# **Planning**

R&N Chap. 11 (and a tiny snippet of Chap. 8-9)

# Limitations of Prop. Logic

- Not very expressive: To represent the fact that a flight can originate from any of n airports, we need n symbols: FlyFromPITT, FlyFromSFO, FlyFromORC,...
- Instead we would like to use more expressive sentences like:

For any airport *x*, FlyFrom(*x*)

→ First order logic (FOL)

## FOL (The extremely short version!!)

- Same as before, plus:
  - Quantifiers: ∀¸∃
  - Variables: x, y, z
  - Predicates: P(x,y) = logical expression with value True/False
  - Functions: F(x)

 $\forall x, y, z \; \operatorname{Parent}(z, x) \land \operatorname{Parent}(z, y) \Rightarrow \operatorname{Sibling}(x, y)$ 

#### **FOL**

• Substitution: Replace a part of the sentence by another one.

 $SUBST(\{x/John\}, Rich(x)) \rightarrow Rich(John)$ 

 Unification: Find parts of two sentences that are identical after some substitution

UNIFY(SameCountry(F(x), y), SameCountry(John,Mary)) =  $\{F(x)/John$ ,  $y/Mary\}$ 

#### **FOL Inference: Resolution**

 Resolution: Resolution can be extended to FOL, but more complicated

$$\frac{\boldsymbol{l}_1 \vee \boldsymbol{l}_2 \quad \boldsymbol{m}_1 \vee \boldsymbol{m}_2}{\text{SUBST}(\boldsymbol{\theta}, \boldsymbol{l}_1 \vee \boldsymbol{m}_1)}$$
 After some substitution,  $\boldsymbol{l}_2$  and  $\neg \boldsymbol{m}_2$  are the same  $\boldsymbol{\theta} = \text{UNIFY}(\boldsymbol{l}_2, \neg \boldsymbol{m}_2)$ 

$$\frac{\text{UnHappy}(x) \lor \neg \text{Rich}(x) \quad \text{Rich}(John)}{\text{UnHappy}(John)}$$
$$\theta = \{x / John\}$$

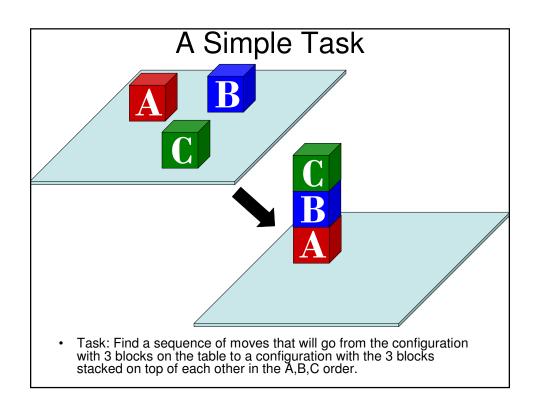
# FOL Inference: Chaining

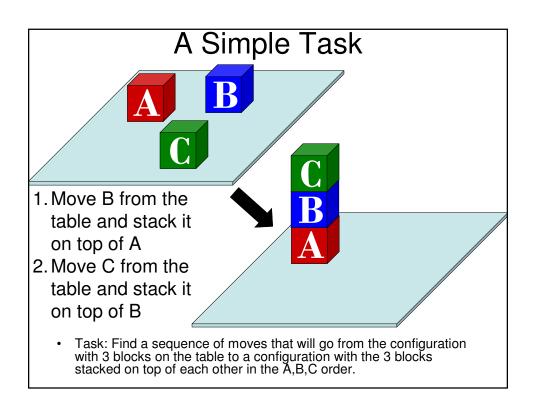
- Chaining: Forward/backward chaining idea can be extended to KBs with sentences of the form:
- $A_1 \wedge A_2 \wedge A_3 \dots => B$

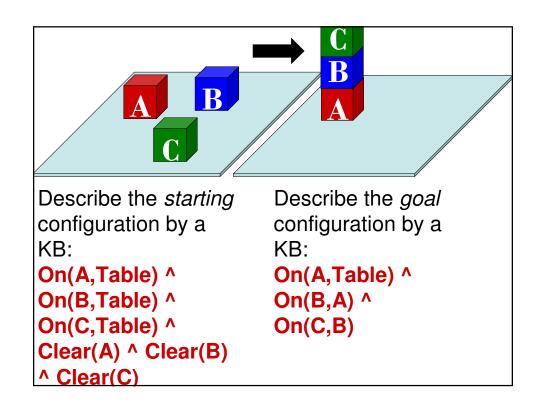
 $WindowsLocked(x) \land DoorLocked(x) \Rightarrow RoomSecure(x)$ 

