



Knowledge Based Systems

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Programming vs KR

Programming:

- construct an algorithm to solve a problem
- choose a programming language
- implement the algorithm in the language
- run the program to solve the problem

Knowledge Representation and Engineering:

- identify knowledge necessary to solve the problem
- choose a representation language
- formulate knowledge in the language
- check if solution can be derived



Knowledge

There is evidence that people memorize just **the important stuff**.

- objects
- facts, relations
- rules (generic knowledge)
- causality
- meta-knowledge
- procedural knowledge
- knowledge about processes
- ...



Meta-knowledge

knowledge about other's (or our own)

- knowledge (Jacek knows that Earth revolves around Sun)
- beliefs (Jacek believes that his daughter is smart)
- needs (Jacek needs more time for checking assignments)
- goals (Jacek wants to write a paper by Friday)
- intentions (Jacek wants to be ready with assignment 1 by tomorrow)
- capabilities (Jacek can drive)
- ...



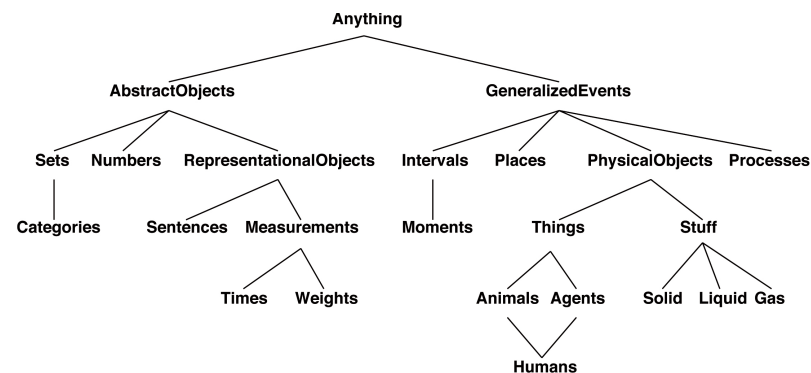
Procedural knowledge

How to:

- change a diaper?
- serve in tennis?
- ride a bicycle?
- drive a car?
- ...



Ontology

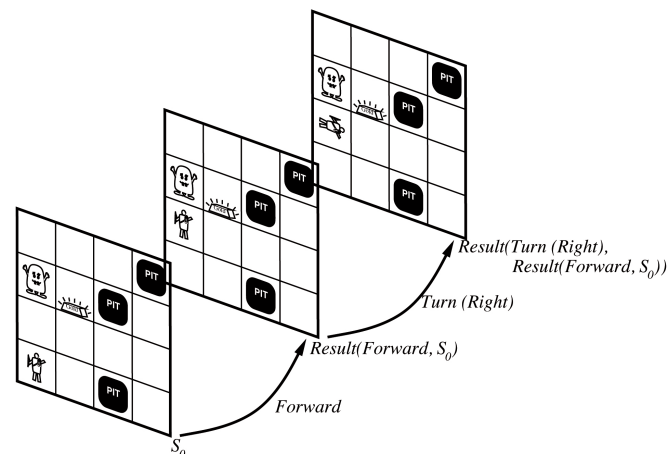


Problems with predicate logic:

- static
- flat
- qualification/ramification/frame problem
- exceptions
- strength
- ...



Actions, situations





Situation calculus

Action descriptions:

- possibility axioms (when is an action possible)
 - effect axioms (what's its effect, what changes)
 - frame axioms (what remains the same)
- Important issue!

Quite often we need richer ontology.



