

# Biological Vision and Applications

## Module 07-01: Knowledge Representation

Hiranmay Ghosh

# Knowledge required for visual interpretation

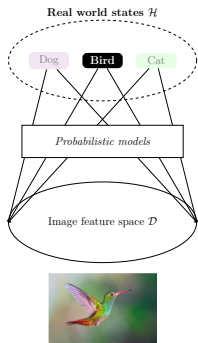
## Explicit and implicit knowledge



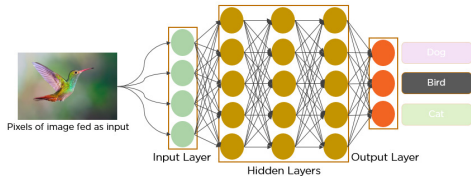
- Domain Knowledge (Ontology)
  - ▶ Example: What makes a lesion different ?
  - ▶ **Declarative**: can be stated explicitly
  - ▶ Exists independent of processing structure
  - ▶ can be shared
- Knowledge about (image) processing
  - ▶ Example: How to extract the edges from an image?
  - ▶ **Procedural**: implicit
  - ▶ Encoded as algorithms, neural networks, etc.
  - ▶ Strictly private to the processing structure
- The relation between the two
  - ▶ How to use them together in a problem

# Dual representation of knowledge

Same knowledge can be represented either in declarative or in procedural way

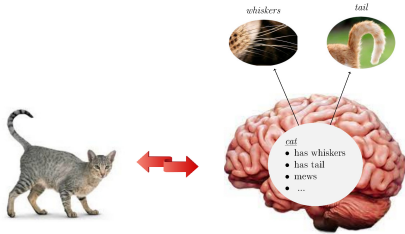


**Declarative**  
Model based approach



**Procedural**  
Data driven approach

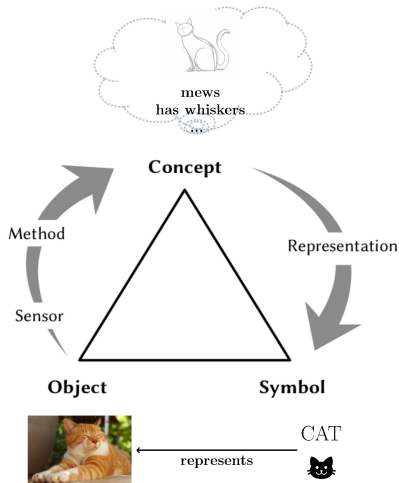
# Representational Theory of Mind (RTM)



- A **concept** is a mental model of something
  - ▶ A real-world thing
  - ▶ An internal mental state of the agent
- A name is associated with a concept
  - ▶ For reference while manipulation
- Knowledge is
  - ▶ A collection of named concepts
  - ▶ A set of sentences (propositions) that relate the concepts
    - ▶ **Named concepts:** cat, tail
    - ▶ **Proposition:** A cat has a tail

# Symbolic representation

## The semiotics triangle



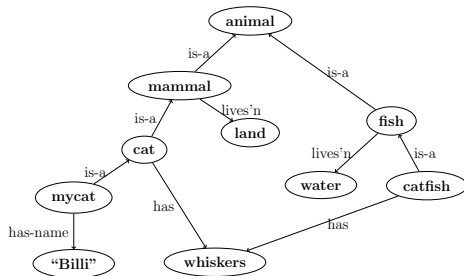
- **Objects** (things): That exist
- **Concepts**: Mental representations (models)
- **Representation**: Symbol to represent a concept (text, icon, speech)

# Semantic Network

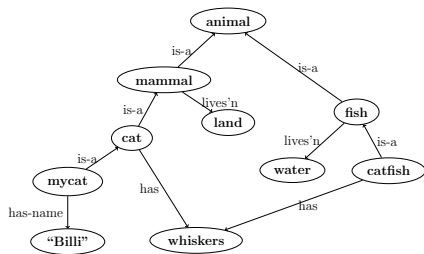
## Compact knowledge representation

- Knowledge is a set of statements
  - ▶ A mammal is an animal
  - ▶ A cat is a mammal
  - ▶ A cat has whiskers
  - ▶ A mammal lives on land
  - ▶ A fish is an animal
  - ▶ A catfish is a fish
  - ▶ A catfish has whiskers
  - ▶ A fish lives in water
  - ▶ Mycat is a cat
  - ▶ Mycat has a name "Billi"

- Equivalently, knowledge is a graph  
(semantic network)



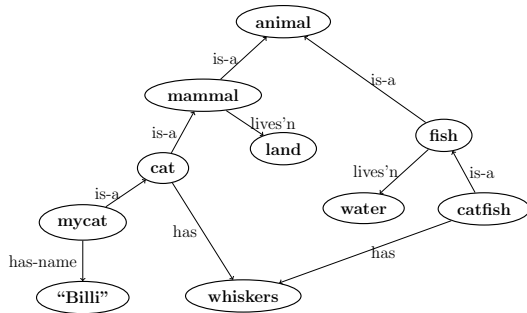
# Semantics of “Semantic Network”



