

# Planning Agents

## Chapter Overview

### **planning problems**

from problem solving to planning

### **representations** for planning problems

states, goals, actions, plans

### **partial-order planning**

keep the number of plans tractable

### **abstract examples**

shopping, blocks world, Shakey's world

### **practical planning**

hierarchical decomposition, operators, resource constraints

### **real-world applications**

space missions and spacecrafts, job shop scheduling

# Search-Based Problem Solver

review from earlier chapter

**actions**

represented by programs that generate successor  
state descriptions

**states**

complete state descriptions are required

**goals**

goal test, heuristic functions as black boxes

**plans**

a solution is a sequence of actions  
search algorithm generates only contiguous  
sequences

# Planning Problems

from problem solving to planning

## **reasoning process**

structured more flexibly

any part of the problem can be worked on

## **planning and execution**

no necessary connection between the order of  
planning and the order of execution

## **decisions**

important or obvious decisions can be made first

## **hierarchical decomposition**

divide-and-conquer strategy

a plan is split up into largely independent  
subplans

hierarchical decomposition only works if the sub-problems are independent

Counterexample: Eight-puzzle, where the goal consists of interdependent subgoals

# Representations

for planning problems

**states**

the world is described through logical conditions

**goals**

conjunctions of literals, possibly with variables

**actions**

described via operators, with preconditions and effects

**plans**

sequences of actions

This representation is close to the STRIPS language,  
one of the first planning systems

Example: [?] p. 343

# States

the world decomposed into logical conditions

## specification

- conjunctions of function-free ground literals:
- predicates applied to possibly negated constant symbols
- no functions, no variables

## completeness

- state descriptions may be incomplete

## closed-world assumption

- any conditions not explicitly mentioned are assumed to be false

## Examples

- Lost & Stuck for a disoriented, immobile agent
- (At (Truck-1, SLO) & At (Truck-2, SF)) for a truck scheduling problem

restricted expressiveness achieved better  
computational efficiency



# Goals

partially specified state that satisfies some condition

## specification

conjunction of positive ground literals

## goal satisfaction

a state  $s$  satisfies a goal  $g$  if the states contains all the atoms in  $g$ , and possibly others

**Example** Lost & Stuck & Out-Of-Fuel & Tired satisfies the (undesirable) goal Lost & Stuck

# Actions

preconditions must hold before the operator is applied, and the effects are the expected outcome

## precondition

conjunction of function-free positive literals  
state what must be true in a state before an action can be executed

## operator

describes the operations to be executed in order to achieve the expected outcome

## effects

conjunction of function-free literals  
state what is expected to be true after the action is executed (the operator is applied)  
for better readability, an *add list* is used for positive literals,

variables in the precondition and effects must also appear in the parameter list of the operator

# Action Schema Example

drive a truck from one location to another

```
Action(Drive(t, from, to),  
  PRECOND: At(t, from) AND Truck(t) AND Location(from) AND Location (to)  
  EFFECT: At(t,to) AND NOT At(t, from))
```

# Plan

a sequence of actions

**modification of states**

positive literals that appear in the effect of an action are added to the modified state, and negative literals are removed

**common assumption** sometimes called STRIPS *assumption*

literals not mentioned in the effect remain unchanged

**applicable actions**

can be performed in any state that meets the precondition

**solution** for a planning problem

plan that specifies actions leading from an initial state to a goal state

# Operators

descriptions of actions

**description**

name for an action

**precondition**

conjunction of atoms that must be true

**effect**

conjunction of literals describing the changed situation

**Graphical representation**

box for the action

preconditions above, effects below

[?] p. 343

# Situation Space

traversed in order to reach the goal

## **progression planning**

- searches forward from initial to goal situation
- often inefficient due to high branching factor and huge state space

## **regression planning**

- searches backward from goal to initial situation
- possible because only partial descriptions of states are needed
- complicated for conjunctions of goals

# Partial Plan

simple, incomplete plan

## operators

work on plans: add steps, impose ordering,  
instantiate variables, ...

