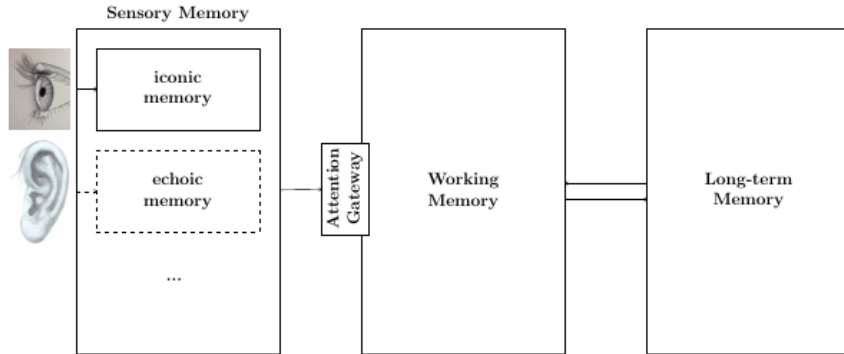


# Biological Vision and Applications

## Module 06-07: Long Term Memory

Hiranmay Ghosh

# Memory pipeline



# Long-term and short-term memory

- Short-term memory (STM)
  - ▶ Stores sensory information, current context (internal)
  - ▶ Can recall data from Long term memory
  - ▶ Used for deliberation
- Long-term memory (LTM)
  - ▶ Stores information for a longer term
    - ▶ ... indefinitely ?
  - ▶ Stores knowledge, experience
  - ▶ Unlimited capacity
    - ▶ Accessibility (recall) can be a constraint

# Long-term memory (LTM)

- **Declarative Memory (Explicit):** *What*
  - ▶ Stores declarative (explicit) form of knowledge
  - ▶ Recalled consciously and reasoned with
    - ▶ A banana is yellow
    - ▶ An apple is round
    - ▶ Sampled marbles in bag no. 1 are all blue
- **Procedural Memory (Implicit):** *How*
  - ▶ Stores the (implicit) knowledge about how to solve a problem
    - ▶ A machine learned image classifier
  - ▶ Knowledge is not recalled consciously – cannot be explicitly described

# Declarative Memory

- Semantic:
  - ▶ General facts that universally hold good
    - ▶ A banana is yellow
  - ▶ Independent of personal experience
- Episodic:
  - ▶ Memory of previous experiences, including
    - ▶ context (time, place, associated events, emotions)
  - ▶ Can be recalled after it has happened
    - ▶ Sampled marbles in bag no. 1 are all blue
- Episodic knowledge may be abstracted to Semantic knowledge
  - ▶ All marbles in bag no. 1 are blue
  - ▶ All bags contain marbles of same color

# Retention in Long-term Memory

Is LTM “permanent”?

- Sometimes we fail to recall experience / knowledge
  - ▶ Decay in episodic memory (permanent)
  - ▶ Retrieval failure (temporary – some time, can recover with cues)
- Decay
  - ▶ We generally tend to remember experiences that evoke extreme emotions longer
    - ▶ ... Not always true
  - ▶ LSTM is an attempt to implement selective retention of episodic memory
  - ▶ Modeling decay in semantic memory is even more complex
- Retrieval failure – difficult to model

# Associative Memory

A class of Episodic Memory

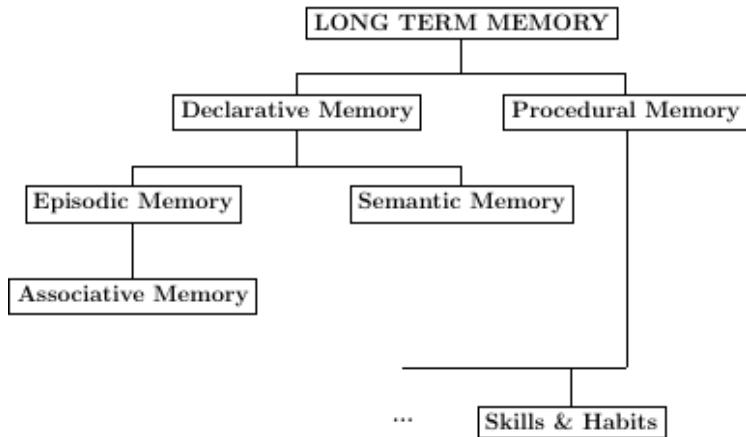
- Particularly useful for sensory perceptions
- Associates entities (e.g. objects) with sensory properties (e.g. shape, color, ...)
- The object can be quickly recalled from the perception
- Also known as Content Addressable Memory (CAM)
- Why is associative memory episodic (not semantic)?

# Procedural Memory

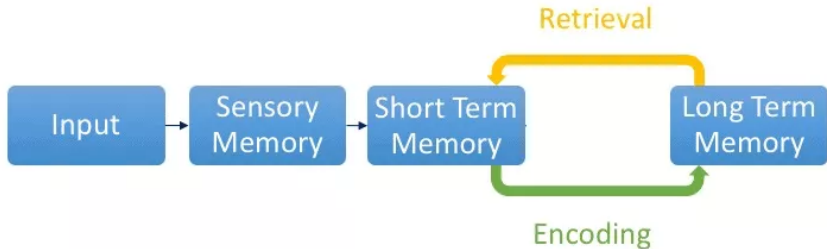
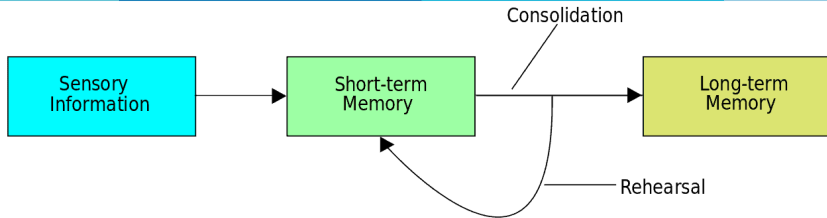
- Can be hold various types of procedural information
  - ▶ Skills and habits (how-to's)
    - ▶ Example: How to recognize an object
    - ▶ Implemented as a classifier (black-box)
    - ▶ Done this way by an agent ... could be done in a different way too
  - ▶ ...



# Long-term Memory



# STM and LTM



Quiz 06-07

End of Module 06-07