- A set of propositions
  - ▶ Each describes a property of a concept
- Structure:  $\langle \textit{subject}, \textit{predicate}, \textit{object} \rangle$ 
  - ▶ Examples:
    - ▶ cat has whiskers
    - ▶ mycat has-name “Billi”
- A concept can be a class, or an instance
  - ▶ Example: cat, mycat
- A value can be a concept, or a literal
  - ▶ Example: whiskers, “Billi”

# Reasoning with Semantic Network

Axioms lead to semantics

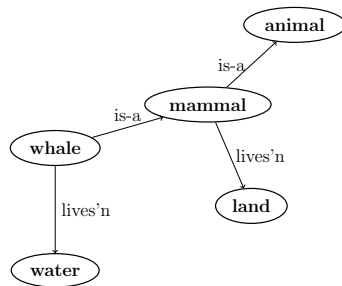


- Requires underlying axioms, e.g.
  - ▶ Property inheritance
    - ▶ If  $a$  “is-a”  $b$ , then  $a$  inherits properties of  $b$
  - ▶ “is-a” is transitive
    - ▶ If  $a$  is-a  $b$ , and  $b$  is-a  $c$ , then  $a$  is a  $c$  too
  - ▶ These axioms make a semantic network efficient (compact)
  - ▶ There can be other domain-specific rules

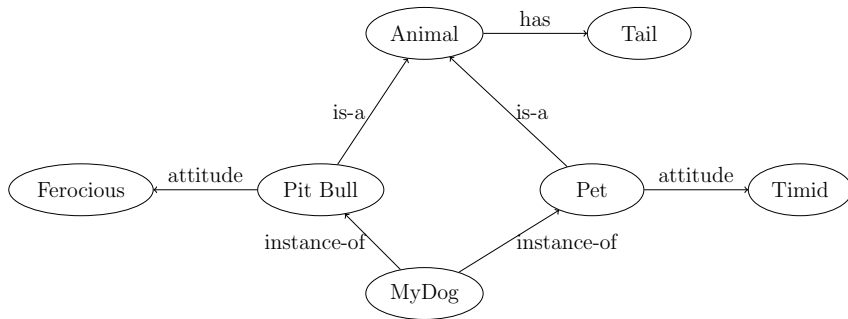


# Flexibility with “Semantic Network”

- No restrictions on properties / values to be associated to a concept
- There can be exceptions. e.g.
  - ▶ Whale is a mammal, but lives in water
- Axioms need to be redefined
  - ▶ If  $a$  “is-a”  $b$ , then  
 $a$  inherits properties of  $b$   
unless overruled



# Multiple inheritance



MyDog has a tail

What's about MyDog's attitude ?

# Properties of Semantic Network

- A semantic network is extremely flexible
  - ▶ An informal description of a domain (in it's basic form)
- Semantics is imposed with axioms / constraints
- Many variants have been proposed
  - ▶ Definitional network
    - ▶ Expresses class-subclass relations
    - ▶ ... and properties that distinguish sibling subclasses
    - ▶ *Cat is-a mammal; cat has whiskers*
  - ▶ Implication Network
    - ▶ Expresses causal relations
    - ▶ *Banana causes yellow color*
  - ▶ Hybrid networks combine more than one of paradigms

# Resource Description Framework (RDF)

W3C Recommendation – for representing interconnected data on the web

- Data (resources) can be distributed over the web
  - ▶ Knowledge is an interconnection (relations) of this distributed data
- Each resource is identified with a IRI
- Follows semantic network model
  - ▶ An RDF graph is a set of RDF sentences  $\langle \text{subject, predicate, object} \rangle$
- A predicate is also a “resource”
  - ▶ A predicate in one sentence can be a subject or an object in another
  - ▶  $\langle \text{hasWeightInKg, is-a, healthParameter} \rangle$ .  $\langle \text{Ramu, hasWeightInKg, 80} \rangle$
- **Reification**: A statement is also a “resource”
  - ▶ I said “cat is an animal”
  - ▶ S1:  $\langle \text{cat, is-a, animal} \rangle$ . S2:  $\langle \text{I, said, S1} \rangle$
- Some axioms are inbuilt – additional semantics can be defined with RDF Schema
- Notations: XML, N3, Turtle, ...

# SPARQL Query Language

- To make query on RDF Graphs
- Syntactically similar to SQL
- Implemented with “triple-store” databases
  - ▶ [Apache Jena / TDB](#)
  - ▶ Optimized for storing triplets
- Query on distributed knowledge
  - ▶ Distributed knowledge centrally indexed
  - ▶ Distributed query processing (distributed index)
- Resources:
  - ▶ [W3School tutorials](#)
  - ▶ [W3C Documents](#)

Quiz 07-01

End of Module 07-01