

# Artificial Intelligence<sup>1</sup>

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Knowledge Engineering

Knowledge engineering

- **Knowledge engineering** deals with the process of knowledge-base construction.
- A **knowledge engineer** is someone who:
  - **investigates** a particular domain
    - How the things work?
    - This is usually done in co-operation with a problem expert.
  - **learns** what **concepts** are important in that domain
    - Which will be the queries asked and what do we need to find answers?
  - **creates a formal representation** of the objects and relations in the domain
    - How to encode facts and axioms so the computer can do inference?



Knowledge-engineering process

## 1. identify the task

- What is the range of questions?
- Wumpus: action selection or asking about the contents of the environment?

## 2. assemble the relevant knowledge (knowledge acquisition)

- How does the domain actually work?
- Wumpus: what does it mean to feel stench and breeze?

## 3. decide on a vocabulary of predicates, functions, and constants

- How to translate domain-level concepts to logic-level names?
- Wumpus: is a pit an object or a function of the square?
- The result is an **ontology** of the domain (vocabulary of notions).

## 4. encode general knowledge about the domain

- Which axioms hold in the domain?
- Wumpus: breeze means a pit in the neighbourhood square

## 5. encode a description of the specific problem instance

- What is the current state of the world?
- Wumpus: the agent is at square (1,1) looking to the right

## 6. pose queries to the inference procedure and get answers

- How does the inference procedure operate on our KB?
- Wumpus: is cell (2,2) really safe?

## 7. debug the knowledge base

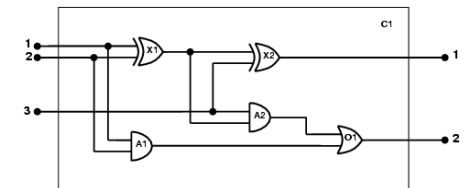
- What is missing in the knowledge base?
- Wumpus: there is a single wumpus in the cave



KE process: identify the task

## Digital circuits

- 1 and 2 are input bits, 3 is a carry bit
- 1 is output bit for sum, 2 is output bit for carry

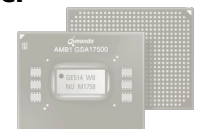


## What is important in the domain?

- Does the circuits add properly?
- If the inputs are known, what is the output?
- If desired output is given, what should be the input?

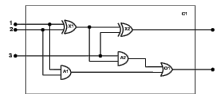
## Different queries may require different knowledge!

- What is cost of the circuit?
- What is the size of circuit?
- How much energy does the circuit consume?



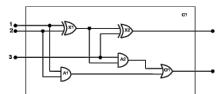
## What do we know about digital circuits?

- circuits are composed from wires and gates
- signals 0 and 1 flow along wires
- signals flow to the input terminals of gates
- each gate produces signal on the output terminal
- there are four types of gates: AND, OR, XOR, NOT
- circuits have input and output terminals
- wires are used just as connections between terminals
- signal delay, energy consumption, shape of gates are not assumed



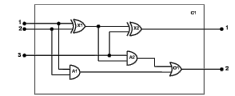
## KE example: general knowledge

- **If two terminals are connected, then they have the same signal.**
  - $\forall t_1, t_2 \text{ Connected}(t_1, t_2) \Rightarrow \text{Signal}(t_1) = \text{Signal}(t_2)$
- **The signal at every terminal is either 1 or 0.**
  - $\forall t \text{ Signal}(t) = 1 \vee \text{Signal}(t) = 0$
  - $1 \neq 0$
- **Connected predicate is commutative.**
  - $\forall t_1, t_2 \text{ Connected}(t_1, t_2) \Rightarrow \text{Connected}(t_2, t_1)$
- **The gate behaviour is determined by its type.**
  - $\forall g \text{ Type}(g) = \text{OR} \Rightarrow \text{Signal}(\text{Out}(1, g)) = 1 \Leftrightarrow \exists n \text{ Signal}(\text{In}(n, g)) = 1$
  - $\forall g \text{ Type}(g) = \text{AND} \Rightarrow \text{Signal}(\text{Out}(1, g)) = 0 \Leftrightarrow \exists n \text{ Signal}(\text{In}(n, g)) = 0$
  - $\forall g \text{ Type}(g) = \text{XOR} \Rightarrow \text{Signal}(\text{Out}(1, g)) = 1 \Leftrightarrow \text{Signal}(\text{In}(1, g)) \neq \text{Signal}(\text{In}(2, g))$
  - $\forall g \text{ Type}(g) = \text{NOT} \Rightarrow \text{Signal}(\text{Out}(1, g)) \neq \text{Signal}(\text{In}(1, g))$

