

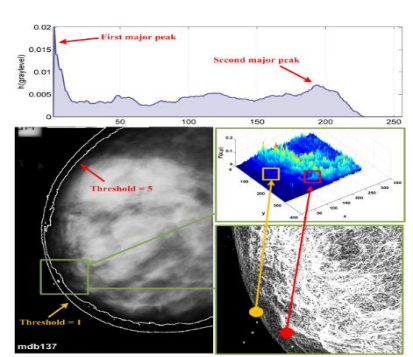
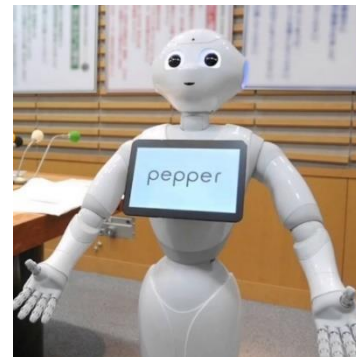
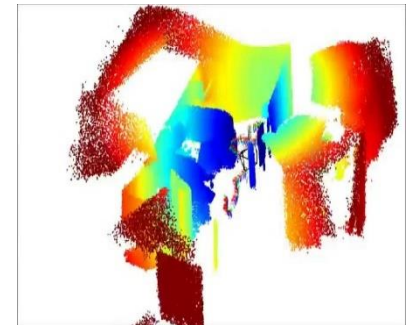
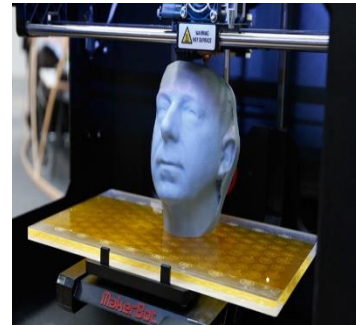
Automatic Planning

Hatem A. Rashwan

Introduction and Planning Definition

About the instructor

- **My name is Hatem A. Rashwan**
- **Research Group:** <http://deim.urv.cat/~rivi/>
 - The IRCV group is constituted by faculty from the [Department of Computer Science and Mathematics \(DEIM\)](#) and the [Department of Electrical, Electronic and Automation Engineering \(DEEEA\)](#). Both departments are physically located at the [School of Engineering \(ETSE\)](#) in [Tarragona](#) (Catalonia-Spain).
- **Research Interests:**
 - Computer Vision,
 - Pattern Recognition
 - Machine/Deep Learning
 - Artificial Intelligence
- **Applications:**
 - Vision-based robotic systems
 - Scene understanding
 - Productivity



Some of the topics covered in the PAR course

- **Introduction and Planning definition**
- **State-Space Search: Heuristic Search and STRIPS**
- **Plan-Space Search and Hierarchical Task Network (HTN) Planning**
- **Graphplan and Advanced Heuristics**
- **Plan Execution and Applications**
- **Mobile Robot Application**

Books covered the topics

Books

- Automated planning theory and practice,
<http://homes.dcc.ufba.br/~thiagob052/AI%20Planning/livro-recomendado.pdf>
Chapters 1,2,4,6,9, and 20
- Automated planning and acting, <http://projects.laas.fr/planning/book.pdf>,
Chapters 6 and 7

Books for PDDL

- An Introduction to the Planning Domain Definition Language (PDDL),
<https://courses.cs.washington.edu/courses/cse473/06sp/pddl.pdf>,
<http://homepages.inf.ed.ac.uk/mfourman/tools/propplan/pddl.pdf>

Planning software

For Windows:

- Visual studio Code with PDDL packages,
<https://marketplace.visualstudio.com/items?itemName=jan-dolejsi.pddl>

For Linux:

- Visual studio Code with PDDL packages,
- FF (Fast-Forward) Planning Software: <http://www.ai.mit.edu/courses/16.412J/ff.html>
- Graphplan Planning
Software: <http://www.ai.mit.edu/courses/16.412J/Graphplan.html>

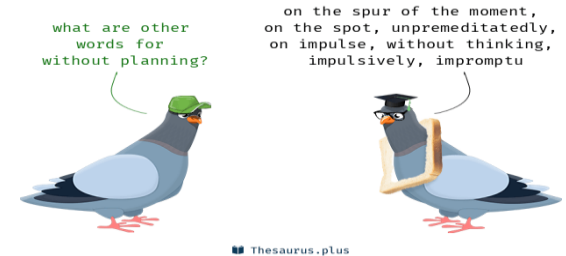
Online PDDL Editor: <http://editor.planning.domains/>

Overview

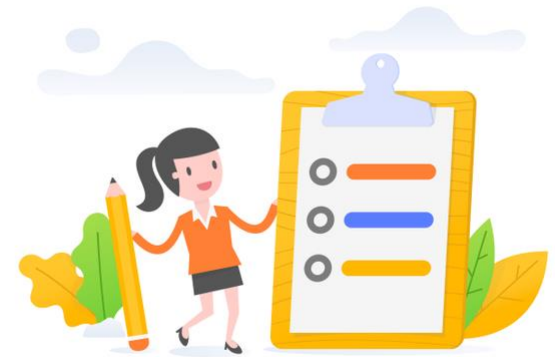
- **What is Planning (in AI)?**
- A Conceptual Model for Planning
- Planning and Search
- Example Problems

Human Planning and Acting

- ❑ Acting without (explicit) planning:
 - when purpose is immediate
 - when performing well-trained behaviours
 - when course of action can be freely adapted



- ❑ Acting after planning:
 - when addressing a new situation
 - when tasks are complex
 - when the environment imposes high risk/cost
 - when collaborating with others



❑ people plan only when strictly necessary

What is Planning?

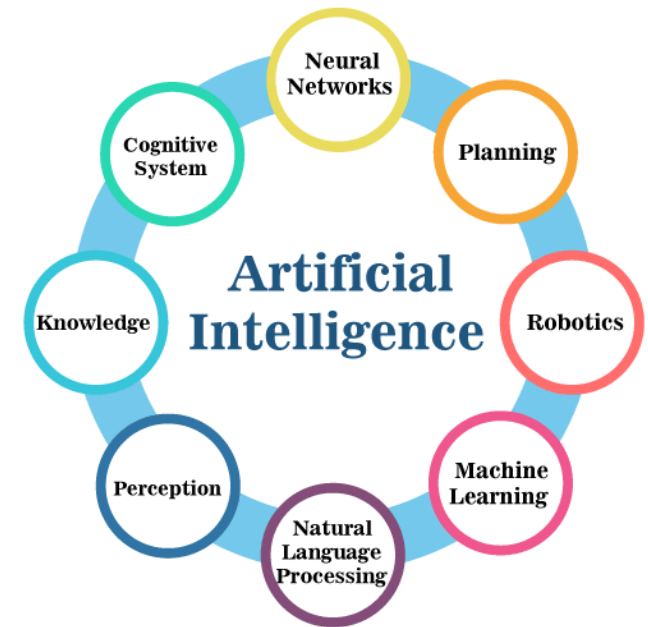
□ Planning:

- explicit deliberation process that chooses and organizes actions by anticipating their outcomes
- aims at achieving some pre-stated objectives

□ AI planning: computational study of this deliberation process

Why Study Planning in AI?

