

## CSE 3402: Intro to Artificial Intelligence Reasoning about action

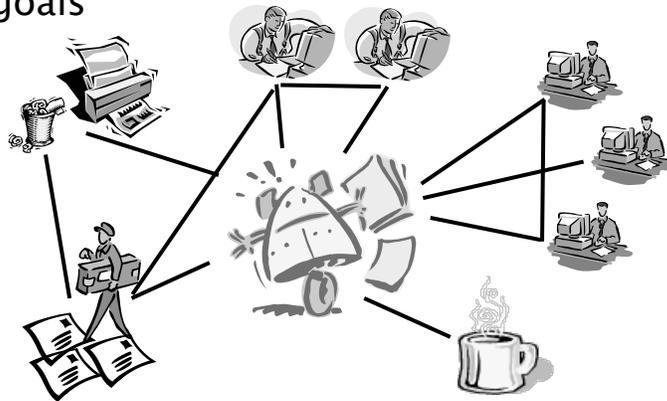
- Readings: Chapter 10 Sec. 10.4.2 (In 2<sup>nd</sup> edition Chapter 10 Sec. 3)

## Why Planning

- Intelligent agents must operate in the world. They are not simply passive reasoners (Knowledge Representation, reasoning under uncertainty) or problem solvers (Search), they must also act on the world.
- We want intelligent agents to act in “intelligent ways”. Taking purposeful actions, predicting the expected effect of such actions, composing actions together to achieve complex goals.

## Why Planning

- E.g. if we have a robot we want robot to decide what to do; how to act to achieve our goals

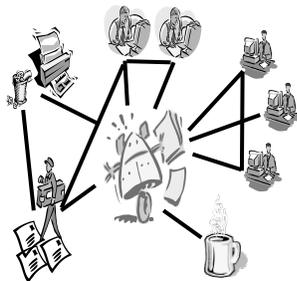


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3

## A Planning Problem

- How to *change* the world to suit our needs
- Critical issue: we need to reason about *what the world will be like* after doing a few actions, not *just* what it is like now



**GOAL:** Craig has coffee  
**CURRENTLY:** robot in mailroom, has no coffee, coffee not made, Craig in office, etc.  
**TO DO:** goto lounge, make coffee,...

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4

## Planning

- Reasoning about what the world will be like after doing a few actions is similar to what we have already examined.
- However, now we want to reason about dynamic environments.
  - `in(robby,Room1)`, `lightOn(Room1)` are true: will they be true after robby performs the action `turnOffLights`?
  - `in(robby,Room1)` is true: what does robby need to do to make `in(robby,Room3)` true?
- Reasoning about the effects of actions, and computing what actions can achieve certain effects is at the heart of decision making.

## Planning under Uncertainty

- Our knowledge of the world probabilistic.
- Sensing is subject to noise (especially in robots).
- Actions and effectors are also subject to error (uncertainty in their effects).

## Planning

- But for now we will confine our attention to the deterministic case.
- We will examine:
  - Determining the effects of actions.
  - finding sequences of actions that can achieve a desired set of effects.
    - This will in some ways be a lot like search, but we will see that representation also plays an important role.

## Situation Calculus

- First we look at how to model dynamic worlds within first-order logic.
- The situation calculus is an important formalism developed for this purpose.
- Situation Calculus is a first-order language.
- Include in the domain of individuals a special set of objects called situations. Of these  $s_0$  is a special distinguished constant which denotes the “initial” situation.

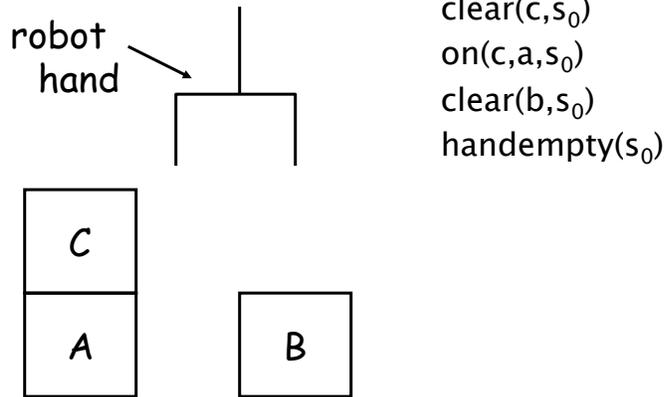
## Situation Calculus

- Situations are used to index “states” of the world. When dealing with dynamic environments, the world has different properties at different points in time.
- e.g.,  $\text{in}(\text{robby}, \text{room1}, s_0)$ ,  $\neg \text{in}(\text{robby}, \text{room3}, s_0)$   
 $\neg \text{in}(\text{robby}, \text{room3}, s_1)$ ,  $\text{in}(\text{robby}, \text{room1}, s_1)$ .
  - Different things are true in situation  $s_1$  than in the initial situation  $s_0$ .
  - Contrast this with the previous kinds of knowledge we examined.