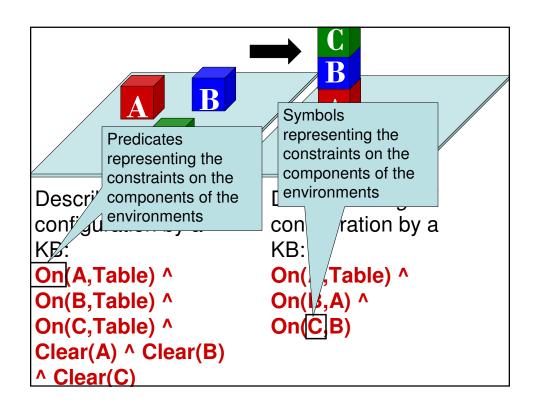
# Summary

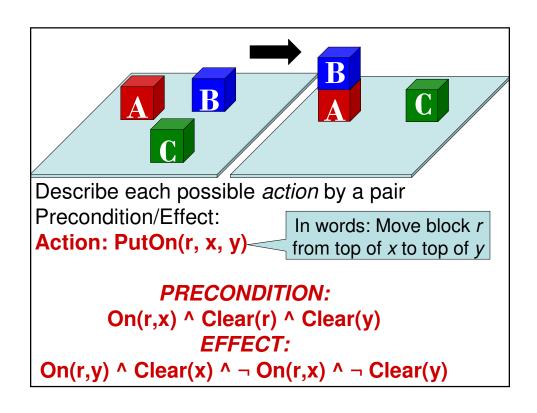
- FOL provides more compact way of representing KBs
- CNF, resolution and forward/backward chaining concepts exists in FOL
- Properties of soundness, completeness

