

CSC384: Lecture 8

- Last time
 - Action Representation; planning as search
- Today
 - STRIPS Planning, Regression planning
- Readings:
 - Today: 8.3 (STRIPS planning in depth, regression planning, briefly resolution-based planning)
 - Next week: uncertainty 10.1, 10.2, start on 10.3

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STRIPS Planner

- Last time, discussed intuitive sketch of STRIPS
 - a divide-and-conquer approach
 - tries to find independent plans for individual subgoals and then pieces these plans together
 - recursively tries to achieve necessary preconditions
- We'll sketch a version of the algorithm designed to work with the CWR-D representation
 - contrast with algorithm in text, which is designed to work with the situation calculus representation

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STRIPS with CWR-D

- `achieve_all(GList, S0, S1, Plan)`
 - action sequence Plan applied at state S0 results in state S1, satisfying all goals in GList

```
achieve_all( [], S, S, [] ).

achieve_all( GList, S0, S2, Plan ) :-
    remove(Goal, GList, RestG),
    achieve(Goal, S0, S1, Plan1),
    achieve_all(RestG, S1, S2, Plan2),
    append(Plan1, Plan2, Plan).
```

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STRIPS w/ CWR-D: Goal Selection

- `remove(G, GList, RestG)`
 - selects a goal G from goal list for achievement
 - implementation #1 below always selects first goal
 - note: we'll see that allowing different orderings is important---it should really be a "choose" not "select"
 - implementation #2 allows backtracking

#1 `remove(G, [G | RestG], RestG).`

#2 `remove(G, GList, RestG) :-
 member(G, GList),
 delete(G, GList, RestG).`

removes arbitrary
element G from
list GList

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STRIPS w/ CWR-D: Goal Achievem't

- `achieve(G, S0, S1, Plan)`
 - action sequence Plan applied at state S0 results in state S1, satisfying all goal G (single goal)
 - all predicates used defined earlier except `effect_of`
 - `effect_of(A, G)`: action A has G as an effect (exercise)

```
achieve( G, S, S, [] ) :- holds(G, S).

achieve( G, S0, S2, Plan ) :-
    effect_of( A, G ), preconds(A, PCList),
    achieve_all(PCList, S0, S1, Plan1),
    append(Plan1, [A], Plan),
    result(A, S1, S2).
```

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STRIPS: Handling Derived Relations

- If we have derived relations, STRIPS can't directly achieve such a fact (not mentioned as effects of any actions)
 - so simply set Body as subgoals to achieve

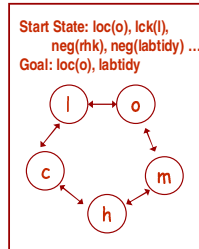
```
achieve( G, S0, S1, Plan ) :-
    derivedRel(G, Body),
    achieve_all(Body, S0, S1, Plan).
```

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Issues with STRIPS (1)

- Order of goal selection can impact quality/length of plan
 - e.g., we picked `mov(l,o)` to achieve `loc(o)` in final plan step; but what if we had picked `mov(m,o)`?
 - might have picked `mov(h,m)`, then `mov(c,h)`, etc. and taken long way around
 - might have gotten in a cycle
- In general, goal selection ordering can benefit from heuristics; and can even require systematic search/backtracking



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Issues with STRIPS (2)

- STRIPS can return incorrect plans!
 - suppose we chose goal `loc(o)` before `labtidy`
 - plan for `loc(o)` is `[]` (it's true in initial state `s0`)
 - plan for `labtidy` is `[getkeys, mov(o,l), tidy]`
 - the second plan destroys or *clobbles* the subgoal achieved by the first plan!
 - so returned plan `[] + [gk,m(o,l),t]` is incorrect
- Subgoal protection:**
 - circumvents this problem by protecting achieved subgoals when producing plans for the next subgoals

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Subgoal Protection

- Given k goals $[g_1, \dots, g_k]$ in this order
 - produce a subplan that achieves g_1 (say p_1)
 - produce a subplan p_2 that produces that achieves g_2 *without affecting* g_1
 - in general, produce a plan p_i for g_i that does not affect any g_h ordered before g_i
 - Solution $p_1; p_2; \dots p_k$ guaranteed to achieve all goals

```

achieve_all( GList, S0, S2, Plan, Protected ) :-
    remove(Goal, GList, RestG),
    achieve(Goal, S0, S1, Plan1, Protected),
    achieve_all(RestG, S1, S2, Plan2, [Goal | Protected]),
    append(Plan1, Plan2, Plan).
    
```

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Subgoal Protection (con't)

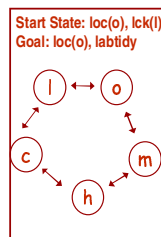
- Key to above algorithm:
 - `achieve(G, S0, S1, Plan, Protected)` is not allowed to construct a subplan that "touches" any literal in the protected list
 - exercise: try it (tricky to do this with derived rel'ns)