## Fluents

- The basic idea is that properties that change from situation to situation (called fluents) take an extra situation argument.
  - $\text{clear}(b) \rightarrow \text{clear}(b, s)$ 
    - “ $\text{clear}(b)$ ” is no longer statically true, it is true contingent on what situation we are talking about

## Blocks World Example.



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11

## Actions in the Situation Calculus

- Actions are also part of language
  - A set of “primitive” action objects in the (semantic) domain of individuals.
  - In the syntax they are represented as functions mapping objects to primitive action objects.
  - pickup(X) function mapping blocks to actions
    - pickup(c) = “the primitive action object corresponding to ‘picking up block c’”
  - stack(X,Y)
    - stack(a,b) = “the primitive action object corresponding to ‘stacking a on top of b’”

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12

## Actions modify situations.

- There is a “generic” action application function  $do(A,S)$ .  $do$  maps a primitive action and a situation to a new situation.
  - The new situation is the situation that results from applying  $A$  to  $S$ .
- $do(pickup(c), s_0) =$  the new situation that is the result of applying action “pickup(c)” to the initial situation  $s_0$ .

## What do Actions do?

- Actions affect the situation by changing what is true.
  - $on(c,a,s_0); clear(a,do(pickup(c),s_0))$
- We want to represent the effects of actions, this is done in the situation calculus with two components.

## Specifying the effects of actions

- Action preconditions. Certain things must hold for actions to have a predictable effect.
  - pickup(c) this action is only applicable to situations S where “clear(c,S)  $\wedge$  handempty(S)” are true.
- Action effects. Actions make certain things true and certain things false.
  - holding(c, do(pickup(c), S))
  - $\forall X. \neg \text{handempty}(\text{do}(\text{pickup}(X), S))$

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15

## Specifying the effects of actions

- Action effects are conditional on their precondition being true.

$\forall S, X.$

$\text{ontable}(X, S) \wedge \text{clear}(X, S) \wedge \text{handempty}(S)$   
 $\rightarrow$  holding(X, do(pickup(X), S))  
 $\wedge \neg \text{handempty}(\text{do}(\text{pickup}(X), S))$   
 $\wedge \neg \text{ontable}(X, \text{do}(\text{pickup}(X), S))$   
 $\wedge \neg \text{clear}(X, \text{do}(\text{pickup}(X), S)).$

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16

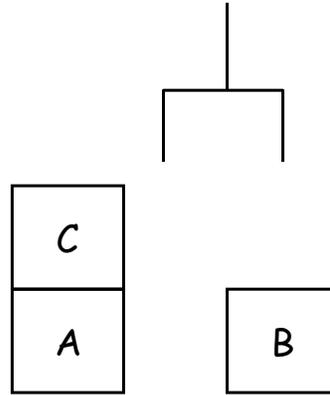
## Reasoning with the Situation Calculus.

1.  $\text{clear}(c, s_0)$
2.  $\text{on}(c, a, s_0)$
3.  $\text{clear}(b, s_0)$
4.  $\text{ontable}(a, s_0)$
5.  $\text{ontable}(b, s_0)$
6.  $\text{handempty}(s_0)$

Query:

7.  $\exists Z. \text{holding}(b, Z)$
7.  $(\neg \text{holding}(b, Z), \text{ans}(Z))$

does there exist a situation in which we are holding b? And if so what is the name of that situation.