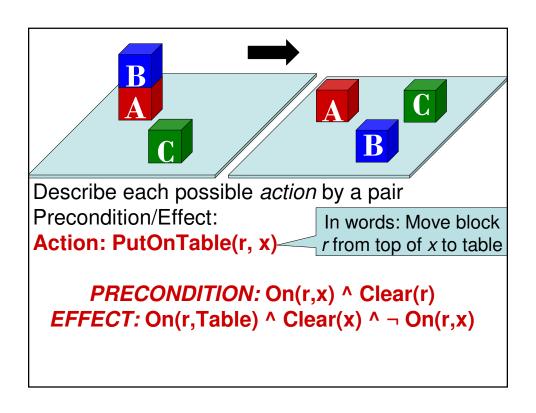


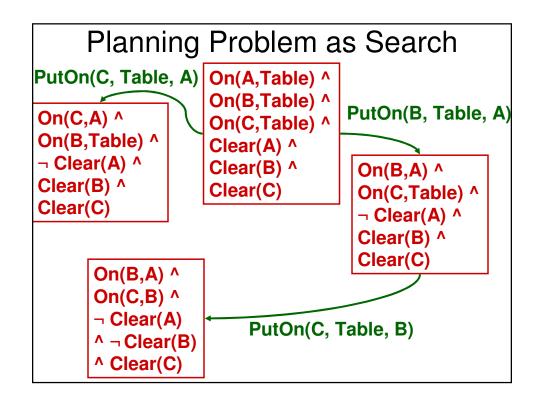


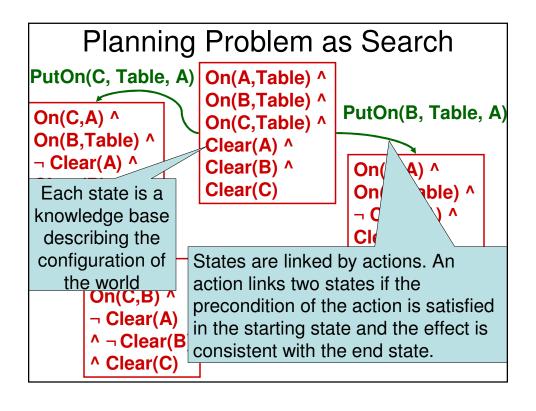


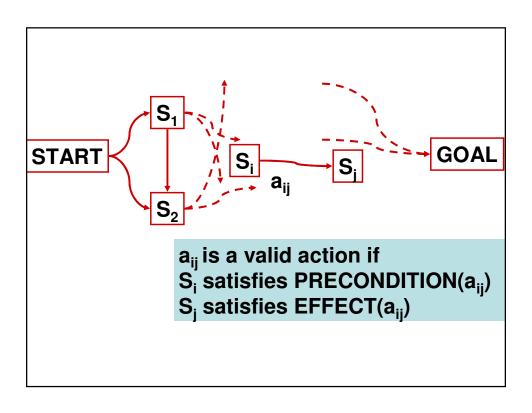












# Planning Problem as Search a<sub>ij</sub> is a valid action if S<sub>i</sub> satisfies PRECONDITION(a<sub>ij</sub>) S<sub>j</sub> satisfies EFFECT(a<sub>ij</sub>) GOAL

- States: KBs representing the possible configurations of the world
- Arcs: actions allowed between states
- Any of the previous search techniques can be used for planning in this graph (defined implicitly)
- Forward planning: Search from the start configuration until the goal configuration is reached
- Backward planning: Search backward from the goal configuration until the start configuration is reached

#### **Notation**

PutOn(r, x, y)

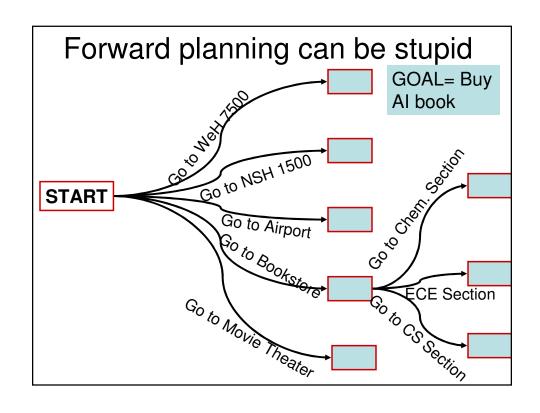
PRECONDITION:

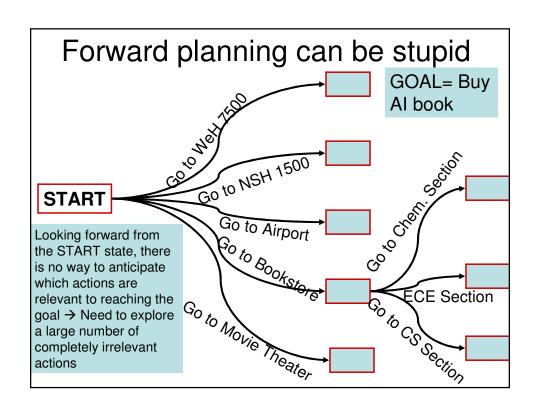
On(r,x) ^ Clear(r) ^ Clear(y)

EFFECT:

On(r,y) ^ Clear(x) ^ ¬ On(r,x) ^ ¬ Clear(y)

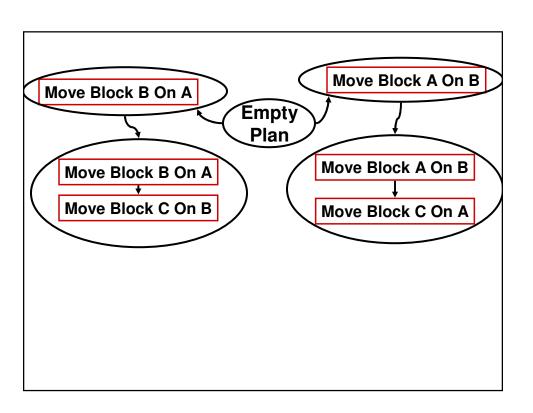
- Describing the actions is actually quite tricky.
- Frame problem: Should we represent the effect of "PutOn" on the other variables? If we do, we need to enumerate explicitly all of the variables in the world!
- One solution: It is implicitly assumed that any symbol not mentioned in the EFFECT remains untouched.
- The particular notation used here (which uses this approach) is called the STRIPS notation (named after a famous Stanford system.)

