

# Knowledge Engineering

## Semester 2, 2004-05

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Lecture 5 – Basics of Ontologies  
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## Where are we?

Last time . . .

- ▶ we attempted a transition from Knowledge Acquisition to Knowledge Representation

Focus of the KR&R part of the module . . .

- ▶ representation of complex domain knowledge
- ▶ ontology reasoning systems
- ▶ dealing with uncertainty

Today . . .

- ▶ basics of ontologies
- ▶ formalising certain kinds of knowledge

# Ontologies

- ▶ In toy domains, easy to describe relevant objects and relationships to reason about
- ▶ In more complex domains, a principled way of structuring the domain of discourse is required
- ▶ **Ontology**
  - ▶ philosophically speaking: a theory of nature of being or existence
  - ▶ practically speaking: a formal specification of a shared conceptualisation

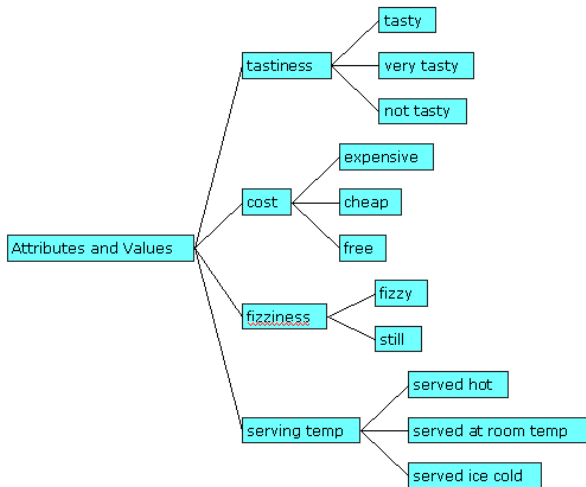
# Ontologies

What are they good for?

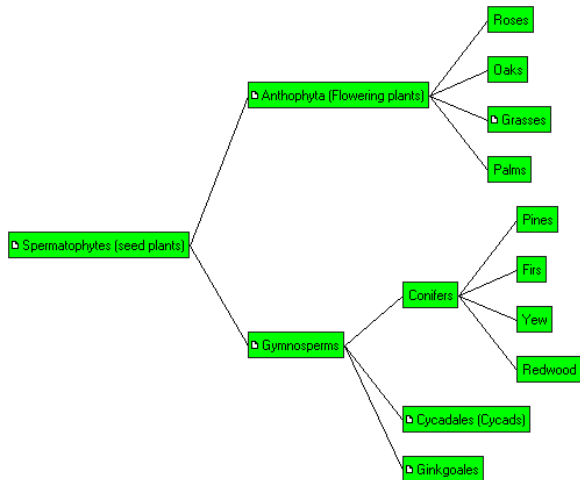
- ▶ Knowledge sharing and reuse (agreeing on a vocabulary)
- ▶ Support of use of **knowledge level** vs. symbolic level
- ▶ Make **ontological commitments** (decisions regarding conceptualisation which reflect points of view) explicit
- ▶ Interaction problem: choice of knowledge representation depends on problem to solve and inference mechanisms to be used

Many different representations, will use first-order logic (FOL) and discuss various knowledge modelling issues