- Scientific goal:
understand intelligence
 - planning is an important component of rational (intelligent) behaviour
- Engineering goal:
build intelligent entities
 - build planning software for choosing and organizing actions for autonomous intelligent machines



Attributes of Planning

Planning has seven attributes:

- Managerial function
- Goal oriented
- Pervasive
- Continuous Process
- Intellectual Process
- Futuristic
- Decision making

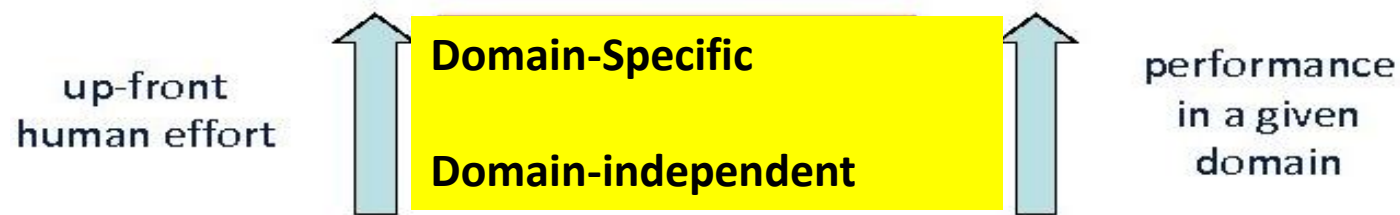


Domain-Specific vs. Domain-Independent Planning

- **Domain-specific planning:** use specific representations and techniques adapted to each problem
 - important domains: path and motion planning, perception planning, manipulation planning
 - Do not work well in other planning domains
- **Domain-independent planning:** use generic representations and techniques
 - exploit commonalities to all forms of planning
 - leads to general understanding of planning
- **Domain-independent planning complements domain-specific planning**

Domain-Specific vs. Domain-Independent Planning

Comparisons



- Domain-specific planner
 - ◆ Write an entire computer program - lots of work
 - ◆ Lots of domain-specific performance improvements
- Domain-independent planner
 - ◆ Just give it the basic actions - not much effort
 - ◆ Not very efficient

Remind

True or False?

- People only plan *when they have to* because the benefit of an optimal plan does not always justify the effort of planning
- For humans, planning is a *subconscious process*, which is why computational planning is so hard
- Planning involves a *mental simulation of actions* to foresee future world states and compare them to goals
- In AI, planning is concerned with the search for *computationally optimal* plans
- Domain-specific planning is used when efficiency is vital, whereas domain-independent planning is good for planning from first principles

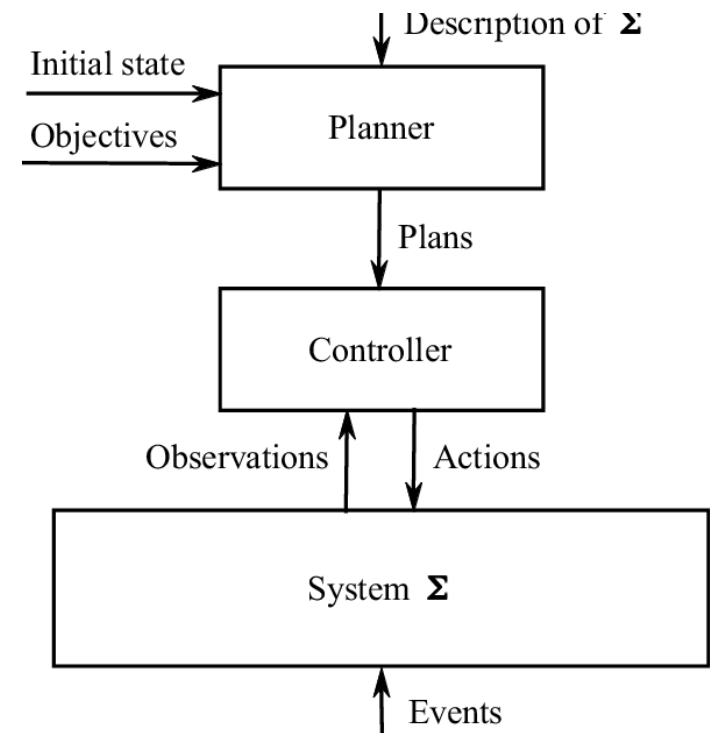
Overview

- What is Planning (in AI)?
- **A Conceptual Model for Planning**
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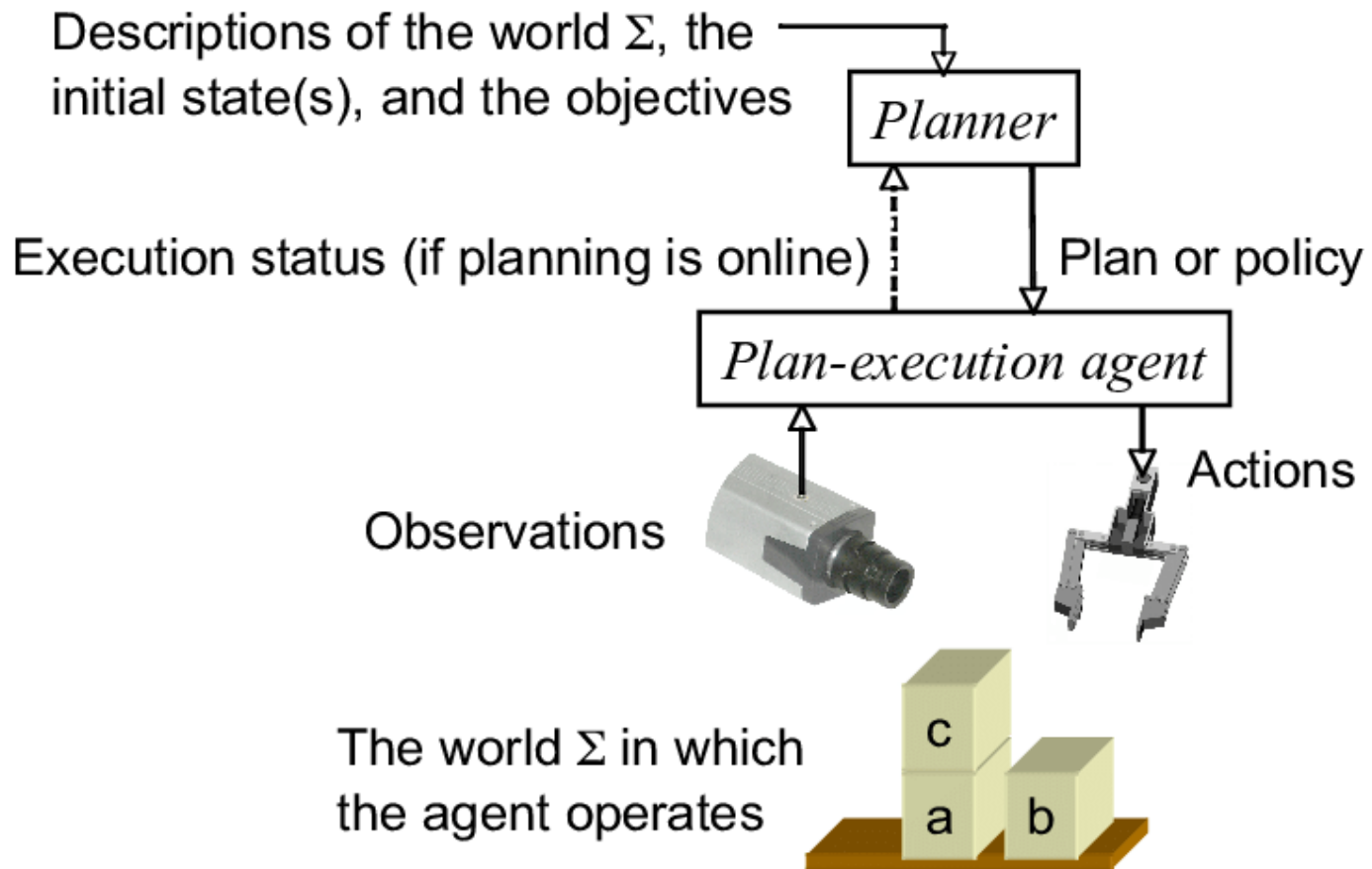
Conceptual Model?

