

# Informatics 2D: Reasoning and Agents

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Lecture 17b: Partial Order Planning

# Where are we?

Last time. . .

- Planning using state-space search (forward/backward)

Now:

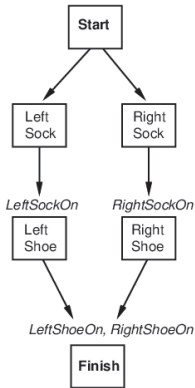
- **Partial-order Planning**

# Partial-order planning

- State-space search planning algorithms consider **totally ordered** sequences of actions
- Better not to commit ourselves to complete chronological ordering of tasks (**least commitment** strategy)
- **Basic idea:**
  - 1 Add actions to a plan without specifying which comes first unless necessary
  - 2 Combine 'independent' subsequences afterwards
- Partial-order solution will correspond to one or several **linearisations** of partial-order plan
- Search in **plan space** rather than state spaces (because your search is over ordering constraints on actions, as well as transitions among states).

# Example: Put your socks and shoes on

Partial-Order Plan:



Total-Order Plans:



# Partial-order planning (POP) as a search problem

Define POP as search problem over plans consisting of:

- **Actions**; initial plan contains dummy actions *Start* (no preconditions, effect=initial state) and *Finish* (no effects, precondition=goal literals)
- **Ordering constraints** on actions  $A \prec B$  ( $A$  must occur before  $B$ ); contradictory constraints prohibited
- **Causal links** between actions  $A \xrightarrow{p} B$  express  $A$  achieves  $p$  for  $B$  ( $p$  precondition of  $B$ , effect of  $A$ , must remain true between  $A$  and  $B$ ); inserting action  $C$  with effect  $\neg p$  ( $A \prec C$  and  $C \prec B$ ) would lead to **conflict**
- **Open preconditions**: set of conditions not yet achieved by the plan (planners try to make open precondition set empty without introducing contradictions)

# The POP algorithm

- Final plan for socks and shoes example (without trivial ordering constraints):

Actions:  $\{RightSock, RightShoe, LeftSock, LeftShoe, Start, Finish\}$

Orderings:  $\{RightSock \prec RightShoe, LeftSock \prec LeftShoe\}$

Links:  $\{RightSock \xrightarrow{RightSockOn} RightShoe,$   
 $LeftSock \xrightarrow{LeftSockOn} LeftShoe,$   
 $RightShoe \xrightarrow{RightShoeOn} Finish,$   
 $LeftShoe \xrightarrow{LeftShoeOn} Finish\}$

Open preconditions:  $\{\}$

- Consistent plan** = plan without cycles in orderings and conflicts with links
- Solution** = consistent plan without open preconditions
- Every linearisation of a partial-order solution is a total-order solution (implications for execution!)

# The POP algorithm

- Initial plan:  
Actions:  $\{Start, Finish\}$ , Orderings:  $\{Start \prec Finish\}$ ,  
Links:  $\{\}$ , Open preconditions: Preconditions of *Finish*
- Pick  $p$  from open preconditions on some action  $B$ , generate a consistent successor plan for every  $A$  that achieves  $p$
- Ensuring consistency:
  - 1 Add  $A \xrightarrow{p} B$  and  $A \prec B$  to plan. If  $A$  new, add  $A$  and  $Start \prec A$  and  $A \prec Finish$  to plan
  - 2 Resolve conflicts between the new link and all actions and between  $A$  (if new) and all links as follows:  
If conflict between  $A \xrightarrow{p} B$  and  $C$ , add  $B \prec C$  or  $C \prec A$
- Goal test: check whether there are open preconditions (only consistent plans are generated)

## Partial-order planning example (1)

*Init*( $At(Flat, Axle) \wedge At(Spare, Trunk)$ ).    *Goal*( $At(Spare, Axle)$ ).

*Action*(*Remove*(*Spare*, *Trunk*),

  Precond: $At(Spare, Trunk)$

  Effect: $\neg At(Spare, Trunk) \wedge At(Spare, Ground)$ )

*Action*(*Remove*(*Flat*, *Axle*),

  Precond: $At(Flat, Axle)$

  Effect: $\neg At(Flat, Axle) \wedge At(Flat, Ground)$ )

*Action*(*PutOn*(*Spare*, *Axle*),

  Precond: $At(Spare, Ground) \wedge \neg At(Flat, Axle)$

  Effect: $\neg At(Spare, Ground) \wedge At(Spare, Axle)$ )

*Action*(*LeaveOvernight*,    Precond:

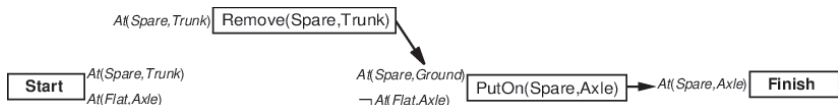
  Effect: $\neg At(Spare, Ground) \wedge \neg At(Spare, Axle) \wedge \neg At(Spare, Trunk)$