Describing actions

“Effect” axiom—describe changes due to action

$$\forall s \text{ AtGold}(s) \Rightarrow \text{Holding}(\text{Gold}, \text{Result}(\text{Grab}, s))$$

“Frame” axiom—describe *non-changes* due to action

$$\forall s \text{ HaveArrow}(s) \Rightarrow \text{HaveArrow}(\text{Result}(\text{Grab}, s))$$

“Successor-state axioms” solve the representational frame problem



Successor-state axioms

Each axiom is “about” a *predicate* (not an action per se):

$$\begin{aligned} P \text{ true afterwards} &\Leftrightarrow [\text{an action made } P \text{ true} \\ &\vee P \text{ true already and no action made } P \text{ false}] \end{aligned}$$

For holding the gold:

$$\forall a, s \text{ Holding}(\text{Gold}, \text{Result}(a, s)) \Leftrightarrow$$

$$[(a = \text{Grab} \wedge \text{AtGold}(s)) \vee (\text{Holding}(\text{Gold}, s) \wedge a \neq \text{Release})]$$



Making plans

Initial condition in KB:

$$\text{At}(\text{Agent}, [1, 1], S_0)$$

$$\text{At}(\text{Gold}, [1, 2], S_0)$$

Query: $\text{Ask}(\text{KB}, \exists s \text{ Holding}(\text{Gold}, s))$

i.e., in what situation will I be holding the gold?

Answer: $\{s \mid \text{Result}(\text{Grab}, \text{Result}(\text{Forward}, S_0))\}$

i.e., go forward and then grab the gold

This assumes that the agent is interested in plans starting at S_0 and that S_0 is the only situation described in the KB



Making plans: A better way

Represent *plans* as action sequences $[a_1, a_2, \dots, a_n]$

$PlanResult(p, s)$ is the result of executing p in s

Then the query $Ask(KB, \exists p \text{ Holding}(Gold, PlanResult(p, S_0)))$ has the solution $\{p[[Forward, Grab]]\}$

Definition of $PlanResult$ in terms of $Result$:

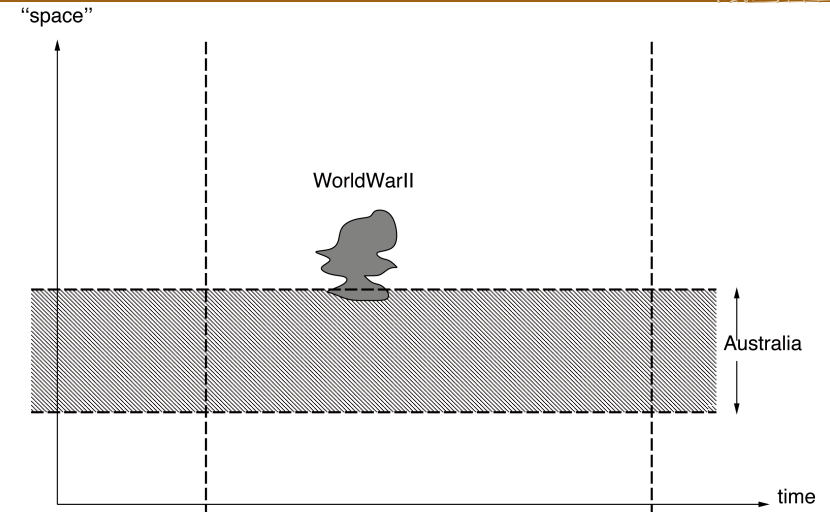
$$\forall s \text{ PlanResult}([], s) = s$$

$$\forall a, p, s \text{ PlanResult}([a|p], s) = \text{PlanResult}(p, \text{Result}(a, s))$$

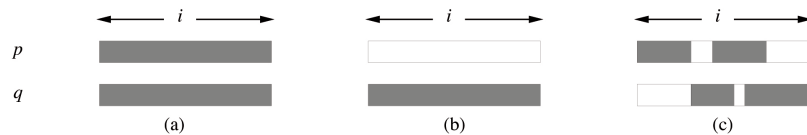
Planning systems are special-purpose reasoners designed to do this type of inference more efficiently than a general-purpose reasoner