A **conceptual model** is a **representation of a system** that consists of concepts used to help agents **know, understand, or simulate** a subject that the model represents.

- conceptual model: theoretical method for describing the elements of a problem
- good for:
 - explaining basic concepts
 - clarifying assumptions
 - analysing requirements
 - proving semantic properties (optimal, sound or complete)
- not good for:
 - efficient algorithms and computational concerns



Conceptual Model?



Conceptual Model for Planning: State-Transition System

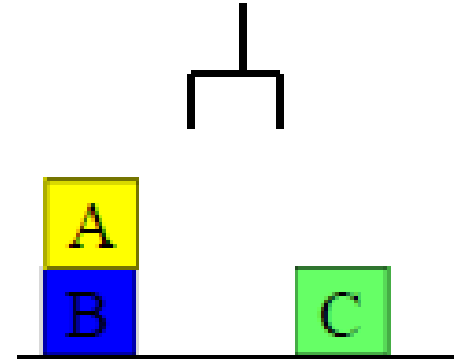
- A state-transition system is a triple $\Sigma = (S, A, \gamma)$, where:
 - $S = \{s_1, s_2, \dots\}$ is a finite or recursively enumerable set of states;
 - $A = \{a_1, a_2, \dots\}$ is a finite or recursively enumerable set of actions;
 - $\gamma: S \times A \rightarrow 2^S$ is a state transition function.
- if $a \in A$ and $\gamma(s, a) \neq \emptyset$ then a is applicable in s
- applying a in s will take the system to $s' \in \gamma(s, a)$

State-Transition System

Blocks World Problem

➤ What is a State and Goal?

- We'll illustrate the techniques with reference to the blocks world
- This world contains
 - a robot arm with gripper,
 - 3 blocks (A, B and C) of equal size,
 - a table-top.
- Some domain constraints:
 - Any number of blocks can be directly on top of another block
 - Any number of blocks can be on the table
 - The hand can only hold one block



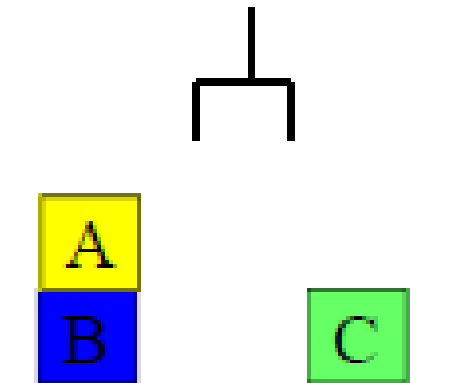
The Blocks World

States declaration

➤ What is a State and Goal?

To represent this environment, we need an **Ontology** (logical)

- ❑ **On(x,y)** means block *x* is on top of block *y*
- ❑ **OnTable(x)** --- block *x* is on the table
- ❑ **Clear(x)** --- nothing is on top of block *x*
- ❑ **Holding(x)** --- robot arm is holding block *x*
- ❑ **ArmEmpty()** --- robot arm/hand is not holding anything (block in this world)



Blocks World State and Goal Description

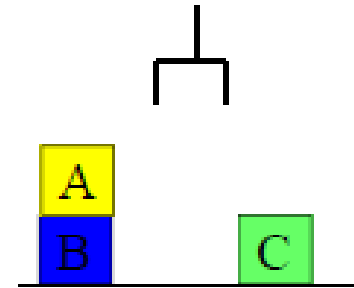
States and Goal Representation

➤ State Representation = Environment

- A representation of one state of the blocks world.

The state in the figure is:

- *Clear(A)*
- *Clear(C)*
- *On(A,B)*
- *OnTable(B)*
- *OnTable(C)*
- *ArmEmpty()*



- Use the *closed world assumption*: *anything not stated is assumed to be false*

➤ Goal Representation

- A *goal* is represented as a set of formulae. Here is a goal:

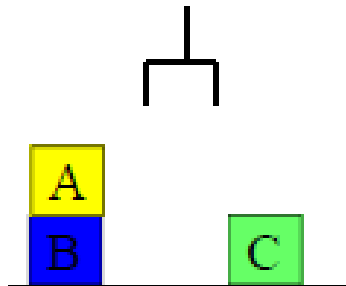
- OnTable(A)*
- OnTable(B)*
- OnTable(C)*

Blocks World

Actions Description

How do we can define an Action?

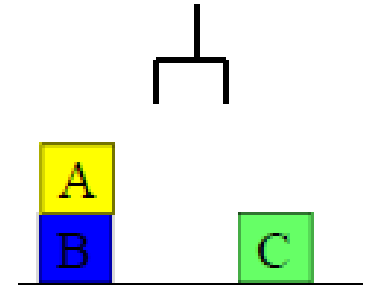
- Represented using a technique that was developed in the STRIPS planner.
Each action has:
 - ❑ a **name** ---which may have arguments;
 - ❑ a **pre-condition list** --- a list of facts which must be true for action to be executed;
 - ❑ a **delete list** --- a list of facts that are no longer true after action is performed;
 - ❑ an **add list** --- a list of facts made true by executing the action.
 - ❑ Each of the facts may contain **variables**



Blocks World Actions Description

Action/Operator Representation

- Basic operations
 - `stack(X,Y)`: put block X on block Y
 - `unstack(X,Y)`: remove block X from block Y
 - `pickup(X)`: pickup block X from the table
 - `putdown(X)`: put block X on the table
- Each operator is represented by facts that describe the state of the world before and changes to the world after an action is performed.
 - a list of **preconditions**
 - a list of new **facts to be added** (add-effects)
 - a list of **facts to be deleted** (delete-effects)
 - optionally, a set of (simple) variable **constraints**

