

# *Lesson 3:* Knowledge Representation

Carlos García Martínez

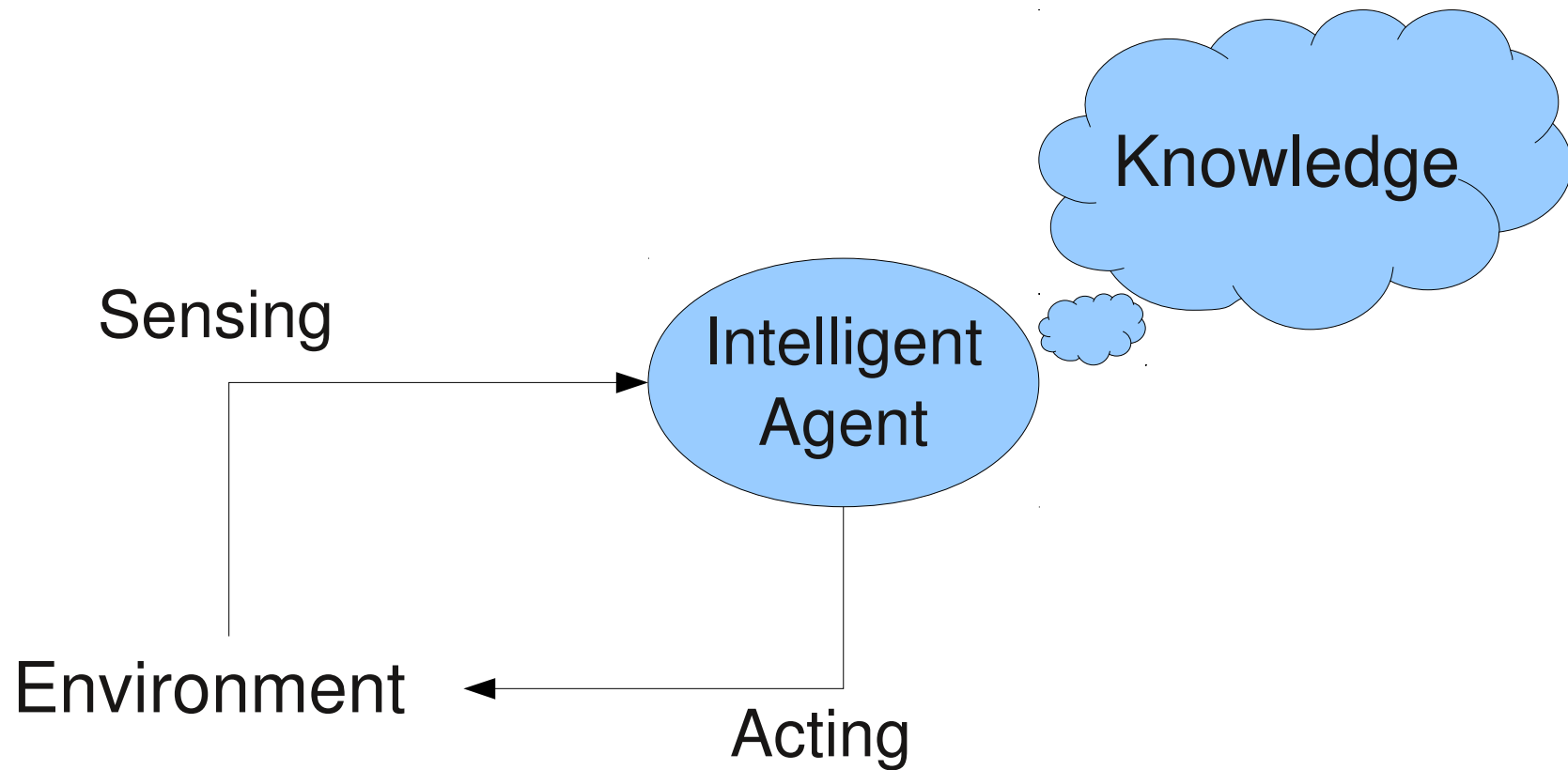


# Outline

1. Introduction
2. Main properties in Knowledge Representation
3. Ontology Languages
4. Issues

# 1. Introducción

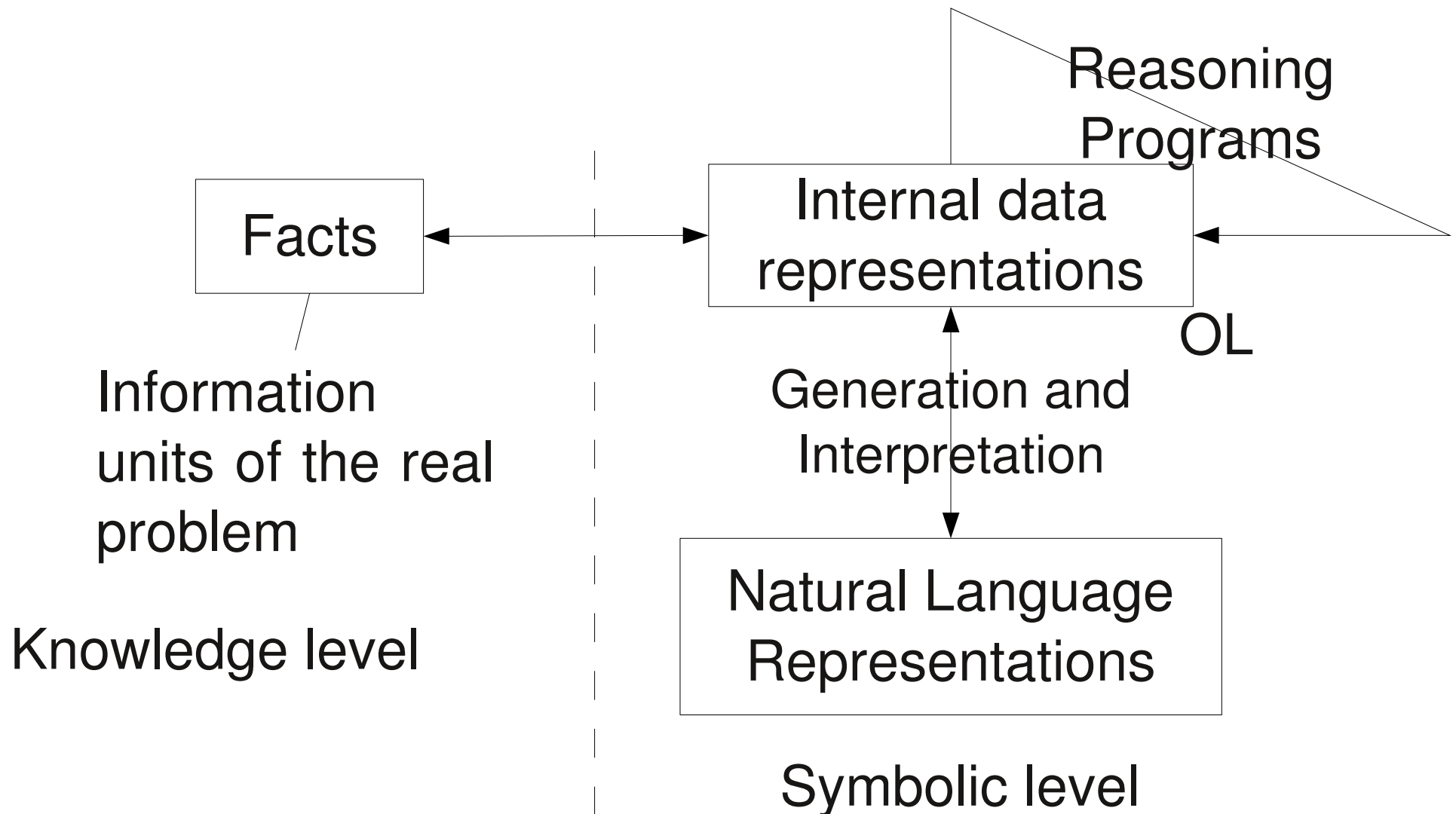
- Knowledge and Intelligence



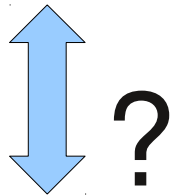
# 1. Introduction

- Artificial Intelligence Problems require ***Ontology Languages*** (OLs) able to:
  - ***Represent*** the main knowledge of a problem in a proper way.