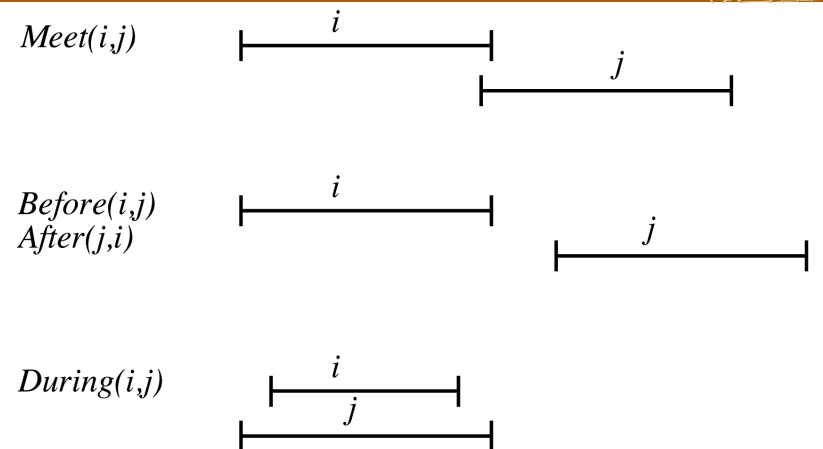
Events



Events



Interval calculus





Representation of exceptions:

$\forall x (Bird(x) \wedge \neg Pinguin(x) \wedge \neg Ostrich(x) \rightarrow Flies(x))$

But if we know $Bird(Tweety)$ we can't say whether it flies!

Qualification Problem:

Unfortunately, many other birds don't fly either: caged birds, dead birds, birds with broken wing, bird with feathers covered by oil, ...

$\forall x (Bird(x) \wedge \neg Pinguin(x) \wedge \neg Ostrich(x) \wedge \dots \rightarrow Flies(x))$

Other related problems: frame problem, ramification problem



Solutions:

- non-monotonic logics
- fuzzy logic
- probabilistic logic
- possibilistic logic
- ...



Monotonic vs. non-monotonic

$Th(\Delta)$

monotonic logic:

if $\Delta \subseteq \Delta'$ then $Th(\Delta) \subseteq Th(\Delta')$

non-monotonic logic:

if $\Delta \subseteq \Delta'$ and $Th(\Delta) \supset Th(\Delta')$



Closed World Assumption:

Things that cannot be proven true are probably false

leads to:

Negation as failure



Consider:

$$\Delta = \{A(\text{Stockholm}), A(\text{Sturup}), A(\text{Copenhagen}), \\ A(\text{Oslo}), \text{Conn}(\text{Oslo}, \text{Copenhagen}), \\ \text{Conn}(\text{Stockholm}, \text{Oslo}), \\ \forall(x, y, z)(\text{Conn}(x, y) \wedge \text{Conn}(y, z) \rightarrow \text{Conn}(x, z))\}$$

Because it's not the case that $\text{Conn}(\text{Sturup}, \text{Stockholm})$, CWA gives us immediately $\neg\text{Conn}(\text{Sturup}, \text{Stockholm})$.
But let us add $\text{Conn}(\text{Sturup}, \text{Copenhagen})$ to Δ .
 $\text{Conn}(\text{Sturup}, \text{Stockholm})$ can be proven now, so $\neg\text{Conn}(\text{Sturup}, \text{Stockholm})$ does not appear as a consequence.
Non-monotonicity!



CWA is syntax-dependent:

If $\Delta = \{\text{Single}(\text{John}), \text{Single}(\text{Mary}), \text{Clever}(\text{Kent})\}$
then CWA gives us:
 $\{\neg\text{Clever}(\text{John}), \neg\text{Clever}(\text{Mary}), \neg\text{Single}(\text{Kent})\}$.

But if $\Delta = \{\neg\text{Married}(\text{John}), \neg\text{Married}(\text{Mary}), \text{Clever}(\text{Kent})\}$
then CWA gives us:
 $\{\neg\text{Clever}(\text{John}), \neg\text{Clever}(\text{Mary}), \neg\text{Married}(\text{Kent})\}$.



Effective representation of knowledge:

- storing
- retrieval
- modification

What should be represented?