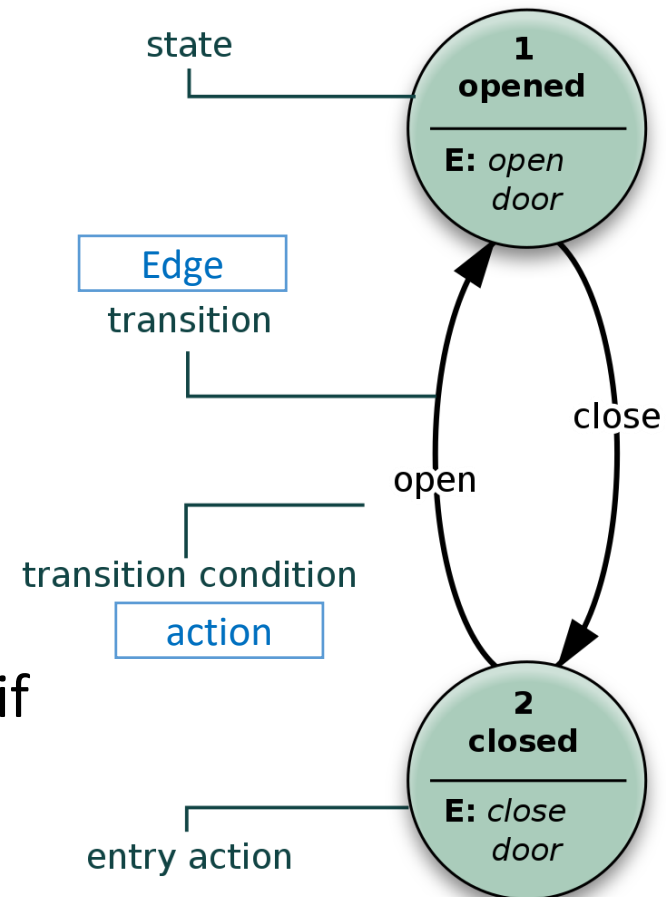


We will study
this example in
the Lab

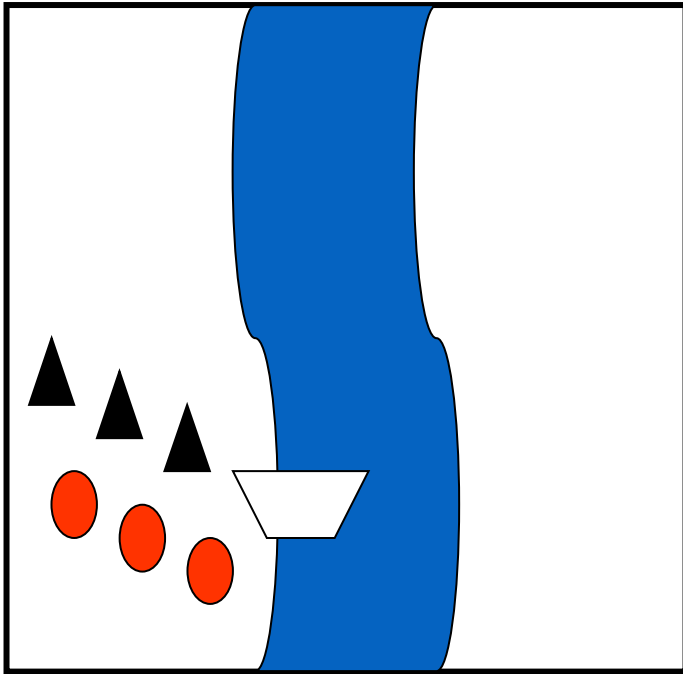
State-Transition Systems Graphs



- A state-transition system $\Sigma = (S, A, \gamma)$ can be represented by a directed labelled graph $G = (N_G, E_G)$ where:
 - the nodes correspond to the states in S , i.e., $N_G = S$; and
 - there is an arc from $s \in N_G$ to $s' \in N_G$, i.e., $s \rightarrow s' \in E_G$, if and only if $s' \in \gamma(s, a)$.

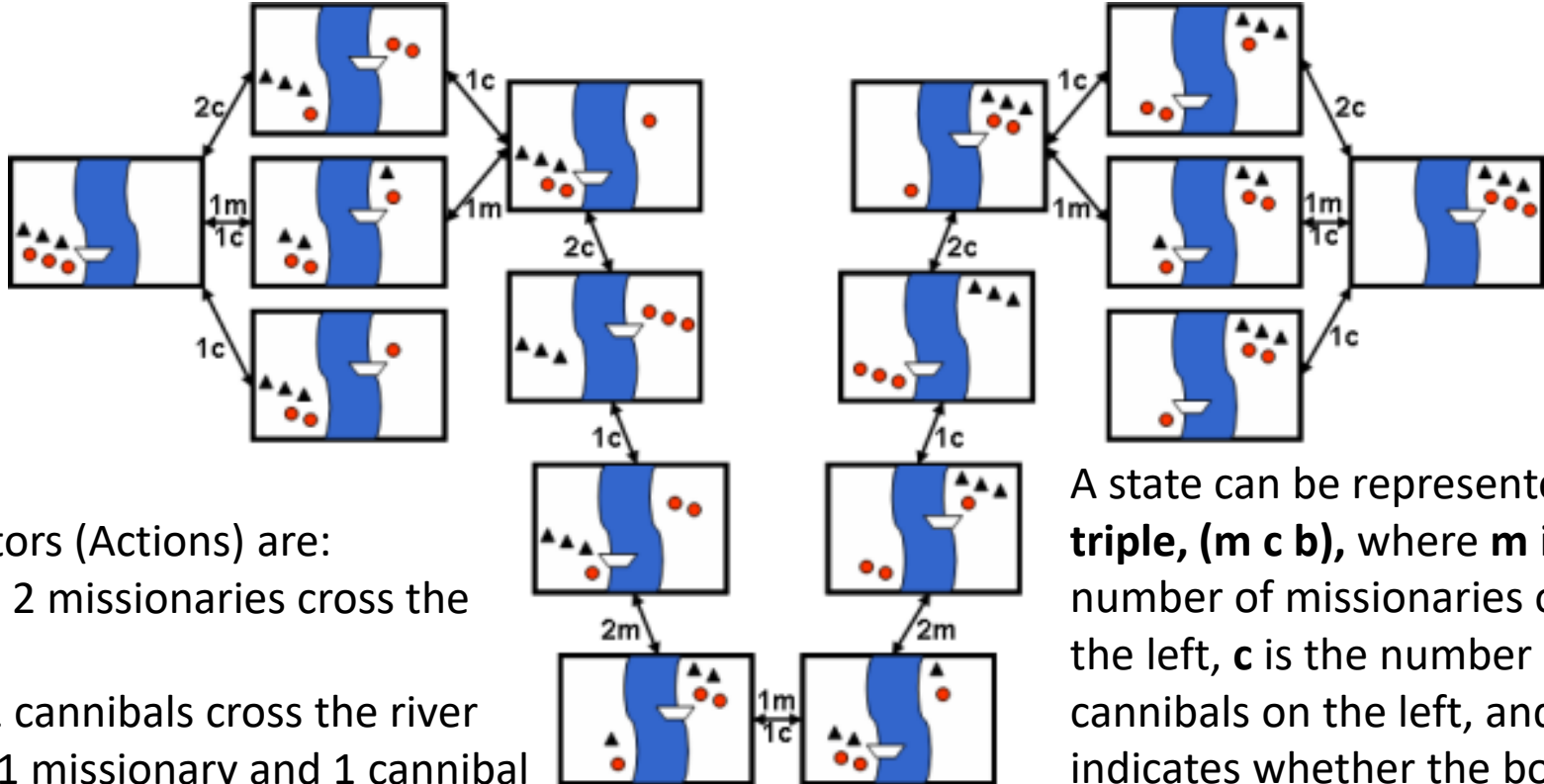


Toy Problem: Missionaries and Cannibals



- On one bank of a river are three **missionaries** (black triangles) and three **cannibals** (red circles). There is **one boat** available that can hold up to **two people** and that they would like to use to cross the river.
- If cannibals ever outnumber the missionaries on either of the river's banks, the missionaries will get eaten.
- How can the boat be used to safely carry all the missionaries and cannibals across the river?