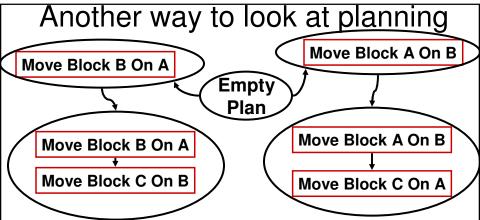




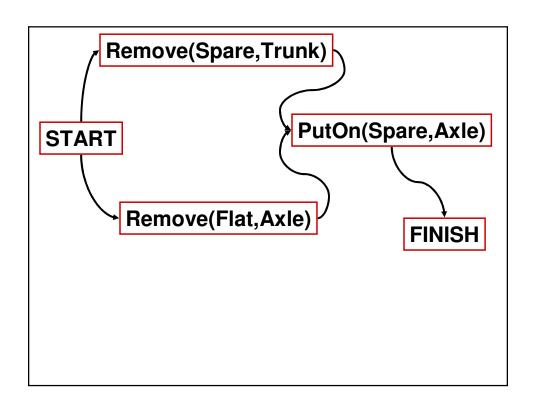
#### **Heuristics**

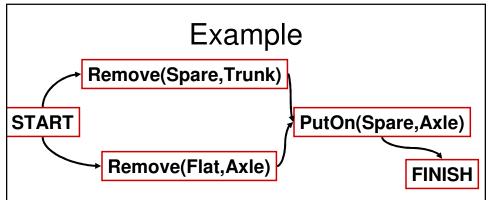
- Search is in general inefficient. Can we use heuristics to speed up the search?
- General heuristics: Try to guess a lower bound on the number of actions necessary to achieve the goal.
- Example (relaxed problems): First assume that the actions have no preconditions and find a set of the actions leading to the goal configurations (easier problem) → Provides a lower bound on the number of actions to reach the goal
- A\* and related search techniques can be used to take advantage of heuristics.





- Instead of searching through the graph of possible world states linked by actions, we could do the opposite: Search through the set of possible plans = (informally) sequences of actions
- In fact, in many cases we can find partial plans that can be combined into a complete plan → (hopefully) more efficient search
- Formally: Partial-Order Planning (POP)





- The nodes are now actions instead of world states
- · START and FINISH are dummy nodes
- Two nodes A and A' are linked if the effect of A is a precondition for A'
- The actions are partially ordered: Some actions must occur before others
- Important: We don't need a single, totally ordered, sequence of actions

#### **POP Algorithm**

#### Partial plan is:

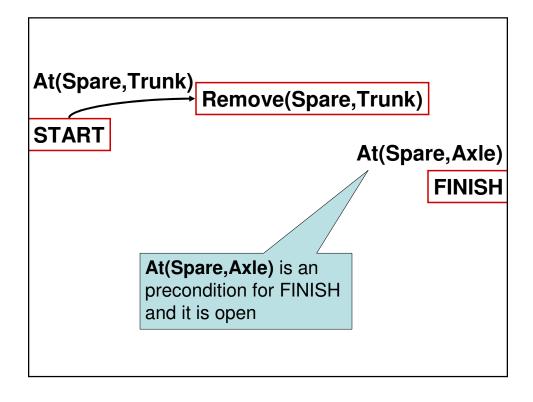
- · Set of actions included in the plan
  - Example: Remove(Flat,Axle))
- Set of ordering constraints: A < B means "action A must occur before action B"
- Set of links: A →<sub>c</sub> B
  - C is an effect of A
  - C is a precondition of B
  - Example:

Remove(Spare,Trunk)  $\rightarrow_{At(Spare,Ground)}$ PutOn(Spare,Axle)

# **POP Algorithm**

#### Two dummy nodes:

- START:
  - Precondition = None
  - Effect = Initial configuration of the world
- · FINISH:
  - Precondition = Goal configuration of the world
  - Effect = None
- Initial plan contains only START and FINISH with the ordering START < FINISH</li>



#### **POP Algorithm**

At(Spare,Trunk) Remove(Spare,Trunk)

**START** 

**At(Spare,Axle)** is an precondition for FINISH and it is open

At(Spare,Axle)

- FINISH
- Open preconditions = Precondition of an action in the plan that is not an effect of another action in the plan
- The plan is incomplete as long as there are open preconditions