  - ***Manipulate*** that knowledge.
  - Make ***inferences*** easily (to obtain new information from the one maintained).

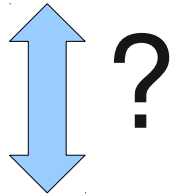
# Facts and Representation



# Example



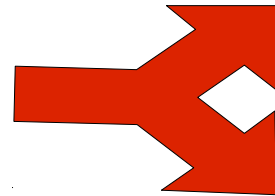
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- All dogs have tail



$\forall x \text{ dog}(x) \rightarrow \text{haveTail}(x)$

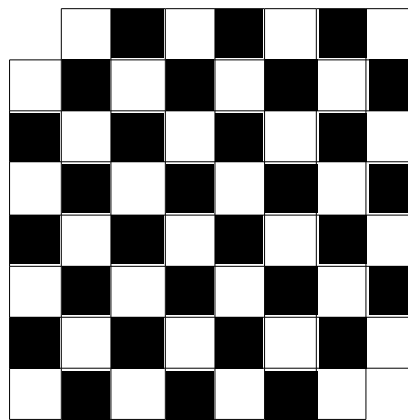
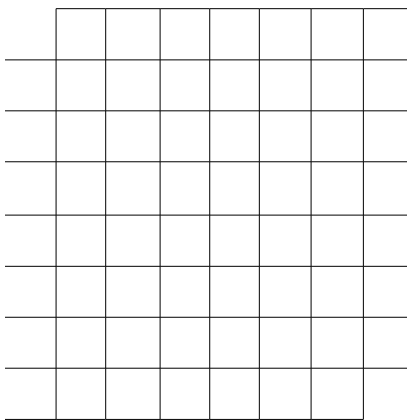
$\forall x \text{ dog}(x) \rightarrow \text{have}(x, \text{tail})$