Toy Problem: Missionaries and Cannibals

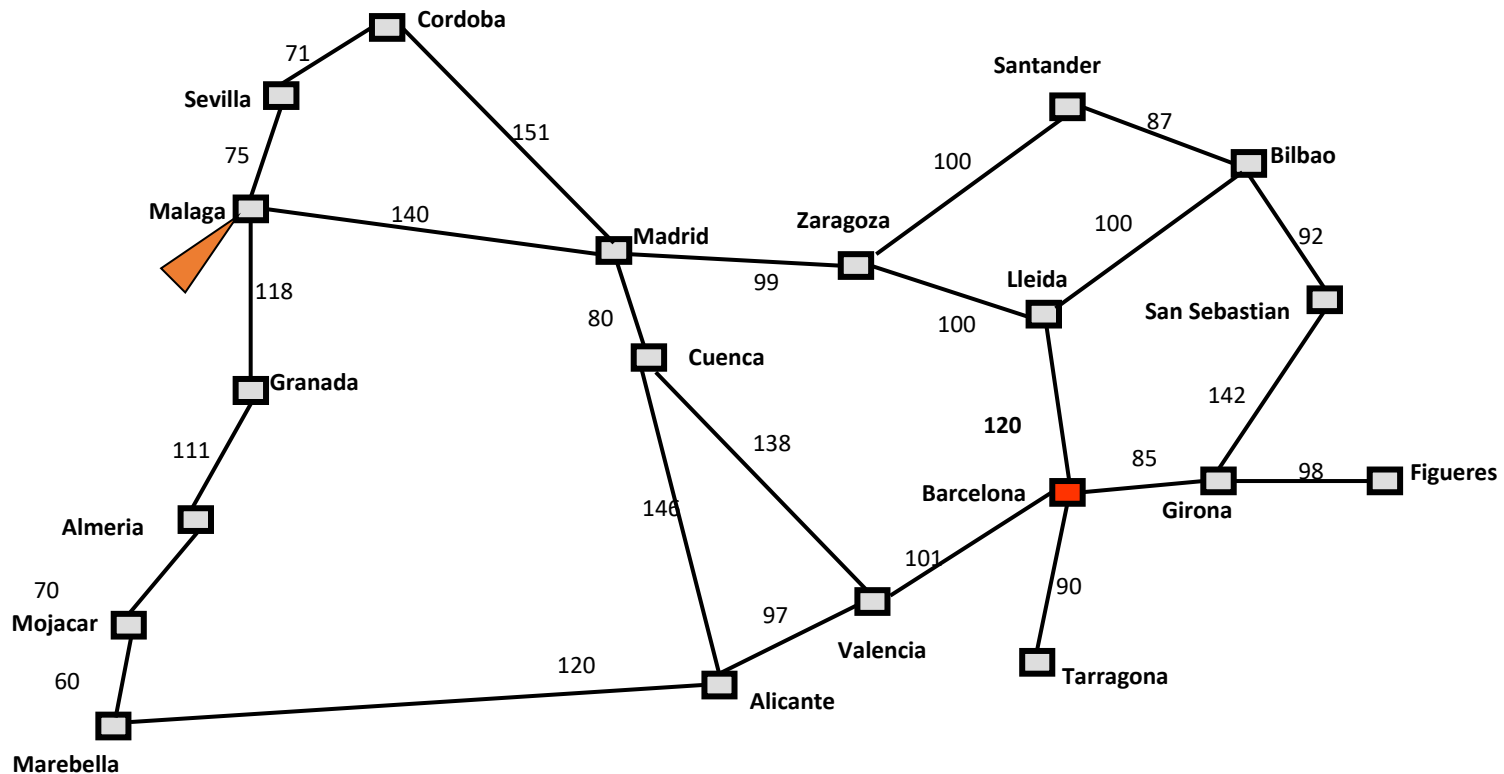


Operators (Actions) are:

- **MM**: 2 missionaries cross the river
- **CC**: 2 cannibals cross the river
- **MC**: 1 missionary and 1 cannibal cross the river
- **M**: 1 missionary crosses the river
- **C**: 1 cannibal crosses the river

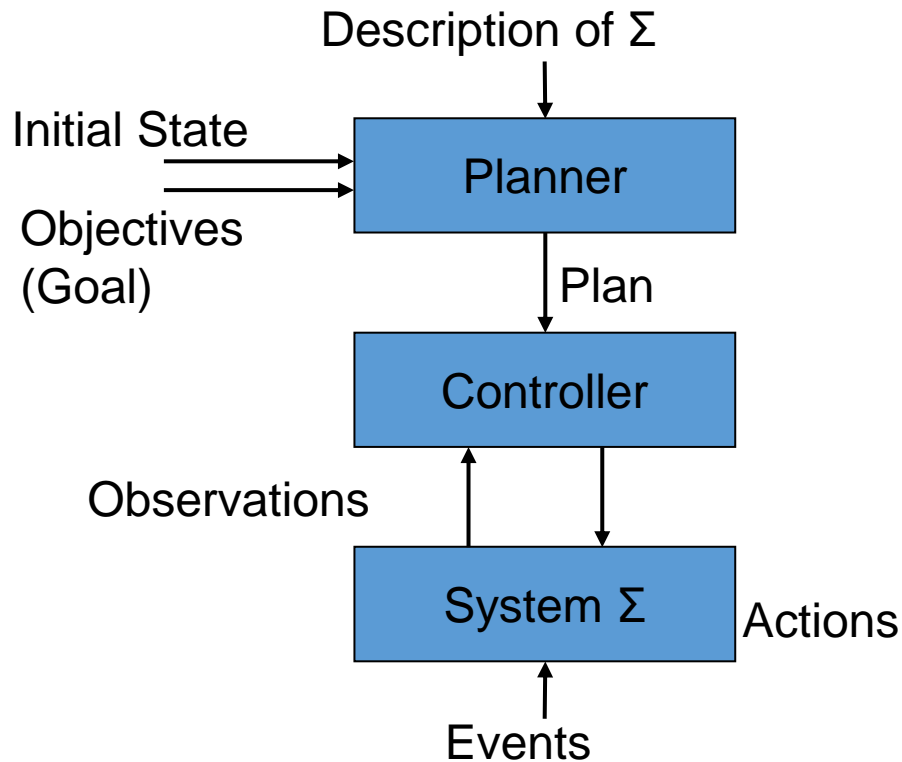
A state can be represented by a **triple, (m c b)**, where **m** is the number of missionaries on the left, **c** is the number of cannibals on the left, and **b** indicates whether the boat is on the **left bank** or **right bank**. The initial state is **(3 3 L)** and the goal state is **(0 0 R)**

Real-World Problem: Touring in Spain



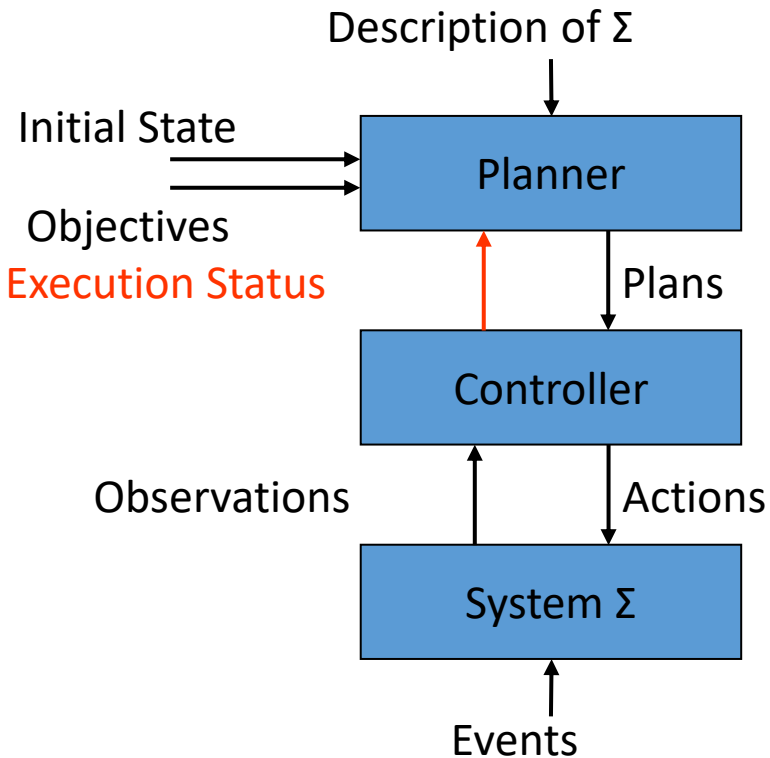
Planning and Plan Execution

Planning vs. Control



- planner:
 - given: description of Σ , initial state, objective
 - generate: plan that achieves objective
- controller:
 - given: plan, current state (observation function: $\eta: S \rightarrow O$)
 - generate: action
- state-transition system:
 - evolves as actions are executed and events occur