#### **POP Algorithm**

- Initialize with {START, FINISH} nodes
- Repeat:
  - -Find an open precondition C of an action B in the plan
  - -Find an action A such that the effect of A meets the precondition C and add:
    - A  $\rightarrow_{c}$  B
    - A < B (A must take place before B)
  - -Verify that the plan is still consistent
- Until there are no open preconditions

START At(Spare,Trunk)
At(Flat,Axle)

At(Spare,Axle)

FINISH

Initialize with two actions:
START with two effects
FINISH with one precondition

At(Spare,Trunk)
At(Flat,Axle)

At(Flat,Axle)

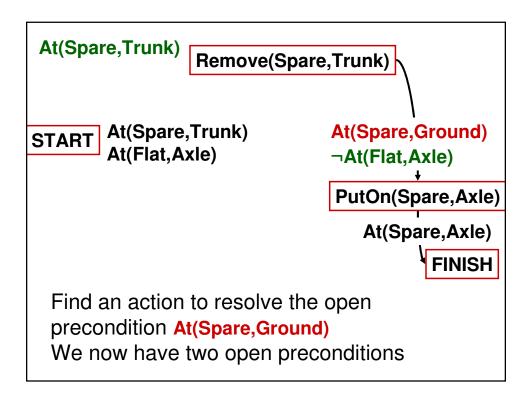
PutOn(Spare,Axle)

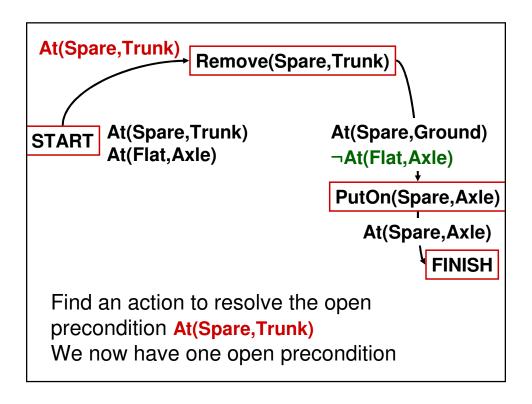
At(Spare,Axle)

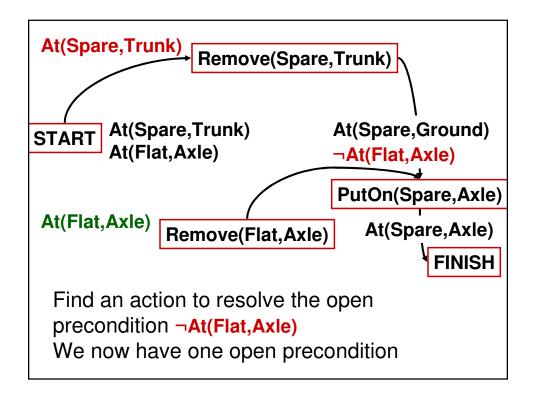
FINISH

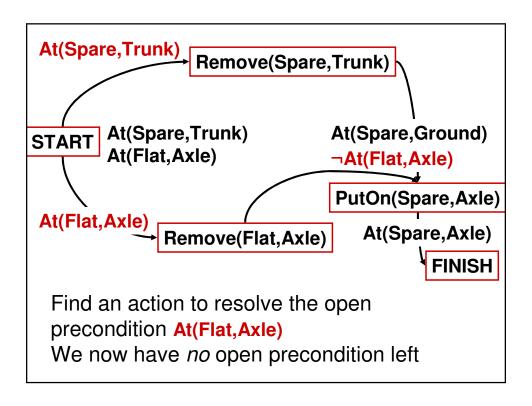
Find an action to resolve the open precondition At(Spare,Axle)