$\forall x \text{ dog}(x) \rightarrow \exists y \text{ tail}(y) \wedge \text{have}(x, y) \wedge (\forall z \text{ have}(z, y) \rightarrow z = x) \wedge$   
 $(\forall u \text{ tail}(u) \wedge \text{have}(x, u) \rightarrow u = y)$



# Significance of the OL

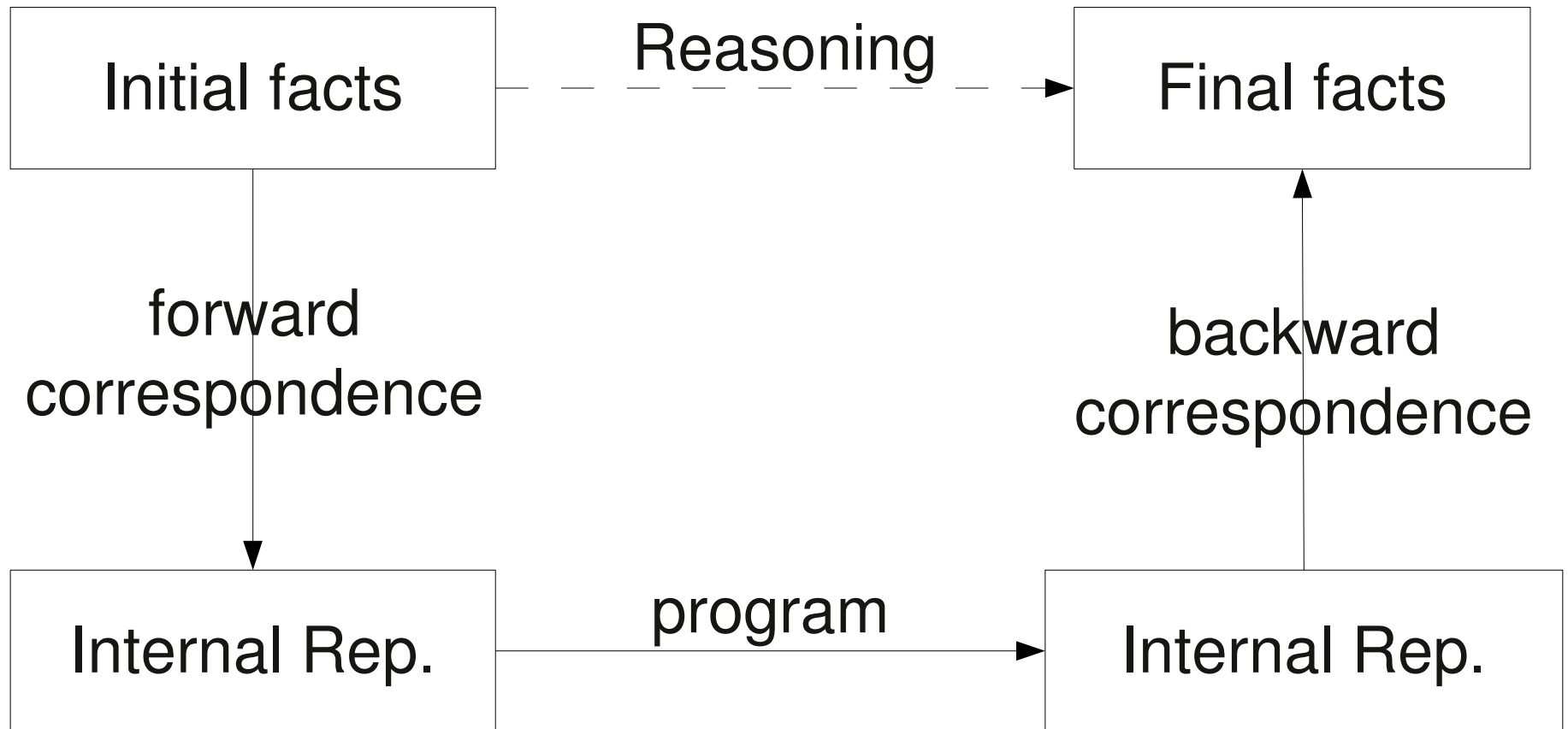
- A bad representation makes the reasoning program incorrect.
- A good representation makes the problem easier.
- An excellent representation may make the problem trivial



Number of  
black boxes = 30

Number of  
white boxes = 32

# ~~Artificial~~ Reasoning





# Outline

1. Introduction
- 2. *Main properties in Knowledge Representation***
3. Ontology Languages
4. Issues

# Main Properties

- **Representational Adequacy:** it should be able to represent all relevant facts of the problem.
- **Inferential Adequacy:** it should be able to infer new facts from the existing ones.
- **Inferential efficiency:** it should be efficient in terms of time and space.
- **Acquisitional efficiency:** it should be able to incorporate new information easily.

There is no single OL, neither having all these properties, nor being suitable to any kind of knowledge.