Dynamic Planning



- **problem**: real world differs from model described by Σ
- **more realistic model**: interleaved planning and execution
 - plan supervision
 - plan revision
 - re-planning
- **dynamic planning**: closed loop between planner and controller
 - execution status

Overview

- What is Planning (in AI)?
- A Conceptual Model for Planning
- **Planning and Search**
- Example Problems

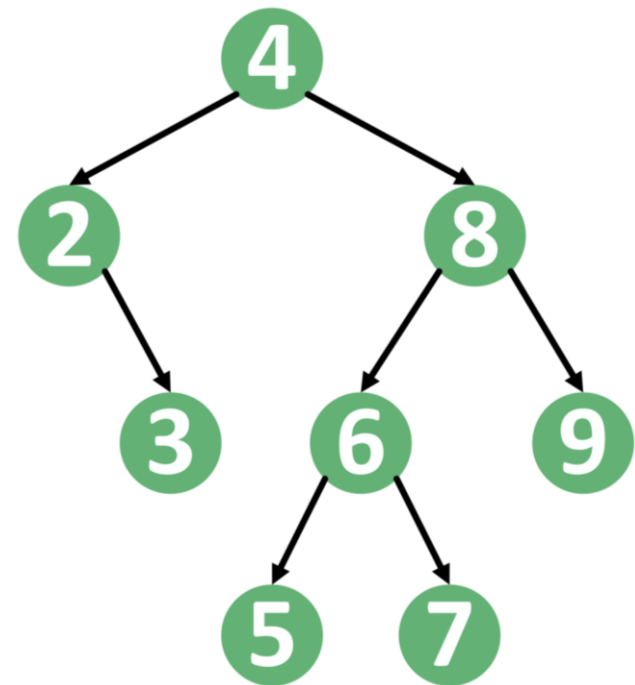
Planning as a Search Problem

Problem Formulation

- problem formulation
 - process of deciding what actions and states to consider
 - granularity/abstraction level
- assumptions about the environment:
 - finite and discrete
 - fully observable
 - deterministic
 - static
- other assumptions:
 - restricted goals
 - sequential plans
 - implicit time
 - offline planning

Search Nodes

- Search nodes: the nodes in the search tree
- data structure:
 - *state*: a state in the state space
 - *parent node*: the immediate predecessor in the search tree
 - *action*: the action that, performed in the parent node's state, leads to this node's state
 - *path cost*: the total cost of the path leading to this node
 - *depth*: the depth of this node in the search tree



General Tree Search Algorithm

```
function treeSearch(problem, strategy)  
  fringe  $\leftarrow$  { new searchNode(problem.initialState) }  
  loop  
    if empty(fringe) then return failure  
    node  $\leftarrow$  selectFrom(fringe, strategy)  
    if problem.goalTest(node.state) then  
      return pathTo(node)  
    fringe  $\leftarrow$  fringe + expand(problem, node)
```

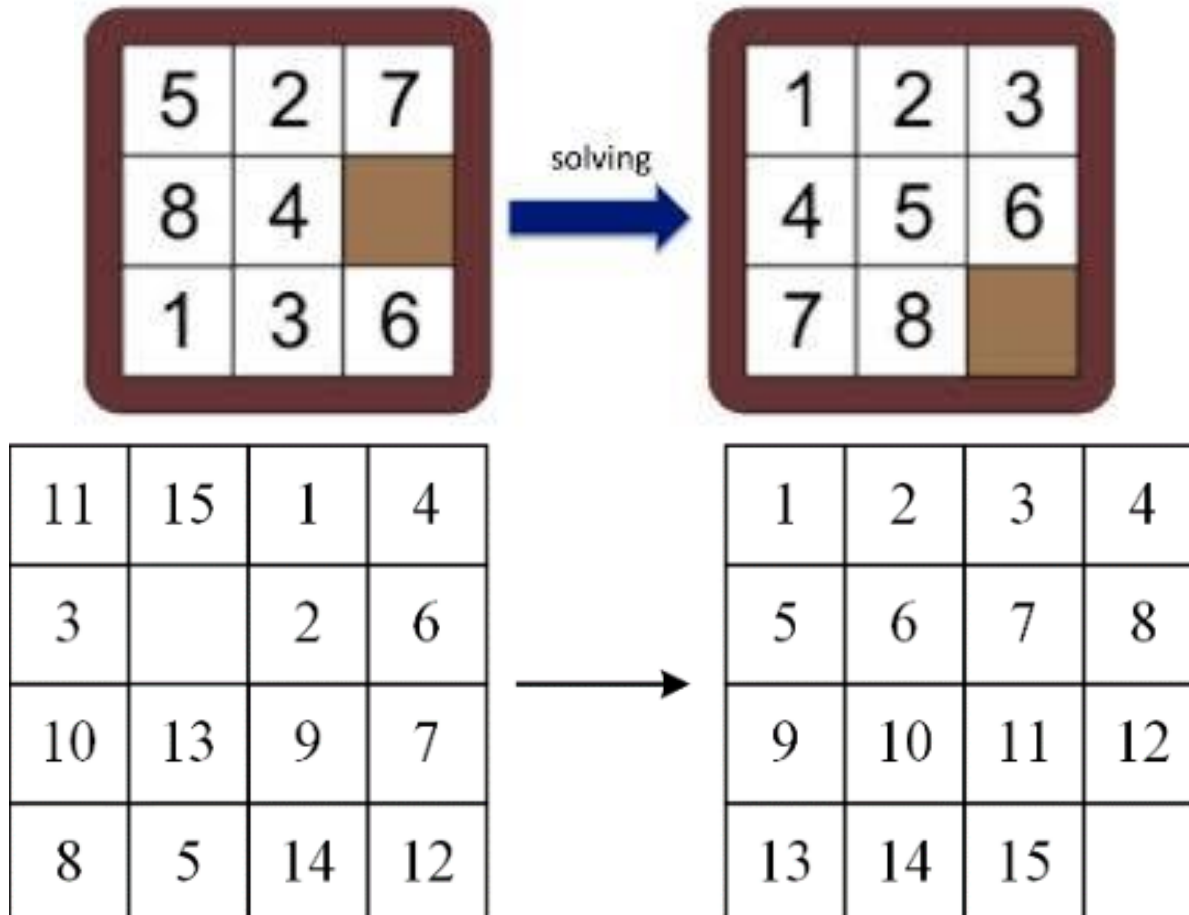
Search (Control) Strategy

- search or control strategy: an effective method for scheduling the application of the successor function to expand nodes
 - selects the next node to be expanded from the fringe
 - determines the order in which nodes are expanded
 - aim: produce a goal state as quickly as possible
- examples:
 - LIFO/FIFO-queue for fringe nodes
 - alphabetical ordering