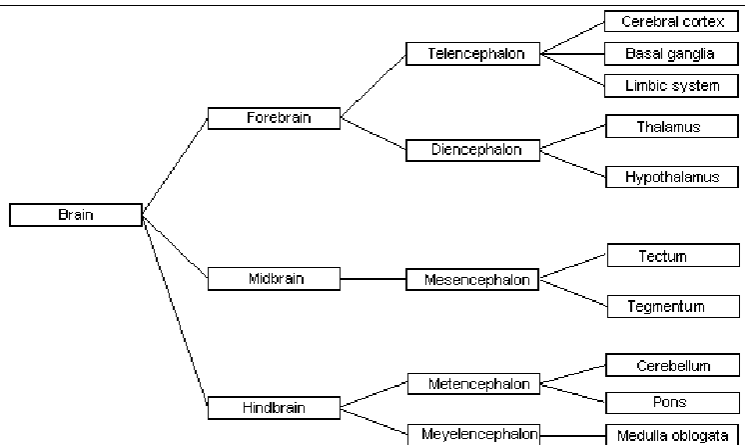
## Example: Attribute Ladder



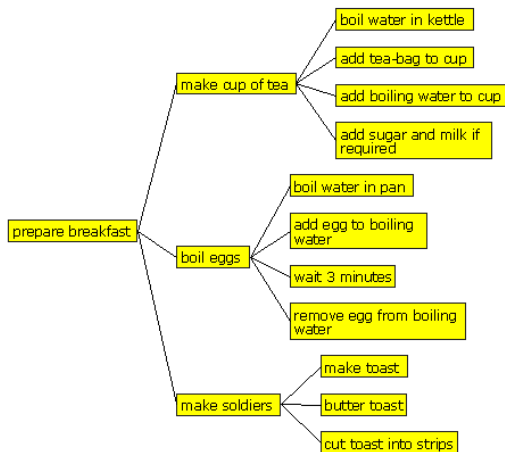
## Example: Concept Tree



## Example: Composition Ladder

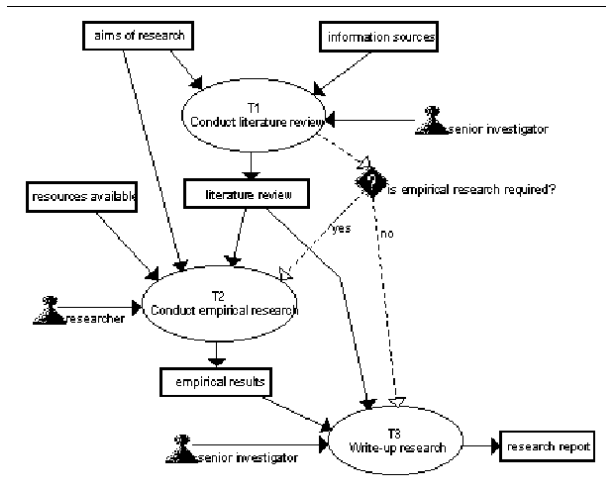


## Example: Process Ladder

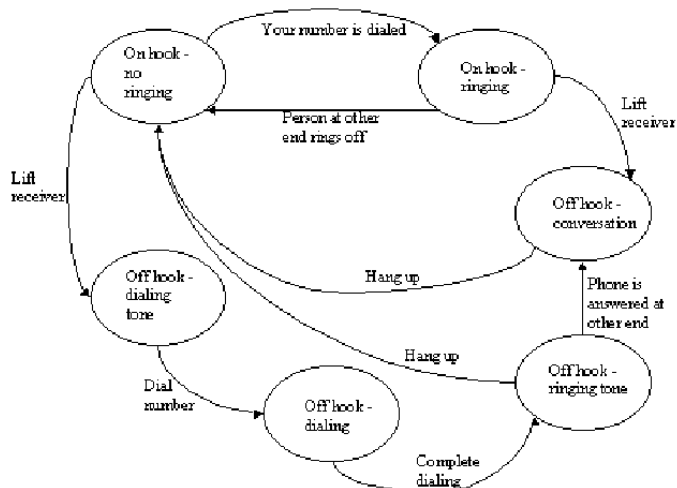




## Example: Process Map

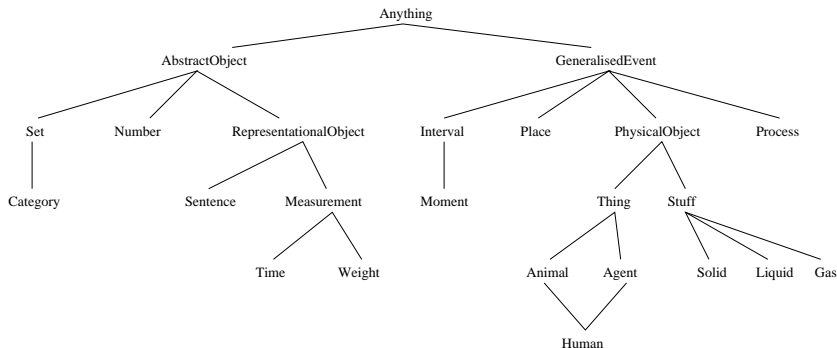


## Example: State Diagram



# Upper Ontologies

General framework of concepts (convention: from top to bottom more specific)