# Outline

1. Introduction
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- 3. *Ontology Languages***
4. Issues

# Ontology Languages

**3.1 Relational knowledge:** Relational Data Bases

**3.2 Inheritable knowledge:** Objects and Taxonomic nets

**3.3 Deductive Knowledge:** Logic

**3.4 Procedural Knowledge:** Rule based Systems

## 3.1 Relational Knowledge

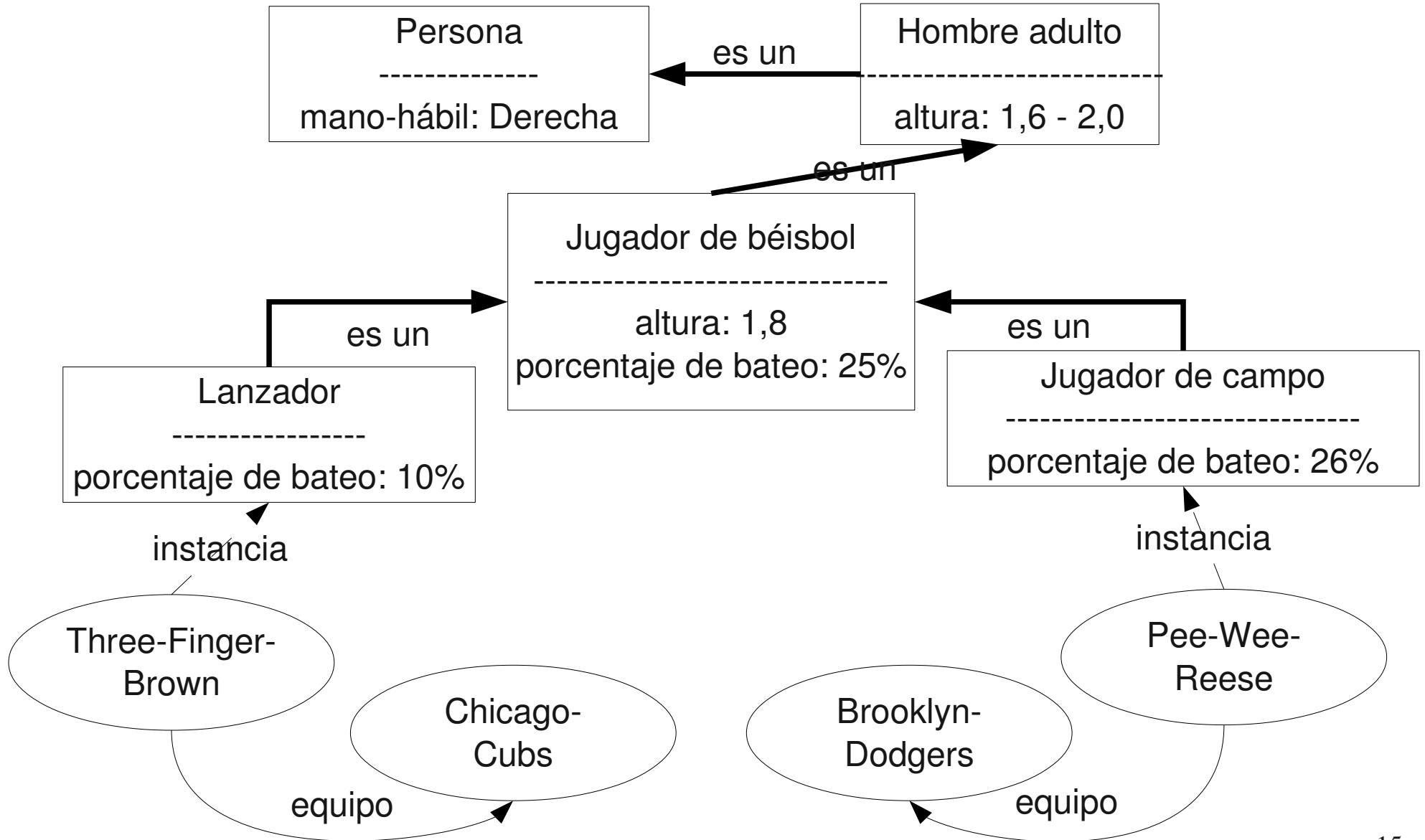
- It is commonly used by other OLs
- ***It lacks deductive competence.***

| <i>Nombre</i> | <i>Capital</i> | <i>Moneda</i> | <i>Idioma</i> |
|---------------|----------------|---------------|---------------|
| Alemania      | Berlín         | Marco         | Alemán        |
| Austria       | Viena          | Chelín        | Alemán        |
| España        | Madrid         | Peseta        | Español       |
| Nicaragua     | Managua        | Córdoba       | Español       |
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## 3.2 Inheritable Knowledge

- It lies on the ***inheritance*** concept: individuals inherit attributes from their classes and superclasses.
- Classes are organized hierarchically
- Examples: Taxonomic nets and objects (frames)

# Objects, Taxonomic net



## 3.3 Deductive Knowledge

- Knowledge is represented by means of *elements*, *predicates* and **logic relations**:

$$\forall x \text{ Simple\_Search\_Problem}(x) \rightarrow \exists y \text{ Search\_Technique}(y) \wedge \text{Solve}(y, x)$$

$\text{Simple\_Search\_Problem}(\text{viajante})$

- Logic makes inferences possible:
  - **Forward search**: it starts from the initial facts and it ends finding the conclusions.
  - **Backward search**: it starts from the conclusions and looks for initial facts that let them be true.
- Problem: Problem representation uses to be complex.