## refinement operators

constraints are added to a partial plan  
equivalent to the elimination of possible plans

## modification operators

plans are modified  
incorrect plans can be “debugged”



# Partial-Order Planning

keep the search focused

## **partial order**

leave some ordering decisions open

## **total order**

sequential list of steps, or linearization of a plan

# Solution

executable plan that achieves the goal

**complete**

every precondition of every step is satisfied

**consistent**

no contradictions in the ordering or binding constraints

# Plans

## important aspects

### **plan steps**

each step is one of the operators for the problem

### **ordering constraints**

temporal order of the steps

### **variable binding constraints**

no conflicts in instantiations

### **causal links**

record the purpose of steps

graphical notation: boxes and arrows

# Shopping

as an abstract planning problem

**initial plan**

start situation, goal situation

**partial plan**

insert steps that can be resolved right away

**partial order plan**

don't worry about the particular sequence of steps

**solution**

complete plan with all necessary ordering and binding constraints

see [?], pp. 349 ff

# Truck Delivery

## simplified practical planning problem

```
Init(At(C1, SLO) AND At(C2, SF) AND (C3, SB) AND C4 (AG) AND
    At(T1, SLO) AND At(T2, SF) AND
    Cargo(C1) AND Cargo(C2) AND
    Truck(T1) AND Truck(T2) AND
    Location(SLO) AND Location(SF) AND Location(SB) AND Location(AG))
Goal(At(C1, SF) AND At (C2, SB))
Action(Load(c, t, l)
    PRECOND: At(c, l) AND At(t, l) AND Cargo(c) AND Truck(t) AND Location(l)
    EFFECT: On(c, t) AND NOT At(c, l)
Action(Unload(c, t, l)
    PRECOND: On(c, t) AND At(t, l) AND Cargo(c) AND Truck(t) AND Location(l)
    EFFECT: NOT On(c, t) AND At(c, l)
Action(Drive(t, from, to)
    PRECOND: AND At(t, from ) AND Truck(t) AND Location(from) AND Location(to)
    EFFECT: NOT At(t, from) AND At(t, to)
```

## simplified STRIPS program

# Blocks World

**states**

objects and their positions

**goals**

particular spatial relations between objects

**actions**

operators for moving blocks

**plans**

sequences of block movements

# Blocks World

## in STRIPS

```
Init(On(A, Table) AND On(B, Table) AND On(C, Table) AND
    Block(A) AND Block(B) AND Block(C) AND
    Clear(A) AND Clear(B) AND Clear(C))
Goal(On(A, B) AND On(B, C))
Action(Move(b, x, y),
    PRECOND: On(b,x) AND Clear(b) AND Clear(y) AND Block(b) AND
              NEQ(B,x) AND NEQ(b,y) AND NEQ(x,y),
    EFFECT: On(B,y) AND Clear(x) AND NOT On(b,x) AND NOT Clear(y))
Action(MoveToTable(b, x)
    PRECOND: On(b,x) AND Clear(b) AND Block(b) AND NEQ(b,x)
    EFFECT: On(b, Table) AND Clear(x) AND NOT On(b,x))
```

simplified STRIPS program

# Practical Planners

operate in complex, realistic domains

## **planning methods**

language and algorithms must be extended

## **search**

must be focused for specific domains

## **real-world limitations**

resources, time, uncertainty



# Hierarchical Decomposition

different levels of abstraction

**abstract operators**

can be decomposed into a group of steps

**primitive operator**

can be directly executed

# Language Extensions

**operators** classified into

- primitive
- nonprimitive

**decomposition methods**

- similar to subroutines or macros for operators

**Action Description Language (ADL)** more

- expressive than STRIPS
- allows positive and negative literals in states
- open world assumption
- also disjunctions, quantified variables in goals
- built-in equality
- types

**Planning Domain Description Language (PDDL)**

- standard syntax for various planning formalisms
- includes sublanguages for Strips, PDDL, ...