- use logic
- not necessarily FOL

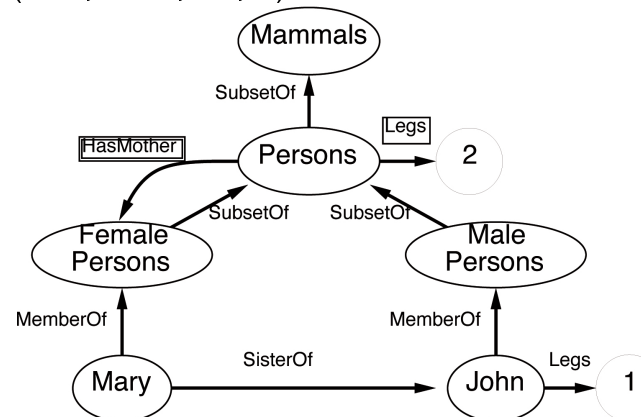
How should it be represented?

- whatever method you find suitable



Semantic networks:

Precursor of Description Logics and Semantic Web Languages (OWL, DAML, OIL, ...)





Reasoning in SN:

- inheritance via SubsetOf (SubClass) and MemberOf (isA) links
- intersection paths
- special meaning associated with some links (like cardinality constraints, etc.)
- classification, consistency, subsumption

May be effective given some restrictions on the logic (DL variants).
Rule-based reasoning on top (RIF and co.)



Knowledge-Based Systems

A generic term, might denote anything that involves encoded knowledge.

Or might mean a system where the knowledge component is *explicit* and manipulable.

Paradigms throughout history of AI:

- Logic-based systems;
- Rule-based systems (expert systems);
- Blackboard systems;
- Semantic web systems.



Rule-based systems

Or *expert systems*.

Promised much. Delivered (too) little. Caused “AI Winter” in the 90s.

Simple architecture:

- Facts;
- Rules;
- Inference engine:
 - Matching;
 - Conflict resolution;
 - Rule application.



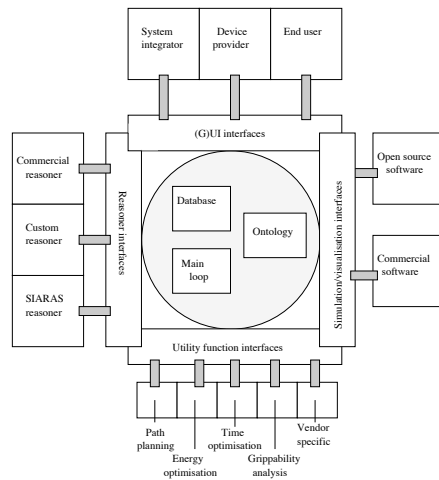
Blackboard systems

Architecture:

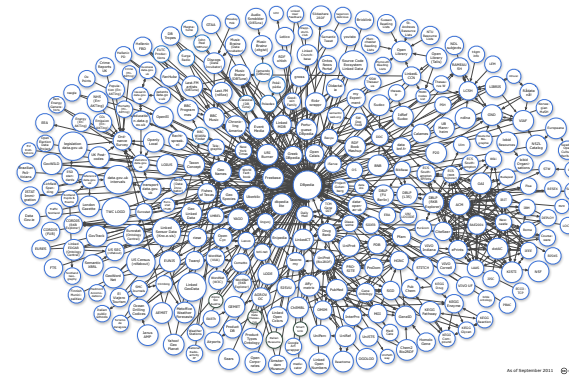
- Knowledge base (blackboard);
- Knowledge sources (expert problem solvers);
- Controller (agenda maintainer).



A blackboard system



Semantic Web



Linking Open Data cloud diagram, by Richard Cyganiak and Anja Jentzsch. <http://lod-cloud.net/>



Semantic Web

Lots of hype. Lots of acronyms. But some are important!

- URI – Uniform Resource Identifier
- RDF – Resource Description Framework
- RIF – Rule Interchange Format
- SPARQL – SPARQL Protocol and RDF Query Language
- OWL – Web Ontology Language

Open World Assumption!