## 3.4 Procedural Knowledge

- Knowledge is represented by means of ***programs***. It often lacks deductive competence and acquisition efficiency.
- In AI, ***Rule based Systems*** is the technique most commonly applied:
  - IF <condition> THEN <action> (or <consequent>)
- ***Difficulties:***
  - It is not easy to differentiate between declarative and procedural knowledge.
  - To debug these systems is usually and impossible task.

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2. Main properties in Knowledge Representation
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- 4. *Issues***

# 4. Issues

4.1 Significant Attributes

4.2 Relations between attributes

4.3 Representation *granularity*

4.4 Set of objects

4.5 Forward correspondence: Search for a suitable structure

4.6 Frame problem

## 4.1 Significant Attributes

- Some attributes are more important than other. This importance should be stated:
  - ***Instance*** attribute: It states that an element belongs to a specific class.
  - ***IS-A*** attribute: It establishes an inheritance relation between classes.
- Logic does not emphasize significant attributes.
- Taxonomic nets (objects) do.

## 4.2 Relations between attributes

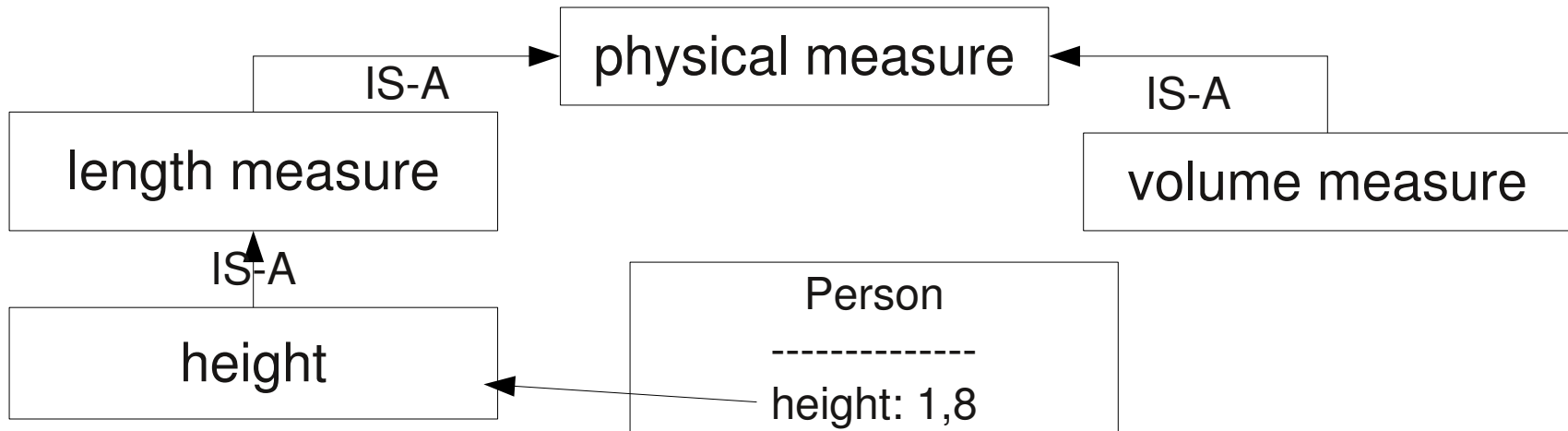
- *Objects' attributes may be as well objects.*
- **Issues:**
  - Attribute-object relations.
  - Attribute IS-A hierarchy.
  - Reasoning about values.
  - Single value attributes.

# Attribute-object relations (Inverses)

- *Objects' attributes may be as well objects.*
- Where should we put the relation?:
  - Relation is implemented in only one object. The relation is not symmetric.
  - Relation is implemented in both objects. Drawback: information duplication (modifications).
  - Relation is implemented independently.

# Attribute IS-A hierarchy

- Attributes may be structured in a IS-A hierarchy



- They may inherit restrictions, values computation...
- Storage and search may be optimized.

# Reasoning about values

- An Intelligent System may reason about some attribute values, though they are not present.
- It may consider:
  - Attribute type.
  - Restrictions.
  - Interactions with other attributes.
  - Forward and backward rules.



# Single Value Attributes

- Examples: height, weight...
- Multivalued examples: language, car...
- Some OLs (Logic) have problems dealing with single value attributes.
- Solutions:
  - To introduce ***temporal intervals***.
  - To substitute the old value.