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Example of Protection (1)

- If we choose `loc(o)` first:
 - we get plan $p_1 = []$ (`loc(o)` true in S_0)
 - we protect `loc(o)` --- it's already achieved
 - attempt to find plan to achieve `labtidy` without altering `loc(o)`
 - impossible because of protection
- Once it fails, we retry with `labtidy` as first goal
 - this will succeed as in original example
 - notice that it's critical to allow algorithm to backtrack over goal choices so it can try a different ordering

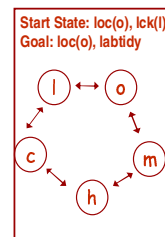


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Example of Protection (2)

- Same example, but suppose action `mov(l,o)` magically makes `labtidy` false!
- Choose `labtidy` as first goal
 - we get plan $p_1 = [\text{getkeys}, \text{mov(o,l), tidy}]$
 - we protect `labtidy`
 - attempt to find plan to achieve `loc(o)` without altering `labtidy`
 - try to achieve `loc(o)` using `mov(l,o)`; but this undoes `labtidy`, so fails due to protection
 - try to achieve `loc(o)` using `mov(m,o)`; this works; sets up subgoal of `loc(m)`; etc.
 - soln: tidy the lab then go back to office the long way around
- Subgoal protection has desired effect



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Is STRIPS with SGP “Complete”?

- STRIPS with subgoal protection is sound
 - if it returns a plan, the plan is correct (achieves goals)
- But STRIPS with SGP is not complete
 - it may not find a plan even if it exists
 - this is true even if it searches over all goal orderings
 - this is due to its notion of achievement
- Why? Let's consider an example...

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Problems with STRIPS (3)

- Example using only two locations -- loc(o), loc(c)
 - but if robot in office and Craig has coffee, if robot leaves office, C throws coffee against wall in megalomaniacal fit of rage (robot must watch C drink)
 - so action mov(o,c) has effect neg(chc)
 - Start: neg(cm), neg(chc), neg(rhc), loc(c)
 - Goal: **chc, cm**
- To solve, STRIPS must solve with
 - ordering #1: cm then chc; or
 - ordering #2: chc then cm

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Problems with STRIPS (3)

- Ordering #1: cm then chc is not suitable
 - you could achieve cm by simply making coffee
 - If you did that, any way of achieving chc would clobber cm. Robot must grabcoffee – neg(cm) – to give it to Craig
 - Note: you could [makecof, grabcof, makecof] and then take coffee to Craig; but STRIPS won't consider this, since once you achieve cm you can't clobber it. The only reason to consider it is if STRIPS looks ahead to next goal
- Ordering #2: chc then cm is not suitable
 - once you make chc true by the usual plan (make, grab, move, give), can't leave office to make more
 - Note: you could [makecf, grabcf, makecf, mov, givecf]; but unless it looks ahead to next goal, STRIPS has no reason to consider this

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Serializability

- A set of goals G is *serializable* (wrt s0) if there is some ordering of the goals $[g_1, \dots, g_k]$ s.t.
 - you can achieve g_1 from s0
 - you can achieve g_2 without clobbering g_1 *no matter what plan you used to achieve g_1*
 - you can achieve g_3 without clobbering g_1, g_2 *no matter what plan you used to achieve g_1, g_2 , etc...*
- STRIPS-SGP can solve any *serializable* goal set
 - backtracking over goal orderings must be allowed
- Note: earlier example is not serializable
 - success depends on the plan chosen
 - but we can't allow STRIPS to consider arbitrary plans or we lose the benefits of divide and conquer

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STRIPS Summary

- STRIPS biggest problem:
 - forced to completely solve one subgoal before considering how it affects other goals
 - with subgoal protection we get correct plans, but only if subgoal set is serializable
 - but this prevents you from finding plans where goals interact strongly
- A different view: regression planning
 - when you insert an action into a plan, you *consider* how it influences all current subgoals
 - but you still focus on achieving one subgoal

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Regression Planning: Intuitions

- Basic idea behind regression is quite simple:
 - given a goal list G, the *regression* of G through action A is the *weakest set of preconditions* WC that ensure G is true after A is performed
 - In other words:
 - if WC holds at state S, then G holds at result(A,S)
 - no logically weaker set of conditions satisfies this property
- This leads to an obvious *subgoaling* strategy
 - given G, find an action A “that makes progress” on G
 - find a plan P' that achieves WC
 - then return the plan $P = [P', A]$

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Regression Example

- Let's look at intuitions before getting into details
 - consider nonserializable example with $G = [chc, cm]$

