature
  - Mobile and Wearable computing (e.g., touchscreens, VR controllers, haptic feedback in phones).
  - Research challenges: realism of tactile rendering, latency, and multi-point contact.

# Taste and Smell

- Chemical senses
- Rarer in multimedia, but experimental systems exist (digital scent displays, olfactory VR).
- Smell is strongly linked with memory and emotion, which makes it powerful for immersion.
- Currently confined to research labs or niche entertainment.

# Balance and Proprioception

- Balance
  - Inner ear detects acceleration, rotation, and spatial orientation
  - Mismatches between visual input and vestibular signals cause motion sickness in AR/VR
- Proprioception
  - Awareness of limb position and movement, even without vision
  - Important in VR and motion capture; haptic suits and exoskeletons attempt to stimulate it.



# Representations and Multimedia



# Representations

- A structured way of describing real-world information so it can be stored, processed, or transmitted
- Emphasizes some aspects, ignores others
- Describe a city
  - A map
  - A photograph
  - GPS coordinates

# Mathematical Formulation

- Vector of values
  - Encoding data properties
  - Embedding – special case (structured space)
- Task dependent
  - Select the right representation
  - General vs. specialized
  - What to describe?



# Levels of Abstraction

Type	Image	Audio	Video
Low	Pixel	Waveform	Pixels
	Edges	Spectrogram	Flow
	Shapes	Phonemes	Correspondences
	Object	Words	Objects
High	Scene	Meaning	Actions

# Examples of Representations

- Image
  - Histogram, average color
  - Objects, relationships
- Video
  - Sequence of images
  - Trajectories
  - Semantic Actions
- Audio
  - Waveform
  - Spectrogram
  - Generator parameters
- Text
  - Word frequency
  - Intention

# Representations in Machine Learning

- Learning suitable representations automatically
- Deep learning
  - Layers of increasingly abstract features / representations
  - Embedding / latent space
- Use cases
  - Transformations, generation
  - Retrieval
  - Summarization, understanding

# Summary

- Multimedia exists to communicate with our senses
  - Perceive the world – encode with representations
  - Decode representations – stimulate senses
- Understanding perception + representation helps us design systems that are:
  - More efficient
  - More natural to use
  - More immersive