## 4.3 Granularity

- **Granularity:** Detail level at which information must be represented.
- To choose the granularity is not easy:
  - ***Coarse grain:***
    - Low detail level
    - Easy to manage
    - Difficult to obtain
  - ***Fine grain:***
    - High detail
    - Difficult to manage
    - Easy to obtain
  - Examples:
    - “Dogs have a tail”
    - “Juan broke the window”

## 4.4 Set of objects

- Some sets of objects have their own properties. How do we represent their properties?
- How to represent set of objects:
  - First: give it a name.
  - ***Extensional definition***, indicating its members
  - ***Intensional definition***, describing the members' characteristics:
    - It allows us to define infinite sets (prime numbers)
    - It lets us to define sets with unknown members.
    - It lets us to define parametrised set (relatives)
    - There may be more than one definition for the same set (planets of the solar system)

## 4.5 Forward correspondence: Search for a suitable structure

- Perform an *Initial Selection*
- *Fill in appropriate details.*
- *Find better structure* if first choice is bad.
- What to do if none of the available structures is appropriate?
- When to create and remember a new structure

# Perform an Initial Selection

- Several approaches:
  - Index the structures by significant words (ambiguity).
  - Relate each major concept as a pointer to all of the potential scripts.
  - Locate one major clue in the description

# Revising the choice when necessary

- Fill in appropriated details in the selected structure
- ***If the selected structure does not match:***
  - Select fragments of the current structure to find another structure.
  - Make an excuse for the shortcomings of the first and continue to use it
  - Refer to specific stored links between structures
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## 4.6 The Frame Problem

- How to represent efficiently sequences of problem states that arise from a search process.
- If there are many facts that do not change they are repeated across every state:
  - A lot of time will be spent copying these nodes
  - A lot of memory is wasted

# Frame problem: A Solution

- **Frame Axiom** describe all the things that do not change when an operator is applied in state  $n$ .
- All things that do change are mentioned as part of the operator itself.
- Two ways:
  - Do not modify the initial state
  - Modify the initial state



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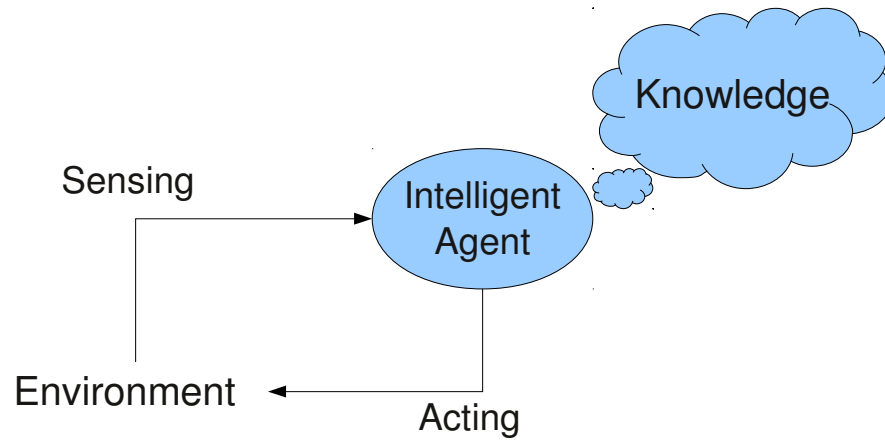


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# 1. Introducción

- Knowledge and Intelligence



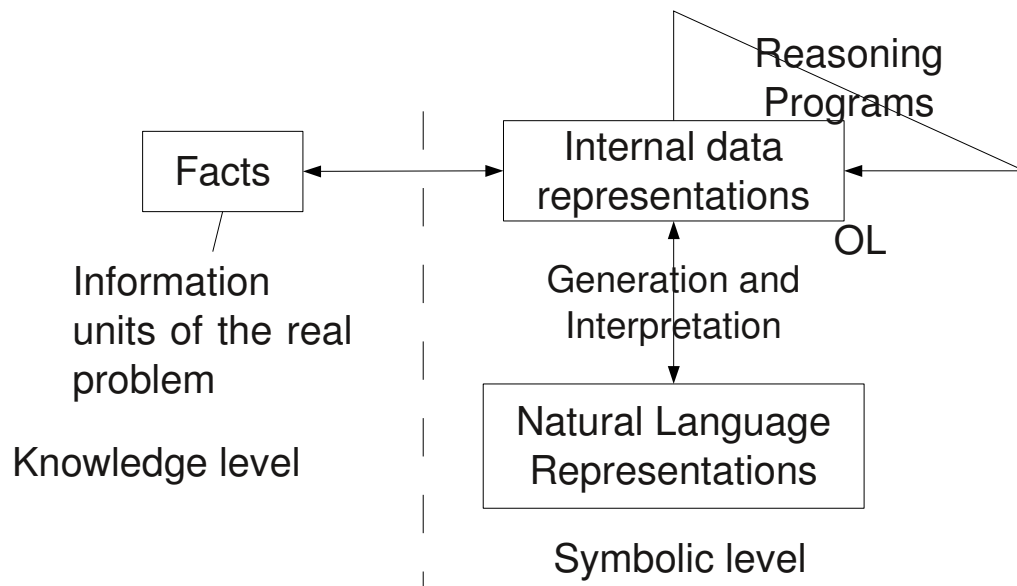
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4

Los problemas de la IA necesitan manejar una cantidad respetable de conocimiento. Para ello necesitan **sistemas de representación del conocimiento**

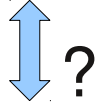
# Facts and Representation



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Es importante conocer que el programa no maneja los hechos reales, sino una representación del mismo