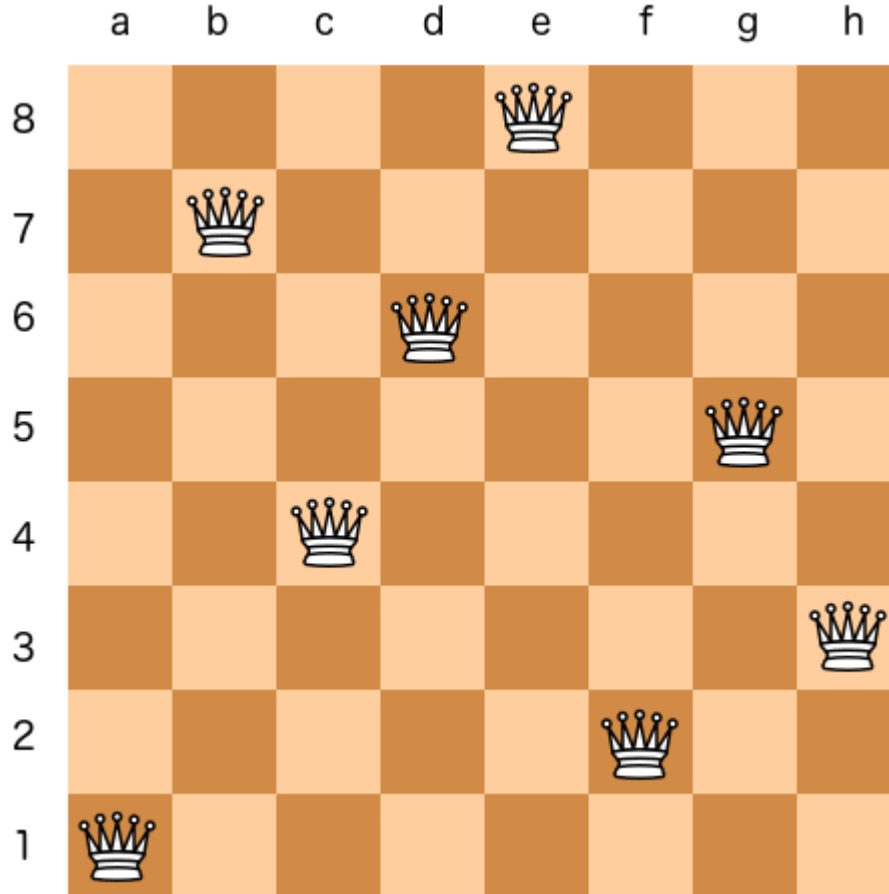
Overview

- What is Planning (in AI)?
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- Planning and Search
- **Example Problems**

Toy Problem: Sliding-Block Puzzle

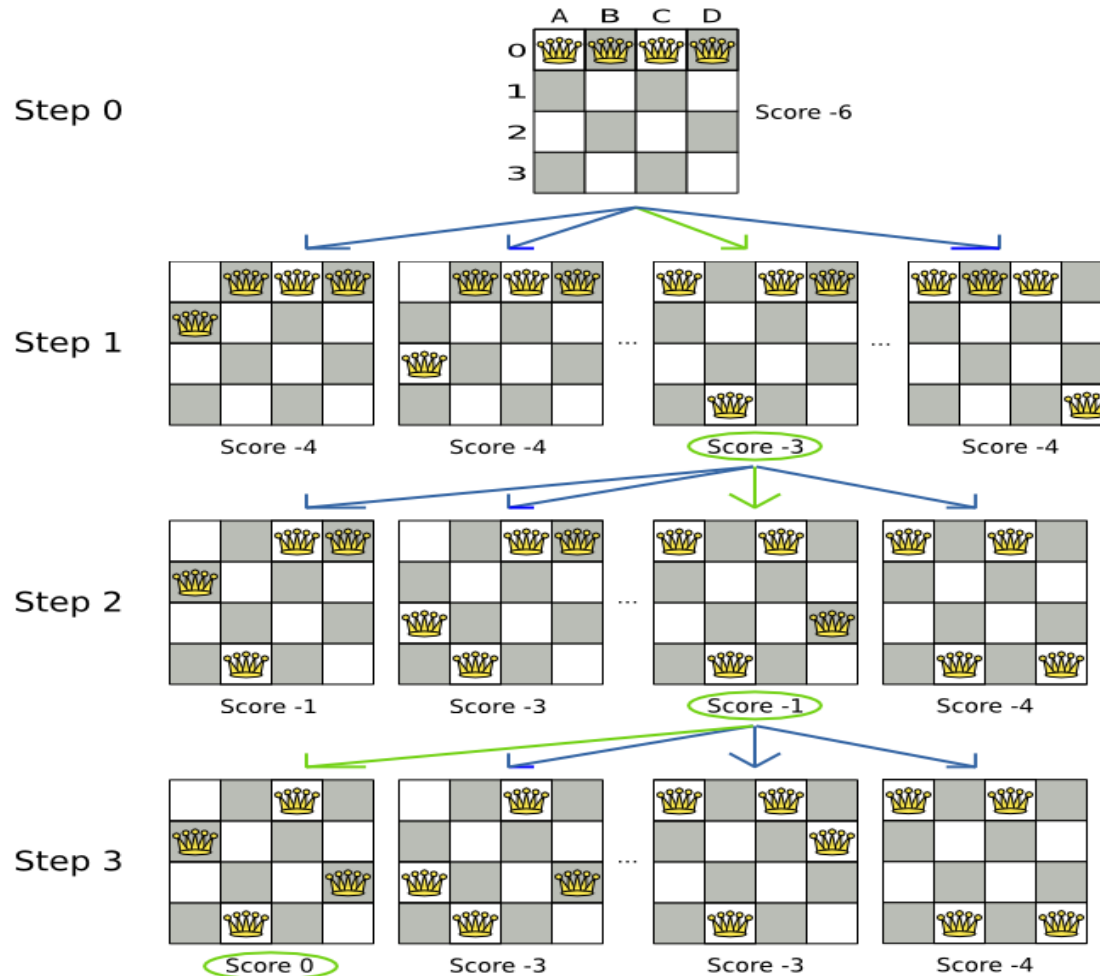


Toy Problem: *N*-Queens Problem



Place n queens on an n by n chess board such that none of the queens attacks any of the others.