SPARQL

W3C Recommendation

Queries:

- SELECT (returns a table)
- CONSTRUCT (returns RDF)
- ASK (returns a boolean)
- DESCRIBE (freedom)

Example:

```
PREFIX foaf: <http://xmlns.com/foaf/0.1/>
SELECT ?name ?email
WHERE {
  ?person a foaf:Person.
  ?person foaf:name ?name.
  ?person foaf:mbox ?email.
}
```



A SPARQL query

What are all the country capitals in Africa?

```
PREFIX abc: <http://example.com/exampleOntology#>
SELECT ?capital ?country
WHERE {
  ?x abc:cityname ?capital ;
     abc:isCapitalOf ?y .
  ?y abc:countryname ?country ;
     abc:isInContinent abc:Africa .
}
```



A real SPARQL query

<http://wiki.dbpedia.org/OnlineAccess>

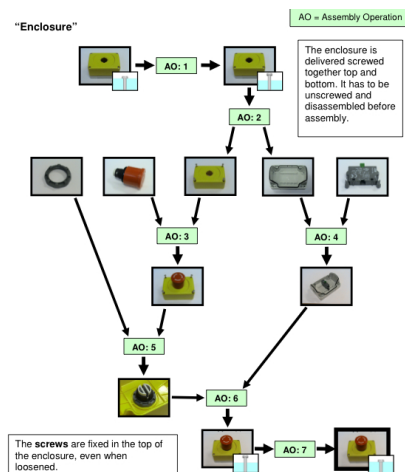
<http://asimov.ludat.lth.se>

```
select ?s where {
  ?s a rosetta:Camera.
}

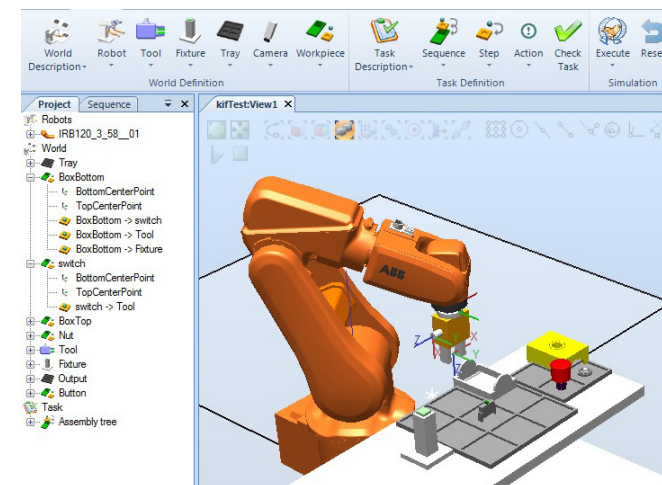
select distinct ?s ?v where {
  ?s a rosetta:Camera.
  ?s ?p ?n.
  ?n caex-xml:hasName "FocusRange".
  ?n caex-xml:hasValue ?v.
}
```