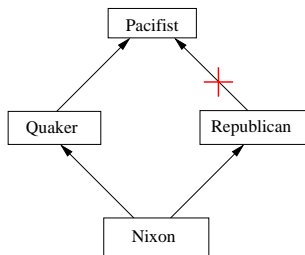


# Categories

- ▶ Categories play an important role in reasoning (although individual objects are interacted with in practice)
- ▶ Representation through predicates ( $Car(X)$ ) or through **reification** ( $Member(X, Cars)$ )
- ▶ One way of defining categories: category = a collection of its members
- ▶ **Inheritance** most common relationship between categories

## Categories

- ▶ Subclasses inherit properties of super-classes (→ OOP)
- ▶ **Taxonomy**: an ontology of categories induced by subclass relationships
- ▶ Problems of multiple inheritance
- ▶ Example: The Nixon diamond



## Categories

- ▶ Can use FOL to express all kinds of properties of categories:
  - ▶ Subclasses:  $Basset \subset Dog$ ,  $Dog \subset Animal$
  - ▶ Describing properties/infering class membership:  
 $\forall x Basset(x) \Rightarrow GoodScent(x)$ ,  
 $\forall x GoodScent(x) \Rightarrow Basset(x)$
  - ▶ Category properties:  $Basset \in Species$
- ▶ Further common properties of categories:
  - ▶ Disjointness
  - ▶ Exhaustive decomposition
  - ▶ Partition
- ▶ Exercise: describe these in FOL

## Physical Composition

- ▶ Want to express physical composition of objects
- ▶ part-of relation (reflexive,transitive),  
e.g. *PartOf(Leg, Body)*
- ▶ How do we express a collection of concrete objects, e.g. a bag of apples?
- ▶ Use of “set” problematic, since a set has no weight (is not an object itself)
- ▶ Define “bunch”:  $\forall x x \in s \Rightarrow PartOf(x, BunchOf(s))$
- ▶ Smallest object satisfying this condition (**logical minimisation**):

$$\forall y [\forall x x \in s \Rightarrow PartOf(x, y)] \Rightarrow PartOf(BunchOf(s), y)$$

## Measurements

- ▶ **Quantitative** measurements: mass, price, weight etc.
  - ▶  $Price(MyBasset) = Pounds(500) = Euro(750)$
  - ▶ Abstract objects:  $Pounds(500)$  is not a 500 pound amount of money/account balance
  - ▶ Each measurement value exists only once
- ▶ **Qualitative** measurements: focus on ordering btw. different values, not the values themselves
- ▶ Example: use of rule

$$\forall x \forall y \text{ Vehicle}(x) \wedge \text{Vehicle}(y) \wedge \text{Faster}(x, y) \Rightarrow \text{Prefer}(x, y)$$

sufficient (KB contains facts  $\text{Faster}(Car, Bicycle)$ ) rather than getting speed measurements for each type of vehicle

- ▶ Area of **qualitative physics**



## Substances and Objects

- ▶ Intuition: specify objects in the world and put them together to obtain composite objects
- ▶ Problem of **individuation** (division into distinct object)
  - ▶ No problem for count nouns (cats, dogs, apples, planets)
  - ▶ But how about “stuff” (water, air, energy)?
- ▶ Example: Assume category *Water*
  - ▶  $x \in \textit{Water} \wedge \textit{PartOf}(x, y) \Rightarrow y \in \textit{Water}$
  - ▶  $x \in \textit{Water} \Rightarrow \textit{BoilingPoint}(x, 100^\circ \textit{C})$
- ▶ But still problems: *SaltWater* subcategory of *Water* but how about *PintsOfWater*?
- ▶ Underlying problem: difference between **intrinsic** properties (properties of the substance, retained under subdivision) and **extrinsic** properties of objects

## Expressing Change

- ▶ Straightforward way of capturing change: use time-steps  $t$  in all predicates, and express change by reasoning about subsequent time-steps:

$$\forall t \text{ Rains}(t) \Rightarrow \text{WetGround}(t + 1)$$

- ▶ Alternatively, concentrate on **situations** brought about by different actions ➔ **situation calculus**
- ▶ Situations are logical terms  $S_0, S_1$ , etc.
- ▶ Function  $\text{Result}(a, s)$  used to name situation that results from executing action  $a$  in  $s$
- ▶ Sometimes useful to extend this to sequences of actions