$\wedge \neg At(Flat, Ground) \wedge \neg At(Flat, Axle)$ )



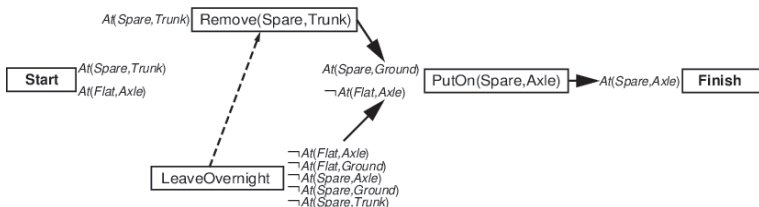
## Partial-order planning example (2)

- Pick (only) open precondition  $At(Spare, Axle)$  of  $Finish$   
Only applicable action =  $PutOn(Spare, Axle)$
- Pick  $At(Spare, Ground)$  from  $PutOn(Spare, Axle)$   
Only applicable action =  $Remove(Spare, Trunk)$
- Situation after two steps:



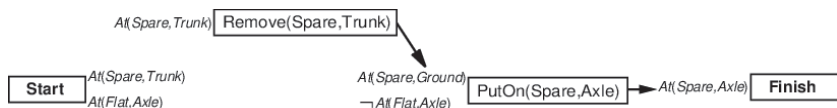
## Partial-order planning example (3)

- Pick  $\neg At(Flat, Axle)$  precondition of  $PutOn(Spare, Axle)$   
Choose  $LeaveOvernight$ , effect  $\neg At(Spare, Ground)$
- Conflict with link  
 $Remove(Spare, Trunk) \xrightarrow{At(Spare, Ground)} PutOn(Spare, Axle)$
- Resolve by adding  $LeaveOvernight \prec Remove(Spare, Trunk)$   
Why is this the only solution?



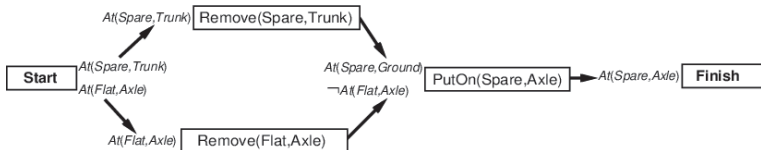
## Partial-order planning example (4)

- Remaining open precondition  $At(Spare, Trunk)$ , but conflict between  $Start$  and  $\neg At(Spare, Trunk)$  effect of  $LeaveOvernight$
- No ordering before  $Start$  possible or after  $Remove(Spare, Trunk)$  possible
- No successor state, backtrack to previous state and remove  $LeaveOvernight$ , resulting in this situation:



## Partial-order planning example (5)

- Now choose  $Remove(Flat, Axle)$  instead of  $LeaveOvernight$
- Next, choose  $At(Spare, Trunk)$  precondition of  $Remove(Spare, Trunk)$   
Choose  $Start$  to achieve this
- Pick  $At(Flat, Axle)$  precondition of  $Remove(Flat, Axle)$ ,  
choose  $Start$  to achieve it
- Final, complete, consistent plan:



# Dealing with unbound variables

- In first-order case, unbound variables may occur during planning process
- Example:

*Action*( $Move(b, x, y)$ ,

Precond:  $On(b, x) \wedge Clear(b) \wedge Clear(y)$

Effect:  $On(b, y) \wedge Clear(x) \wedge \neg On(b, x) \wedge \neg Clear(y)$ )

achieves  $On(A, B)$  under substitution  $\{b/A, y/B\}$

- Applying this substitution yields

*Action*( $Move(A, x, B)$ ,

Precond:  $On(A, x) \wedge Clear(A) \wedge Clear(B)$

Effect:  $On(A, B) \wedge Clear(x) \wedge \neg On(A, x) \wedge \neg Clear(B)$ )

and  $x$  is still unbound (another side of the least commitment approach)

# Dealing with unbound variables

- Also has an effect on links, e.g. in example above  
 $Move(A, x, B) \xrightarrow{On(A,B)} Finish$  would be added
- If another action has effect  $\neg On(A, z)$  then this is only a conflict if  $z = B$
- Solution: insert **inequality constraints** (in example:  $z \neq B$ ) and check these constraints whenever applying substitutions
- Remark on heuristics: Even harder than in total-order planning, e.g. adapt most-constrained-variable approach from CSPs

# Summary

- Partial-order planning
- The POP algorithms
- POP as search in planning space
- POP example
- POP with unbound variables
- Next time: **Planning and Acting in the Real World**