A real case

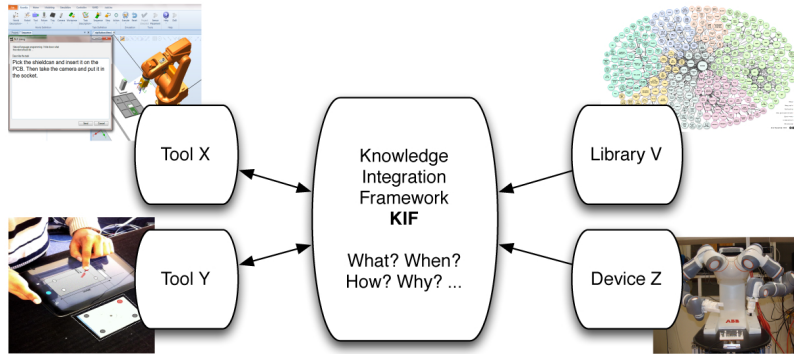


A real case

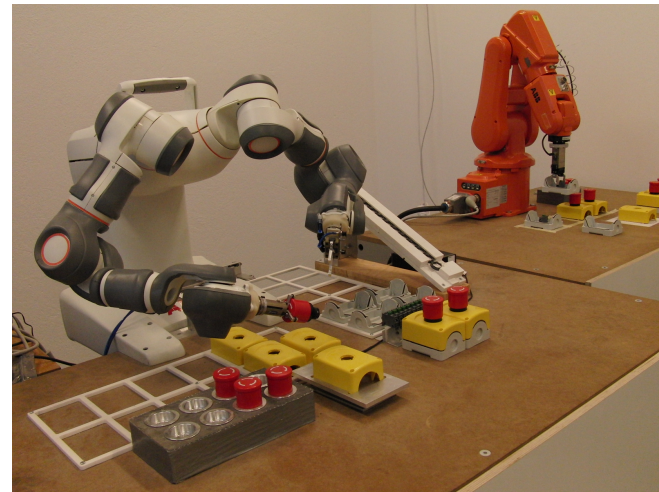




A real case



A real case



A real case

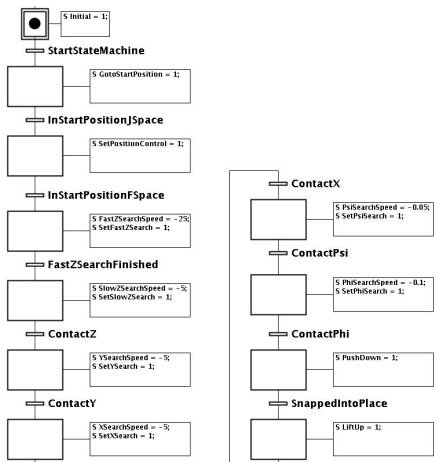


A real case

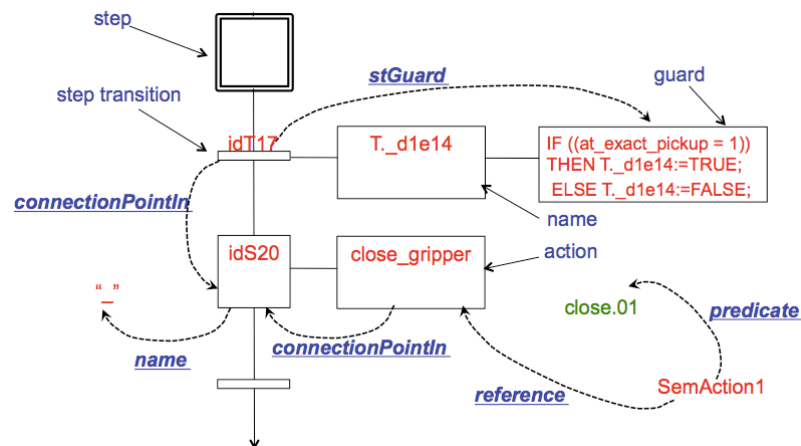




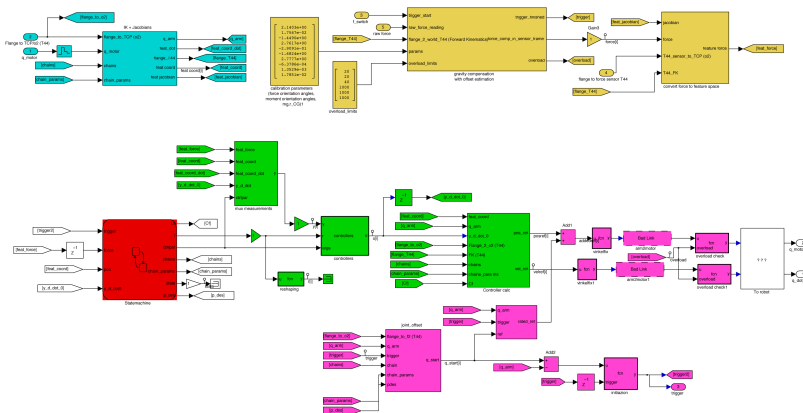
A real case



A real case



A real case



Next period: EDAN50

EDAN50 Intelligent Systems: Project

- topics proposed by us (PN, EAT, JM)
- but: you may choose your own
- personal supervision
- research-related problems
- workload: normal course, 7.5 hp
- Last chance this year!