$G = [chc, cm]$
 Regress G through givecoffee: $SG1 = [rhc, loc(o), cm]$
 $SG1 = [rhc, loc(o), cm]$
 Regress through mov(c,o): $SG2 = [rhc, loc(c), cm]$
 $SG2 = [rhc, loc(c), cm]$
 Regress through makecoffee: $SG3 = [rhc, loc(c)]$
 $SG3 = [rhc, loc(c)]$
 Regress through grabcoffee: $SG4 = [cm, loc(c)]$
 $SG4 = [cm, loc(c)]$
 Regress through makecoffee: $SG5 = [loc(c)]$
 $SG5$: True at initial state

If S satisfies
 $[rhc, loc(o), cm]$
 then $result(A, S)$
 satisfies $[chc, cm]$

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Regression Planning

- We first need to define the notion of regression formally (and basic idea behind implementation)
- We then need to define a planner that relies on the notion of regression

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Regression Planning

- Basic structure of the algorithm:
 - start with subgoal (SG) list equal to goal list
 - Loop:
 - choose an action A that:
 - achieves at least one subgoal on SG list
 - doesn't destroy any other subgoals on list
 - preconds are consistent with other subgoals
 - regress SG list through action A to obtain SG_{New}
 - set SG list to SG_{New}
 - until all elements in SG list are true in S_0
- Conditions b, c necessary, otherwise A cannot make SG list true (more to come)

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Why Conditions (b) and (c)

- Why we need condition (b)
 - action a : precondition x ; effects y , neg(z)
 - subgoals $SG = [y, z]$
 - impossible to do action a and (immediately) result in a state where SG is true: a achieves y , but makes z false
- Why we need condition (c)
 - action a : precondition x , neg(z); effects y
 - subgoals $SG = [y, z]$
 - impossible to do action a and (immediately) result in a state where SG is true: a achieves y , but requires z to be false when executed; since a doesn't affect z , z must be false immediately after doing a
- Note: (b) and (c) ensure regression is "possible"

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Defining Regression for CWR (1)

- regress(A, GL, WP)**
 - true if: WP is the weakest precondition such that executing A when WP holds results in goal list GL becoming true; WP is consistent
 - fails if no such consistent WP exists
 - assumes GL is consistent already

```
regress(A, GL, WP) :-
    removeeffects(A, GL, WGL),
    preconds(A, PC),
    addpreconds(PC, WGL, WP).
```

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Defining Regression for CWR (2)

- removeeffects(A, GL, WGL)**
 - true if WGL obtained by removing effects of A from goal list GL (fails if any goal contradicts effect of A)
 - version for "nonboolean" predicates posted online

```
removeeffects(_, [], []).
removeeffects(A, [G|RestG], WGL) :-
    achieves(A, G),
    removeeffects(A, RestG, WGL),
    removeeffects(A, [G|RestG], [G|RestWGL]) :-
        G \= neg(_),
        not(achieves(A, G)),
        not(achieves(A, neg(G))),
        removeeffects(A, RestG, RestWGL),
    removeeffects(A, [neg(G)|RestG], [neg(G)|RestWGL]) :-
        not(achieves(A, G)),
        not(achieves(A, neg(G))),
        removeeffects(A, RestG, RestWGL).
```

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Defining Regression for CWR (3)

- Simple auxiliary predicate “achieves”

```
% action A achieves goal G
achieves(A,G) :- addlist(A,AList),
                 member(G,AList).

achieves(A,neg(G)) :- deletelist(A,DList),
                     member(G,DList).
```

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Defining Regression for CWR (4)

- regress(A,GL,WP)**
 - true if: WP is the weakest precondition such that executing A when WP holds results in goal list GL becoming true; WP is consistent
 - fails if no such consistent WP exists
 - assumes GL is consistent already

```
regress(A,GL,WP) :-
  removeeffects(A,GL,WGL),
  preconds(A,PC),
  addpreconds(PC,WGL,WP).
```

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Defining Regression for CWR (4)

- addpreconds(PC,WGL,WP)**
 - true if: WP results from adding preconditions PC to (weakened) goal list WGL, and result is consistent
 - fails if preconditions conflict with WGL.
 - WGL is assumed consistent.

```
addpreconds([],WP,WP).
addpreconds([P|RestP],L,WP) :-
  addconsistent(P,L,L1),
  addpreconds(RestP,L1,WP).
```

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Defining Regression for CWR (5)

- To add precondition consistently (fails if precondition contradicts subgoal list)

```
addconsistent(P,L,L) :- member(P,L).

addconsistent(P,L,[P|L]) :-
  P \= neg(_),
  not(member(P,L)),
  not(member(neg(P),L)).

addconsistent(neg(P),L,[neg(P)|L]) :-
  not(member(P,L)),
  not(member(neg(P),L)).
```

