

## Planning

A plan is a sequence of actions

- It should lead from an initial state to some desired target state.
- Actions can be represented like predicates, e.g.  
fly(g-avrl, sfo, jfk).
- But they aren't predicates: they are clearly not true or false.
- States can be represented by logical formulæ, e.g.  
aboard(fred, g-avrl)  $\wedge$  at(g-avrl, sfo)
- Here the parts really are like predicates, but they are called Fluents
- They can change between true and false as events progress
- States are always just conjunctions  
No  $\vee$ 's: at this stage they can't represent uncertainty

Actions have Preconditions

- The action can only be taken if the precondition is true  
e.g. for the action fly(P, From, To), the precondition might be  
at(P, From)  $\wedge$  is-aeroplane(P)  $\wedge$  is-airport(From)  $\wedge$  is-airport(To)  
Usually they only contain  $\wedge$ 's and  $\neg$ 's.
- Actions also have Effects, which are also logical formulæ  
e.g. for the action fly(P, From, To), the effect might be  
 $\neg$ at(P, From)  $\wedge$  at(P, To)  
The effect is always just a conjunction, maybe with some  $\neg$ 's
- An Action Schema is used to connect everything together:  
Action(fly(P, From, To),  
PRECOND: at(P, From)  $\wedge$  aero(P)  $\wedge$  airpt(From)  $\wedge$  airpt(To)  
EFFECT:  $\neg$ at(P, From)  $\wedge$  at(P, To))
- Ugly syntax, just to save work
- A Ground Action has all of its variables replaced by actual values, e.g.  
fly(g-avrl, sfo, jfk)
- A ground action is Applicable in a state  
If that state implies its precondition

A Problem in this world consists of

- A Goal: the state we want things in at the end
- An initial state: how things are before we start  
The goal and initial states must be Ground States:  
they contain no variables, only constants
- A list of the actions that can be used

The solution to a problem is a Plan, just a sequence of actions:

[ get-on(fred, g-avrl), fly(g-avrl, sfo, jfk), get-off(fred, g-avrl) ]

A PDDL (Planning Domain Definition Language) example:

```
Init( at(c1, sfo)  $\wedge$  at(c2, jfk)  $\wedge$  at(g-avrl, sfo)  $\wedge$  at(ja8089, jfk)
       $\wedge$  is-cargo(c1)  $\wedge$  is-cargo(c2)  $\wedge$  is-plane(g-avrl)  $\wedge$  is-plane(ja8089)
       $\wedge$  is-airport(sfo)  $\wedge$  is-airport(jfk) )
Goal( at(c1, jfk)  $\wedge$  at(c2, sfo) )
```

Action( load(Cargo, Plane, Airport),  
 PRECOND: at(Cargo, Airport)  $\wedge$  at(Plane, Airport)  
 $\wedge$  is-cargo(Cargo)  $\wedge$  is-plane(Plane)  $\wedge$  is-airport(Airport),  
 EFFECT:  $\neg$ at(Cargo, Airport)  $\wedge$  inside(Cargo, Plane) )  
 Action( unload(Cargo, Plane, Airport),  
 PRECOND: inside(Cargo, Plane)  $\wedge$  at(Plane, Airport)  
 $\wedge$  is-cargo(Cargo)  $\wedge$  is-plane(Plane)  $\wedge$  is-airport(Airport),  
 EFFECT:  $\neg$ inside(Cargo, Plane)  $\wedge$  at(Cargo, Airport) )  
 Action( fly(Plane, From, To),  
 PRECOND: at(Plane, From)  $\wedge$  is-plane(Plane)  $\wedge$  is-airport(From)  
 $\wedge$  is-airport(To),  
 EFFECT:  $\neg$ at(Plane, From)  $\wedge$  at(Plane, To) )

A very famous example

- The “blocks” world
  - “Pick up a big red block”
- Init( on(a, table)  $\wedge$  on(b, table)  $\wedge$  on(c, a)  
 $\wedge$  is-block(a)  $\wedge$  is-block(b)  $\wedge$  is-block(c)  
 $\wedge$  clear(b)  $\wedge$  clear(c)  $\wedge$  clear(table) )  
 Goal( on(a, b)  $\wedge$  on(b, c) )  
 Action( move-to-block(Block, From, To),  
 PRECOND: on(Block, From)  $\wedge$  clear(Block)  $\wedge$  clear(To)  
 $\wedge$  is-block(Block)  $\wedge$  is-block(To)  
 $\wedge$  Block $\neq$ From  $\wedge$  Block $\neq$ To  $\wedge$  From $\neq$ To,  
 EFFECT: on(Block, To)  $\wedge$  clear(From)  $\wedge$   $\neg$ on(Block, From)  $\wedge$   $\neg$ clear(To))  
 Action( move-to-table(Block, From),  
 PRECOND: on(Block, From)  $\wedge$  is-block(Block)  $\wedge$  is-block(From)  
 $\wedge$  clear(Block),  
 EFFECT: on(Block, table)  $\wedge$  clear(From)  $\wedge$   $\neg$ on(Block, From) )