## Example



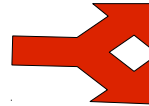
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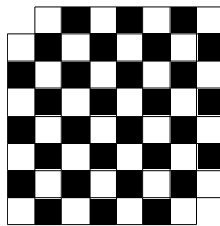
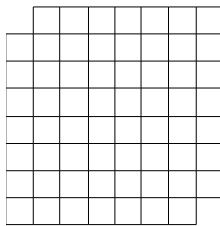
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## Significance of the OL

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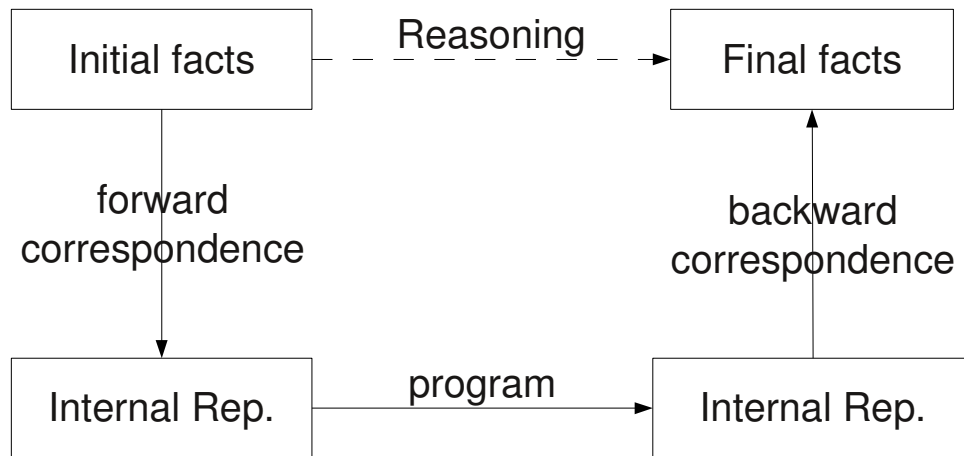


Number of  
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Sea un tablero de 8x8 al que se le han quitado las dos esquinas opuestas ¿se puede cubrir con fichas de dominó?

## ~~Artificial~~ Reasoning



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El razonamiento artificial consiste entonces en:  
dados unos hechos iniciales....

Los errores en este razonamiento pueden deberse a tres fuentes, la representación de los hechos, el programa o la interpretación de las representaciones finales.



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## Main Properties

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Al añadir conocimiento podemos estropear la base completa

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# Ontology Languages

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## 3.1 Relational Knowledge

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- ***It lacks deductive competence.***

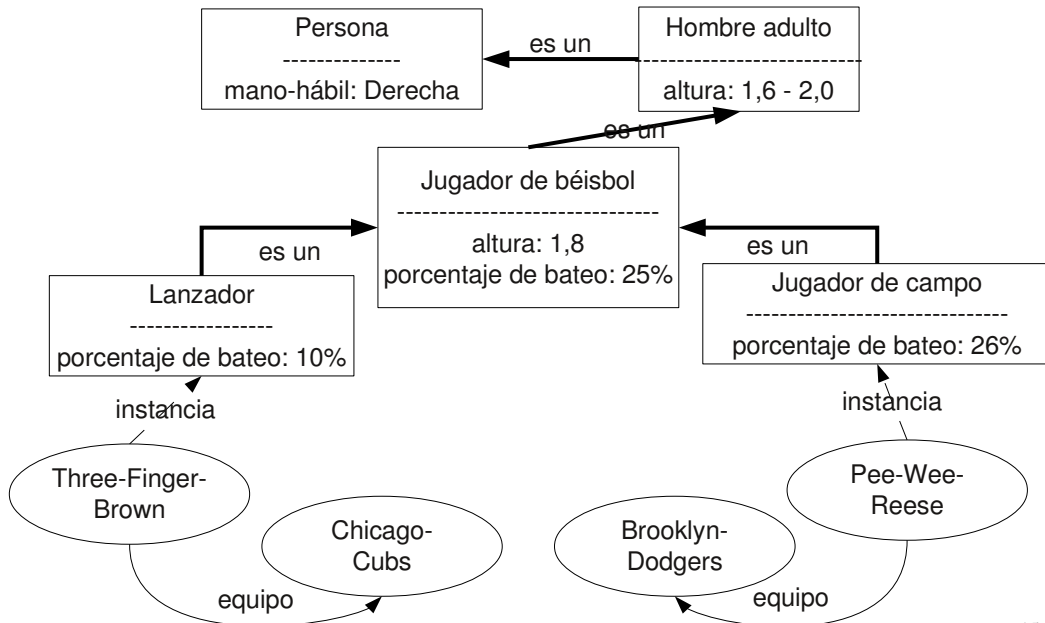
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Un ejemplo, no puede decir cuantos países hablan portugués

## 3.2 Inheritable Knowledge

- It lies on the ***inheritance*** concept: individuals inherit attributes from their classes and superclasses.
- Classes are organized hierarchically
- Examples: Taxonomic nets and objects (frames)

## Objects, Taxonomic net



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Describir el algoritmo de herencia de propiedades

### 3.3 Deductive Knowledge

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$\forall x \text{ Simple\_Search\_Problem}(x) \rightarrow \exists y \text{ Search\_Technique}(y) \wedge \text{Solve}(y, x)$

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- Logic makes inferences possible:
  - **Forward search**: it starts from the initial facts and it ends finding the conclusions.
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- Problem: Problem representation uses to be complex.