$$\text{Result}([a|rest], s) = \text{Result}(rest, \text{Result}(a, s))$$

## Expressing Change

- ▶ **Fluents** = functions/predicates that vary from situation to situation (opposite: **atemporal/eternal** functions/predicates)
- ▶ Describe actions by possibility and effect axioms:
  - ▶ Possibility axiom:  $Preconditions \Rightarrow Poss(a, s)$
  - ▶ Effect axiom:  
 $Poss(a, s) \Rightarrow Changes\ that\ result\ from\ the\ action$
- ▶ Example (blocks world):
  - ▶ Possibility axiom:  
 $\forall s\ Clear(A, s) \wedge Clear(B, s) \Rightarrow Poss(Stack(A, B), s)$
  - ▶ Effect axiom:  $\forall s\ Poss(Stack(A, B), s) \Rightarrow$   
 $On(A, B, Result(Stack(A, B), s)) \wedge$   
 $\neg Clear(B, Result(Stack(A, B), s))$

## Frame Problem

- ▶ Problem: Effect axioms say what changes, but not what stays the same!
- ▶ In the above example: How can we infer  $Clear(A, Result(Stack(A, B), s))$ ?
- ▶ **Frame problem**: Problem of representing all things that stay the same
- ▶ Expressing what does stay the same through **frame axioms** is one possibility

## Frame Problem

- ▶ Costly, would require  $O(AF)$  frame axioms for  $A$  actions and  $F$  fluents
- ▶ **Representational frame problem:** If any action has at most  $E$  effects, would like to make do with  $O(AE)$  rules instead
- ▶ **Inferential frame problem:** Would like to project results of  $t$ -long action sequence in time  $O(Et)$  rather than  $O(Ft)$  or  $O(AEt)$
- ▶ **Qualification problems:** Capturing *all* conditions for successful action (no solution)

## Representational Frame Problem

- ▶ Solution: Use **successor-state axioms**

*Action is possible  $\Rightarrow$*

*(Fluent is true in result state  $\Leftrightarrow$  Action's effect made it true  $\vee$  It was true before and action left it alone)*

- ▶ Example:

$$\begin{aligned} Poss(a, s) \Rightarrow (Clear(A, Result(a, s)) \Leftrightarrow \\ (On(B, A, s) \wedge a = UnStack(B, A)) \\ \vee (Clear(A, s) \wedge a \neq Stack(B, A))) \end{aligned}$$

- ▶ Solves problem, because each effect of an action is only mentioned once (note use of " $\Leftrightarrow$ ")
- ▶ **Ramification problem:** dealing with implicit effects

## Inferential Frame Problem

- ▶ In projecting consequences, we still need  $O(AEt)$  inferences for  $t$  time steps
- ▶ Mostly involves copying unchanged fluents
- ▶ But if only one action is executed at a time, why consider all of them?
- ▶ Reconsider format of frame axiom for fluent  $F_i$ :

$$\begin{aligned}
 & Poss(a, s) \Rightarrow \\
 & F_i(Result(a, s)) \Leftrightarrow (a = A_1 \vee a = A_2 \dots) \\
 & \quad \vee F_i(s) \wedge (a \neq A_3) \wedge (a \neq A_4) \dots
 \end{aligned}$$

## Inferential Frame Problem

- ▶ We can rewrite this using positive and negative effects (that make fluent true or false):

$Poss(a, s) \Rightarrow$

$$F_i(Result(a, s)) \Leftrightarrow PosEffect(a, F_i) \vee [F_i(s) \wedge \neg NegEffect(a, F_i)]$$

$PosEffect(A_1, F_i) \quad PosEffect(A_2, F_i)$

$NegEffect(A_3, F_i) \quad NegEffect(A_4, F_i)$

- ▶ Appropriate indexing  $\rightarrow$  retrieve effects of a given action  $A$  and corresponding axioms for  $F_i$  in  $O(1)$
- ▶ Represent new situation by the old situation and “delta” (if nothing happens, nothing needs to be done)
- ▶ Achieves prediction in  $O(Et)$



# Summary

- ▶ Notion of ontology
- ▶ Discussed modelling of interesting types of knowledge
  - ▶ Categories
  - ▶ Physical Composition, Measurements, Substances/Objects
  - ▶ Actions and Change, frame problem
- ▶ Other interesting stuff we did not deal with:
  - ▶ Time, intervals, continuous processes, etc.
  - ▶ Multiple overlapping actions, multiple agents
- ▶ Next time: **category reasoning systems**