Formulating a plan

- Finding a plan is just another search
- But we are searching for a big complicated thing this time: a plan
- For any real example, the state space will be very big  
 We will need a good heuristic
- Closed World assumption: states don't *need* to include things that are false  
 but usually they do  
 An effect including  $\neg$  just removes that fluent from the state.
- Partially ordered plans?

Forward search

- Start at initial state
- Unify current state with preconditions for each action
- Whenever successful,  
 Apply the substitution to the action to find a step in the plan  
 Apply the substitution to the effects and  
 add them to the current state to find the next state

### Backward search, or Regression search

- Start at the goal state
- Unify current state with effects of each action
  - but don't allow any effects that negate any part of the goal
  - what if the successful plan involves a desired fluent being false for just a little while?
- Whenever successful,
  - Apply the substitution to the action to find a step in the plan
  - Generate the next state by
    - removing any positive fluents in the effect from the goal,
    - adding any positive fluents in the precondition,
    - removing any negative fluents in the effect,
    - adding any negative fluents in the precondition.
  - So in this case, states *do* have to include negative fluents too.
- Many times, a backward search can have far fewer next states to explore at each step

### Heuristics

- An admissible heuristic never over-estimates the remaining cost
- Sometimes relaxing the problem reveals a good heuristic:
  - an exact cost in the relaxed problem can be a heuristic in the original
  - but for that to be practical, the relaxed problem must be very quick and easy to solve.
- Maybe just ignore all the preconditions, that certainly won't over-estimate
- Any goal fluent can be made true with just one action
  - If it can be made true at all, that is
- Back to the eight puzzle for an example:
  - Action( slide(Tile, From-square, To-square),
  - PRECOND: is-tile(Tile)  $\wedge$  is-empty(To-square)
  - $\wedge$  in(Tile, From-square)  $\wedge$  adjacent(From-square, To-square),
  - EFFECT: in(Tile, From-square)  $\wedge$  is-empty(From-square)
  - $\wedge$   $\neg$ in(Tile, To-square)  $\wedge$   $\neg$ is-empty(To-square) )
- Ignoring *all* the preconditions is silly
  - You'd even try moving things that aren't tiles
- Ignore is-empty(To-square)  $\wedge$  adjacent(From-square, To-square)
  - Any tile can move anywhere in one go
  - The heuristic is the number of out-of-place tiles
- Only ignore is-empty(To-square)
  - Any tile can move to any adjacent square even if it's occupied
  - The heuristic is the Manhattan Distance

### High-level actions (HLAs)

- A complete plan for an autonomous robot can have *very* many actions
  - To get from one place to another, a robot must activate its tiny little motors in exactly the right order for every single step taken
- Fortunately, plans in the real world tend to be very hierarchical
- One single *very* high-level action can be a complete plan

- [ move-from-to(lab, repair-shop) ]
- this can be resolved into a plan involving *quite* high-level actions
  - [ move-from-to(lab, corridor-outside-lab),  
 move-from-to(corridor-outside-lab, corridor-outside-repair-shop),  
 move-from-to(corridor-outside-repair-shop, repair-shop) ]
- each of those actions are resolved by their own individual plans involving slightly lower-level actions
- and so on, all the way down to plans involving the most basic actions which the robot can actually physically do, e.g. activate or deactivate a motor
- All of those sub-plans can be discovered individually when the time comes
- and just concatenated together

#### Non-determinism

- Perhaps you can't be sure what the state of the world is  
 you haven't got a sensor for that particular thing
- Or perhaps you can't be sure what effect an action will actually cause  
 turning the wheels might not move the vehicle, it might be muddy
- When a problem can be solved by more than one possible plan a choice must be made
- Angelic selection: the agent can choose which plan to take  
 Only requires that just one of the possible plans would work
- Dæmonic selection: something else, the environment, forces the choice  
 Requires that every single possible plan must work
- But really, a plan isn't a solution if it doesn't achieve the goal  
 A plan is a sequence of actions that solves a problem.