We now have two more open preconditions



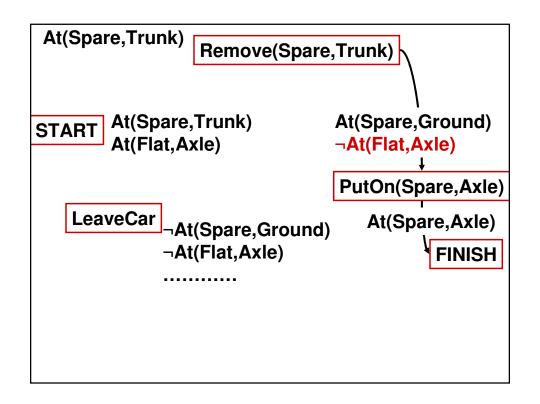


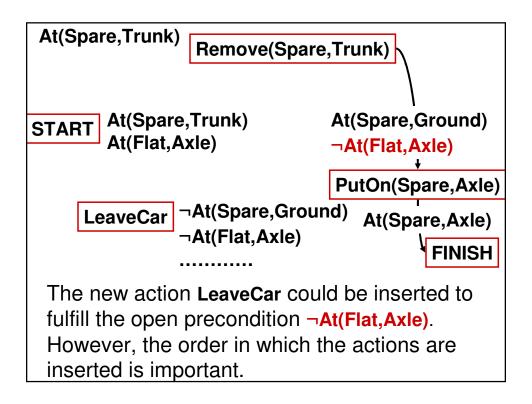


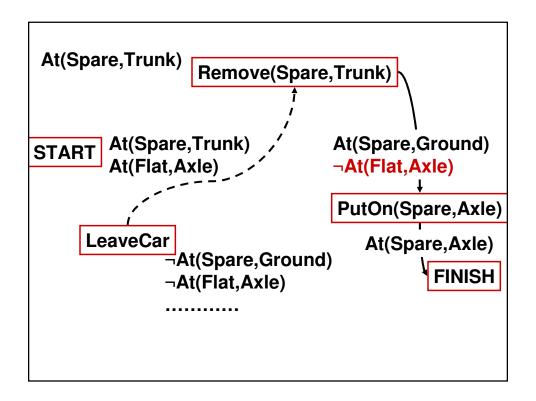


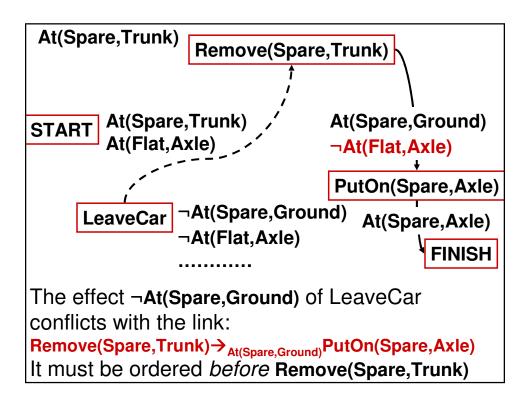
- Initialize with {START, FINISH} nodes
- Repeat:
  - -Find an open precondition C of an action B in the plan
  - -Find an action A such that the effect of A meets the precondition C and add:
    - A  $\rightarrow_c$  B
    - A < B (A must take place before B)
  - -Verify that the plan is still consistent
- Until there are no open preconditions

# Consistency: If an existing action E in the plan conflicts with A → B: Try to add the ordering constraint E > B or A > E If no consistent ordering can be found → Give up on adding A A meets the precond • A → B • A < B (A must take pla before B) Verify that the plan is still consistent • Until there are no open preconditions









#### The POP Algorithm

- POP is particularly effective when the problem can be decomposed into subproblems → More flexibility in the search because we do not require a strictly ordered sequence of actions.
- POP is sound
- POP is complete (e.g., with breadth first search or iterative deepening)

#### Summary

- Configuration of the world = KB
- Actions = Preconditions + Effect
- · STRIPS notation
- Planning = Find set of actions from start to goal configurations of the world
- Planning as search through the valid world configurations linked by valid actions between configurations
  - Backward search generally more effective
  - All the arsenal of heuristic search can be used
- Partial-Order Planning (POP): Planning as search through the possible plans.
  - Construct partial plans, combined by taking into account ordering constraints.
  - Takes advantages of decomposable sub-plans and sub-goals

#### Summary

- Configuration of the world = KB
- Actions = Preconditions + Effect
- STRIPS notation
- Planning = Find set of actions from start to goal configurations of the world
- · Planning as search through the valid world configurations linked by valid actions between
- What is potentially a serious limitation in trying to use logic-based representations for reasoning and planning in real-world scenarios?
  - combined by taking into account ordering Justiaints.
    - Takes advantages of decomposable sub-plans and sub-goals