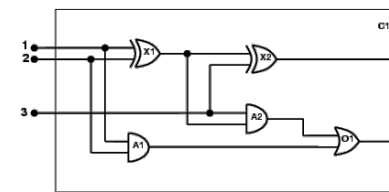


## What constants, predicates, and functions?

- we describe circuits, gates, terminals, signals, and gates
  - **gates** are denoted by constants  $X_1, X_2, A_1, \dots$
  - the behaviour of each **gate** is determined by its **type**
    - we will use constants AND, OR, XOR, NOT
    - **types of gates are described by functions**  $\text{Type}(X_1) = \text{XOR}$
    - We can also use predicates  $\text{Type}(X_1, \text{XOR})$  or  $\text{XOR}(X_1)$ 
      - Beware! We will also need axioms to describe uniqueness of the gate type.
  - **terminals** of gates can also be names by constants ( $X_1\text{In}_1, \dots$ ), but then we need to connect them to gates
    - it is better to use **functions**  $\text{In}(1, X_1), \dots$
  - **wires** can be described by **predicates**
    - **Connected**( $\text{Out}(1, X_1), \text{In}(1, X_2)$ ), ...
    - Beware! We connect the terminals not the gates.
  - **signals** at terminals are determined by a **function**
    - **Signal**( $g$ ) = 1



## KE process: specific problem instance



$\text{Type}(X_1) = \text{XOR}$   
 $\text{Type}(X_2) = \text{XOR}$   
 $\text{Type}(A_1) = \text{AND}$   
 $\text{Type}(A_2) = \text{AND}$   
 $\text{Type}(O_1) = \text{OR}$

$\text{Connected}(\text{Out}(1, X_1), \text{In}(1, X_2))$	$\text{Connected}(\text{In}(1, C_1), \text{In}(1, X_1))$
$\text{Connected}(\text{Out}(1, X_1), \text{In}(2, A_2))$	$\text{Connected}(\text{In}(1, C_1), \text{In}(1, A_1))$
$\text{Connected}(\text{Out}(1, A_2), \text{In}(1, O_1))$	$\text{Connected}(\text{In}(2, C_1), \text{In}(2, X_1))$
$\text{Connected}(\text{Out}(1, A_1), \text{In}(2, O_1))$	$\text{Connected}(\text{In}(2, C_1), \text{In}(2, A_1))$
$\text{Connected}(\text{Out}(1, X_2), \text{Out}(1, C_1))$	$\text{Connected}(\text{In}(3, C_1), \text{In}(2, X_2))$
$\text{Connected}(\text{Out}(1, O_1), \text{Out}(2, C_1))$	$\text{Connected}(\text{In}(3, C_1), \text{In}(1, A_2))$

**Query is a logical formula.**

- What combination of inputs would cause the sum output to be 0 and carry-bit output to be 1?
  - $\exists i_1, i_2, i_3 \text{ Signal(In}(1, C_1)) = i_1 \wedge \text{Signal(In}(2, C_1)) = i_2 \wedge \text{Signal(In}(3, C_1)) = i_3 \wedge \text{Signal(Out}(1, C_1)) = 0 \wedge \text{Signal(Out}(2, C_1)) = 1$

**Answer** is obtained as **substitutions of variables**  $i_1, i_2, i_3$ .

- $\{i_1/1, i_2/1, i_3/0\}, \{i_1/1, i_2/0, i_3/1\}, \{i_1/0, i_2/1, i_3/1\}$

**Debug the knowledge base**

- Some queries may give an unexpected (wrong) answer that indicates a problem in knowledge base (wrong/missing axiom, ...).
  - A typical problem is a missing axiom claiming that constants identify different objects.
    - $1 \neq 0$



How to represent a category in FOL?

- an object is a **member** of a category
  - $\text{MemberOf}(\text{BB}_{12}, \text{Basketballs})$
- a category is **subset** of another category
  - $\text{SubsetOf}(\text{Basketballs}, \text{Balls})$
- all members of the category have some **property**
  - $\forall x (\text{MemberOf}(x, \text{Basketballs}) \Rightarrow \text{Round}(x))$
- all members of the category can be **recognized** using common properties
  - $\forall x (\text{Orange}(x) \wedge \text{Round}(x) \wedge \text{Diameter}(x)=9.5\text{in} \wedge \text{MemberOf}(x, \text{Balls}) \Rightarrow \text{MemberOf}(x, \text{Basketballs}))$
- category may also have some property
  - $\text{MemberOf}(\text{Dogs}, \text{DomesticatedSpecies})$

- Let us notice that
  - agents **manipulate** with real **objects**
  - but **reasoning** is done at the level of **categories**
  - An agent uses observations to find properties of **objects that are used to assign objects to categories**. Reasoning on category then reveals useful information about the object itself.

**Category**

= a set of its members

= a complex object with relations

- MemberOf
- SubsetOf



- Categories organize and **simplify knowledge base by using inheritance of properties**.
  - properties are defined for a category but they are **inherited to all members of the category**
  - food is eatable, fruits are food, apples are fruits, and hence apples are eatable
- Subclasses organize categories to a **taxonomy**
  - a **hierarchical structure that is used to categorize objects**
  - originally proposed for classifying living organisms (alfa taxonomy)
  - categories for all knowledge**
    - Used in libraries
    - Dewey Decimal Classification
    - 330.94 European economy