[requires modification of the planner](#)

# Resource Constraints

representation and execution

## resources

can be produced and consumed

## measures

numeric values for quantifying resources

## temporal constraints

time is just another resource

# Distributed Problem Solving

collaboration among agents to achieve a  
common goal

## **example problems**

tasks that seem suitable for distribution

## **task sharing**

one agents offloads some of his tasks onto other  
agents

## **result sharing**

several agents work on the same task, and their  
results are combined

# Distributed Planning

specialization of distributed problem solving

## **distributed formulation of plans**

the planning process itself is distributed

## **generation of plans for distributed activities**

the plan is generated in such a way that the activities it specifies can be executed in a distributed way

## **distributed plan representation**

methods for representing distributed plans in a coordinated manner

## **distributed execution of plans**

combining coordination, planning, and execution

# Centralized Planning

for distributed plans

## **partial order planning**

no strict ordering is required between actions  
these actions may be executed in parallel via  
threads

## **decomposition of a plan** into subgoals

subplans should be self-contained

## **synchronization** between subplans

frequently via communication

## **subplan allocation**

different subplans are allocated to individual  
agents  
can become complex for heterogeneous agents

## **plan execution**

individual agents execute their subplans  
may involve monitoring by the centralized

planner

# Distributed Planning

for centralized plans

## **cooperative planning**

several agents work on the same plan  
mostly interesting for very large or complex plans  
variation of distributed problem solving where the problem happens to be a planning task

## **task decomposition**

identification of largely independent subtasks that can be tackled by individual agents or teams of agents

## **task distribution**

allocation of subtasks to (teams of) agents

## **subtask execution**

individual agents work on their specific tasks

## **result sharing**

contributions by individual agents are collected



and synthesized into one comprehensive plan

# Distributed Planning

for distributed plans

**planning process and plan execution** are  
distributed  
combines challenges from both approaches

**relatively immature field**  
many different approaches, but not much  
systematicity

# Plan Merging

coordination of multiple individual plans

## **inherently distributed task**

- no central agency to coordinate the planning task
- each agent has its own plan, but they are willing to coordinate their activities

## **identification of conflicts**

- resource utilization
- expected results

## **resolution of conflicts**

- analysis of the individual plans for conflicts
- centralized or distributed approaches
- variation of reachability analysis, which relies on the possibly intractable enumeration of states

## **identification of unsafe states**

- emphasis on actions performed by the agents
- assumes that the “action space” is less complicated than the state space

# Distributed Hierarchical Planning

variation of iterative plan formulation

## levels of abstraction

- agents formulate their plans at different levels
- only higher levels are shared
- can reduce the overall search space substantially
- by pruning away many details

## conflicts

- it is assumed that conflicts can be recognized
- and hopefully resolved at higher levels
- is not always the case

# Negotiation

## in distributed planning

### resolution of conflicts

- once conflicts are discovered, the agents involved negotiate a plan that solves the conflicts
- usually based on utility functions for agents
- may require the revision of plans
- preserves the autonomy of agents

### extension of the planning space

- negotiation often results in an even larger state space for the planning problem

### self-interested agents

- negotiation assumes that agents are willing to cooperate
- incentives can be introduced to encourage cooperation even for self-interested agents

# Distributed Plan Representation

abstract description language for plans

**compatibility of plans** among different agents  
agents may use different planning systems with  
various plan representation schemes

**plan components**  
many of the individual components of a plan  
may require their own description languages  
(environment, agent capabilities, resources,  
plots, subplans, ...)

**communication protocols**  
necessary for the exchange of plans  
not sufficient for the description of plans

**knowledge exchange languages**  
in principle capable of representing and  
exchanging plans, in practice they may be too  
general

# Distributed Planning and Execution

**pre-planning coordination**

may impose constraints on the possible actions of agents  
sometimes formulated as *social laws*  
in general, agents may inform each other about their plans

**post-planning coordination**

coordination of plans during execution  
agents may formulate *contingency plans* in advance, and choose the appropriate branch during execution

**interleaving** planning, coordination, execution

continual revision of plans in response to coordination decisions

**observation-based plan coordination**

agents that can't communicate can infer each

other’s plans



# Summary

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