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Aunque el conocimiento heredable resulta ser muy potente, en algunos casos no es suficiente y se necesita conocimiento deductivo



## 3.4 Procedural Knowledge

- Knowledge is represented by means of **programs**. It often lacks deductive competence and acquisition efficiency.
- In AI, **Rule based Systems** is the technique most commonly applied:
  - IF <condition> THEN <action> (or <consequent>)
- **Difficulties:**
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Código para ordenar, contar o calcular el máximo de un vector

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## 4. Issues

4.1 Significant Attributes

4.2 Relations between attributes

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Poner un ejemplo, persona, perro, color de los ojos, pelo....

## 4.2 Relations between attributes

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- **Issues:**
  - Attribute-object relations.
  - Attribute IS-A hierarchy.
  - Reasoning about values.
  - Single value attributes.

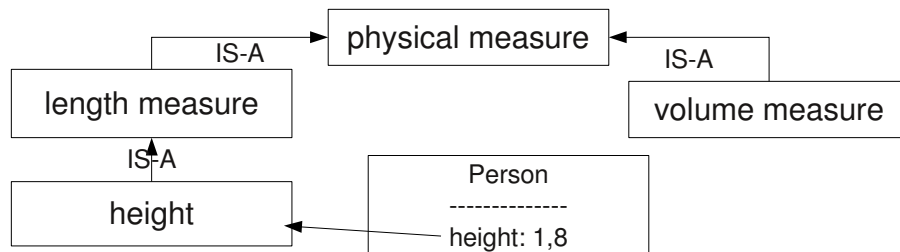
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  - Relation is implemented independently.

Poner un ejemplo de coche y propietario

## Attribute IS-A hierarchy

- Attributes may be structured in a IS-A hierarchy



- They may inherit restrictions, values computation...
- Storage and search may be optimized.

## Reasoning about values

- An Intelligent System may reason about some attribute values, though they are not present.
- It may consider:
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## Single Value Attributes

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- Multivalued examples: language, car...
- Some OLs (Logic) have problems dealing with single value attributes.
- Solutions:
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## 4.4 Set of objects

- Some sets of objects have their own properties. How do we represent their properties?
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    - There may be more than one definition for the same set (planets of the solar system)

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Algunos conjuntos tienen sus propias propiedades: el conjunto de elefantes es grande.

El primer gui3n: asignar un nombre, se refiere a crear una clase. Entonces todas las instancias heredan las propiedades que se definen, pero en realidad, s3lo eso no crea ning3n conjunto.

## 4.5 Forward correspondence: Search for a suitable structure

- Perform an ***Initial Selection***
- ***Fill in appropriate details.***
- ***Find better structure*** if first choice is bad.
- What to do if none of the available structures is appropriate?
- When to create and remember a new structure

## Perform an Initial Selection

- Several approaches:
  - Index the structures by significant words (ambiguity).
  - Relate each major concept as a pointer to all of the potential scripts.
  - Locate one major clue in the description

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Primer guión: volar: 1) volar a la Palma, 2) volar la caja fuerte

Segundo guión: a cada concepto un conjunto de estructuras, y después seleccionar la intersección:  
Juan viajó con la patente

Tercero: relativizar la importancia de los conceptos

## Revising the choice when necessary

- Fill in appropriated details in the selected structure
- ***If the selected structure does not match:***
  - Select fragments of the current structure to find another structure.
  - Make an excuse for the shortcomings of the first and continue to use it
  - Refer to specific stored links between structures
  - Use IS-A links

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Primer guión, seleccionar algunas propiedades de la estructura actual y buscar esas propiedades en otra estructura

Segundo guión: seguir con la misma estructura haciendo anotaciones en los problemas encontrados

Tercero y cuarto: usar los enlaces entre estructuras

## 4.6 The Frame Problem

- How to represent efficiently sequences of problem states that arise from a search process.
- If there are many facts that do not change they are repeated across every state:
  - A lot of time will be spent copying these nodes
  - A lot of memory is wasted

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En los problemas de búsqueda se crean muchos nodos, cada uno de aplicar una regla de transición a un nodo anterior. Si hay muchos hechos que no cambian, éstos se duplican en los nodos

## Frame problem: A Solution

- **Frame Axiom** describe all the things that do not change when an operator is applied in state  $n$ .
- All things that do change are mentioned as part of the operator itself.
- Two ways:
  - Do not modify the initial state
  - Modify the initial state

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Si se utiliza el axioma del marco, todo lo que no aparece en el operador se considera que permanece igual.

Entonces, hay dos formas de aplicarlo, no modificando el estado inicial y en cada nodo apuntar sólo lo que cambia (coste de generar el nodo) (y coste de deshacerlo)

O modificar el estado y apuntar en cada nodo qué es necesario deshacer para volver al estado anterior. (coste de generar y coste de deshacer)