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17

## Resolution

- Convert “pickup” action axiom into clause form:

$\forall S, Y.$   
 $\text{ontable}(Y, S) \wedge \text{clear}(Y, S) \wedge \text{handempty}(S)$   
 $\rightarrow \text{holding}(Y, \text{do}(\text{pickup}(Y), S))$   
 $\wedge \neg \text{handempty}(\text{do}(\text{pickup}(Y), S))$   
 $\wedge \neg \text{ontable}(Y, \text{do}(\text{pickup}(Y), S))$   
 $\wedge \neg \text{clear}(Y, \text{do}(\text{pickup}(Y), S)).$

8.  $(\neg \text{ontable}(Y, S), \neg \text{clear}(Y, S), \neg \text{handempty}(S), \text{holding}(Y, \text{do}(\text{pickup}(Y), S)))$
9.  $(\neg \text{ontable}(Y, S), \neg \text{clear}(Y, S), \neg \text{handempty}(S), \neg \text{handempty}(\text{do}(\text{pickup}(X), S)))$
10.  $(\neg \text{ontable}(Y, S), \neg \text{clear}(Y, S), \neg \text{handempty}(S), \neg \text{ontable}(Y, \text{do}(\text{pickup}(Y), S)))$
11.  $(\neg \text{ontable}(Y, S), \neg \text{clear}(Y, S), \neg \text{handempty}(S), \neg \text{clear}(Y, \text{do}(\text{pickup}(Y), S)))$

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18

## Resolution

12. R[8d, 7]{Y=b,Z=do(pickup(b),S)}  
(¬ontable(b,S), ¬clear(b,S), ¬handempty(S),  
ans(do(pickup(b),S)))
13. R[12a,5] {S=s<sub>0</sub>}  
(¬clear(b,s<sub>0</sub>), ¬handempty(s<sub>0</sub>),  
ans(do(pickup(b),s<sub>0</sub>)))
14. R[13a,3] {}  
(¬handempty(s<sub>0</sub>), ans(do(pickup(b),s<sub>0</sub>)))
15. R[14a,6] {}  
ans(do(pickup(b),s<sub>0</sub>))

## The answer?

- ans(do(pickup(b),s<sub>0</sub>))
- This says that a situation in which you are holding b is called “do(pickup(b),s<sub>0</sub>)”
- This name is informative: it tells you what actions to execute to achieve “holding(b)”.

## Two types of reasoning.

- In general we can answer questions of the form:

$on(b,c,do(stack(b,c), do(pickup(b), s_0)))$

$\exists S. on(b,c,S) \wedge on(c,a,S)$

- The first involves predicting the effects of a sequence of actions, the second involves computing a sequence of actions that can achieve a goal condition.

## The Frame Problem

- Unfortunately, logical reasoning won't immediately yield the answer to these kinds of questions.
- e.g., query:  $on(c,a,do(pickup(b),s_0))$ ?
  - is c still on a after we pickup b?
  - Intuitively it should be
  - Can logical reasoning reach this conclusion?

## The Frame Problem

1. `clear(c,s0)`
2. `on(c,a,s0)`
3. `clear(b,s0)`
4. `ontable(a,s0)`
5. `ontable(b,s0)`
6. `handempty(s0)`
8. `(¬ontable(Y,S), ¬clear(Y,S), ¬handempty(S),  
holding(Y,do(pickup(Y),S))`
9. `(¬ontable(Y,S), ¬clear(Y,S), ¬handempty(S),  
¬handempty(do(pickup(X),S)))`
10. `(¬ontable(Y,S), ¬clear(Y,S), ¬handempty(S),  
¬ontable(Y,do(pickup(Y),S)))`
11. `(¬ontable(Y,S), ¬clear(Y,S), ¬handempty(S),  
¬clear(Y,do(pickup(Y),S)))`
12. `¬on(c,a,do(pickup(b),s0))` {QUERY}

Nothing can resolve with 12!

## Logical Consequence

- Remember that resolution only computes logical consequences.
- We stated the effects of `pickup(b)`, but did not state that it doesn't affect `on(c,a)`.
- Hence there are models in which `on(c,a)` no longer holds after `pickup(b)` (as well as models where it does hold).
- The problem is that representing the non-effects of actions very tedious and in general is not possible.
  - Think of all of the things that `pickup(b)` does not affect!

## The Frame Problem

- Finding an effective way of specifying the non-effects of actions, without having to explicitly write them all down is the frame problem.
- Very good solutions have been proposed, and the situation calculus has been a very powerful way of dealing with dynamic worlds:
  - logic based high level robotic programming languages

## Computation Problems

- Although the situation calculus is a very powerful representation. It is not always efficient enough to use to compute sequences of actions.
- The problem of computing a sequence of actions to achieve a goal is “planning”
- Next we will study some less rich representations which support more efficient planning.