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Regression Planner

- rplan(GoalList,State,Plan)**
 - true if Plan achieves GoalList starting at State
- Basic intuition: see slide 4

```
rplan(GList,State,[]) :-
  holdsall(GList,State).

rplan(GList,State,Plan) :-
  member(Goal,GList),
  achieves(A,Goal),
  regress(A,GList,NewGList),
  rplan(NewGList,State,Plan1),
  append(Plan1,[A],Plan).
```

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Some Notes on rplan

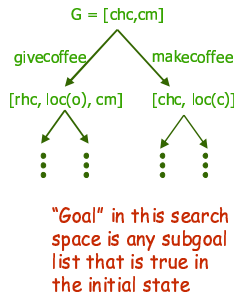
- We assume that initial goal list is consistent
 - we ensure subgoal lists remain consistent in “regress”
- Search occurs with goal and action choices
 - member(Goal,GList) chooses a goal to achieve
 - achieves(A,Goal) chooses action to achieve it
 - backtracking taken care of by Prolog
- This implementation will never work in practice!
 - by allowing Prolog to do the search, we’re committing to DFS without cycle checking!
- Exercise (asst?): fix this by controlling search yourself (don’t hand it off to Prolog)
 - e.g., use BrFS or iterative deepening

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Wrap up of Regression Planning

- Main idea: we are reasoning **backward** from the goal conditions to S0
 - choose a goal and an action that achieves it
 - search space is not the set of states, but the set of subgoal lists (nbrs are subgoal lists we can reach by regressing consistently through some "useful" action)



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Planning

- Most modern planners more sophisticated than STRIPS/regression
 - but most rely on basic ideas of decomposition and the idea of "regressing" (reasoning backward) from goal
- Partial-order planning (see 8.3 of text)
 - exploits "least commitment" idea by choosing actions without committing to their order right away
 - nice ideas, but computationally expensive in practice
- Planning as search quite common (fast)
 - use backchaining ideas to guide search/generate heuristics
 - sophisticated search used (e.g., stochastic search)

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Situation Calculus

- SC an alternative representation for actions
- A logical language in which
 - situations are terms (e.g., init, s27, S0)
 - *init* a special constant referring to initial state
 - actions are terms (e.g., mov(X,Y), mov(o,l), getkeys)
 - do(A,S) refers to situation that results from doing A in situation S (*do* a special function symbol)
 - domain predicate all have a situation argument (e.g., rhc(s27), or loc(m,init))

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SitCalc: Example expressions

- Situations (states of world, but w/ action history)
 - init
 - do(grabcof, init)
 - do(grabcof, S)
 - do(givecof, do(mov(c,o), do(grabcof, init)))
 - corresponds to sequence: grab, move, give at init
- Statements about what's true
 - loc(c, init)
 - cm(init)
 - rhc(do(grabcof, init))
 - chc(do(givecof, do(mov(c,o), do(grabcof, init))))

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Actions in the SitCalc

- We specify actions by specifying preconditions and effects
- Preconditions specified using the **poss** predicate

`poss(givecof, S) <- rhc(S), loc(o,S).`

`poss(mov(X,Y), S) <- adj(X,Y,S), acc(Y,S), loc(X,S).`

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Effect Axioms

- Action effects specified using effect axioms

```
chc(do(givecof,S)) <- poss(givecof,S).
loc(Y,do(mov(X,Y),S)) <- poss(mov(X,Y), S).
```

- Sadly, specifying effects alone logically insufficient
 - how do we know if labtdy is true after doing givecof?
 - must explicitly specify **frame axioms** stating that unaffected things remain unchanged after an action

```
lbtdy(do(givecof,S)) <- poss(givecof,S), lbtdy(S).
rhk(do(givecof,S)) <- poss(givecof,S), lbtdy(S).
```

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Reasoning in the SitCalc

- You can use these axioms to prove that certain things are true or false after performing a sequence of actions
 - provide action specifications (incl. frame axioms)
 - state what is true at init (e.g., `loc(c,init)`, `cm(init)`,...)
 - ask query, e.g.,
 - `?- chc(do(givecof, do(mov(c,o), do(grabcdf, init))))`.
- If axioms allow proof, then you know `chc` is true after this sequence from init
 - but must rely on negation as failure for false things
 - no way to prove “`neg(cm)`” after `grabcdf` otherwise

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Planning as Theorem Proving

- You can now use SLD to construct a plan
 - given init specification, poss and effect axioms
 - given a goal `G` such as `[chc, cm]`
 - ask the query: `?- chc(S), cm(S)`.
- SLD will return an answer in which variable `S` is bound to a situation term from which plan can be extracted; e.g.
 - `S = do(givecof, do(mov(c,o), do(makecof, do(grabcdf, do(makecof, init))))`
- Computationally: this relies on SLD/Prolog doing usual DFS (so may not work very well)

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