Toy Problem: *N*-Queens Problem

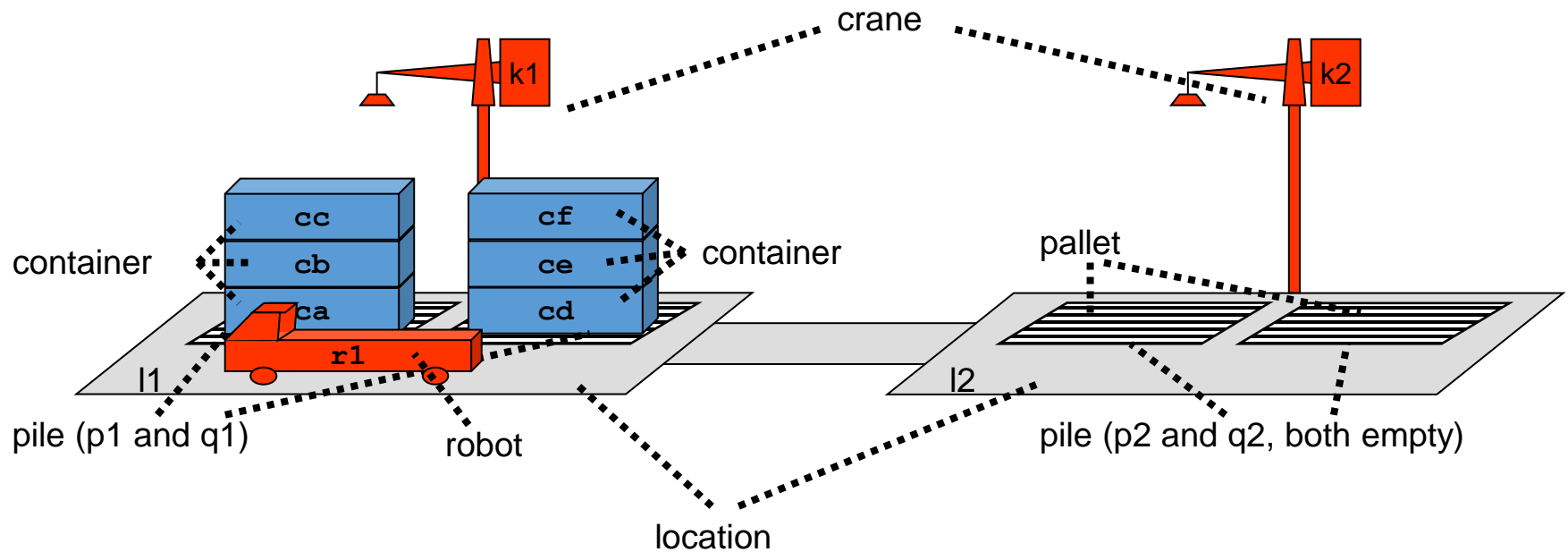


Dock-Worker Robots (DWR) Domain

- aim: have one example to illustrate planning procedures and techniques
- informal description:
 - harbour with several locations (docks), docked ships, storage areas for containers, and parking areas for trucks and trains
 - cranes to load and unload ships etc., and robot carts to move containers around



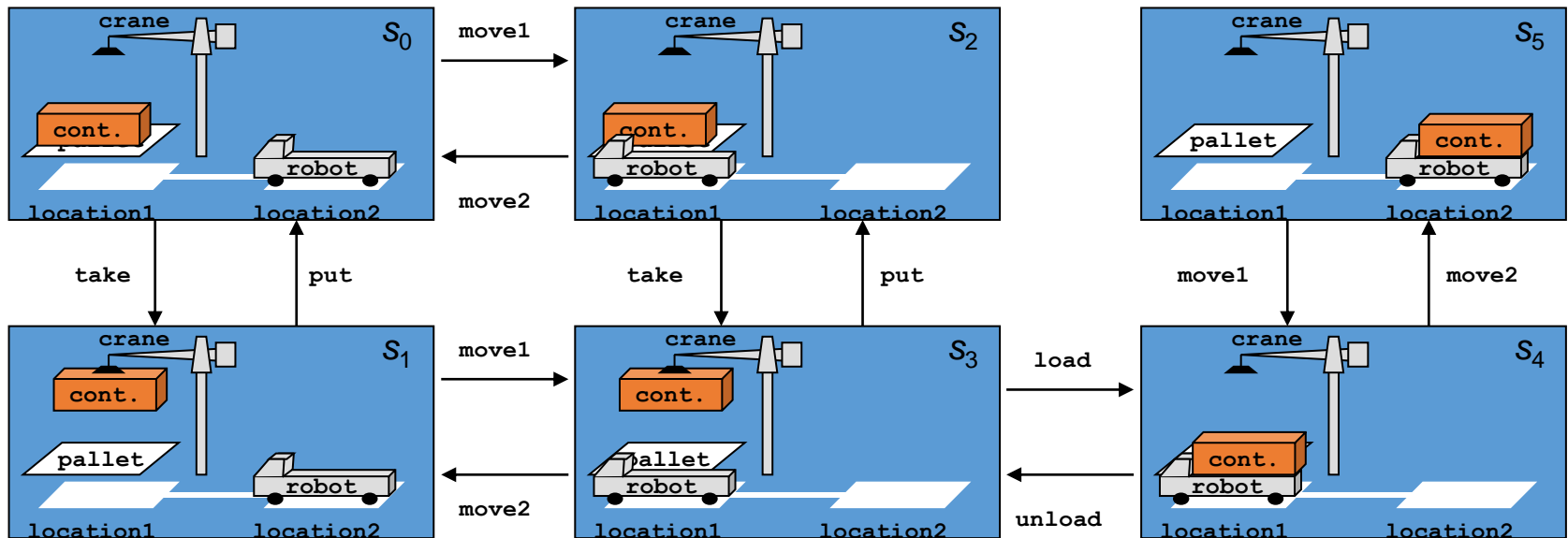
DWR Example State



Actions in the DWR Domain

- **move** robot r from location l to some adjacent and unoccupied location l'
- **take** container c with empty crane k from the top of pile p , all located at the same location l
- **put** down container c held by crane k on top of pile p , all located at location l
- **load** container c held by crane k onto unloaded robot r , all located at location l
- **unload** container c with empty crane k from loaded robot r , all located at location l

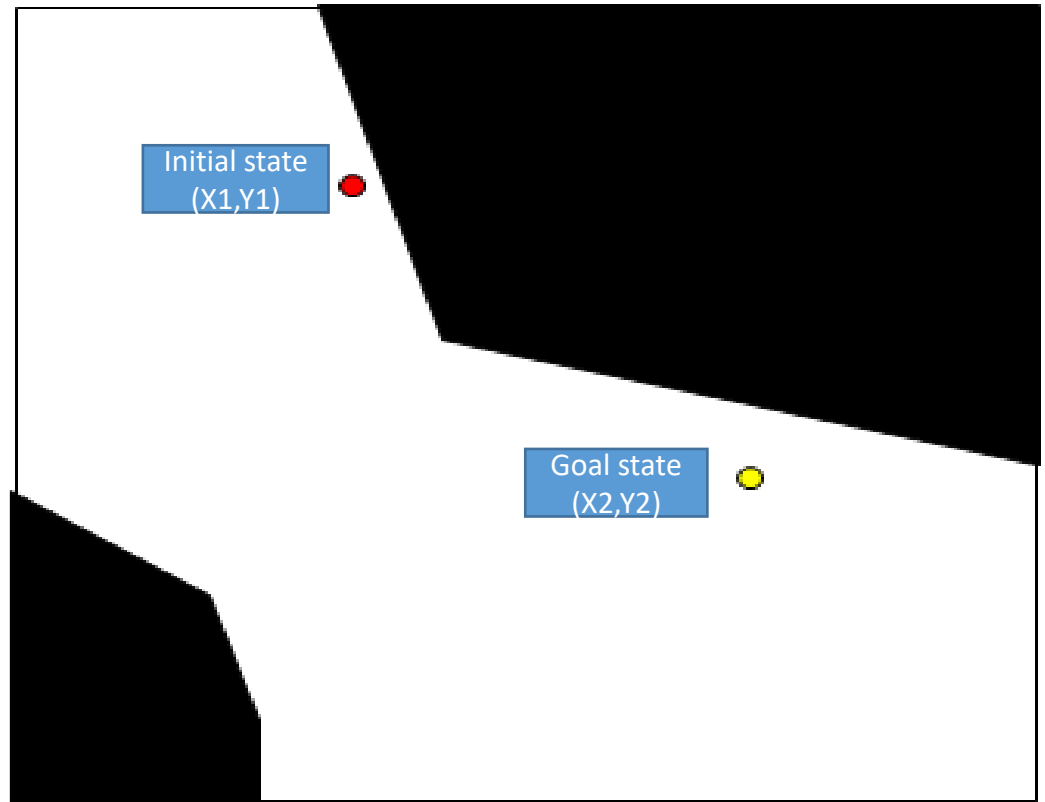
State-Transition Systems: Graph Example



Planning Examples

□ 2D path planning for omnidirectional robot

- What is model M^a ?
- What is Belief b_c^a ?
- What is *Belief* b_c^w ?
- What is the cost function C ? (Path)
- What is the goal G ?



Planning Examples

❑ 5D (x,y,z,direction,time) path planning for autonomous drone among people :

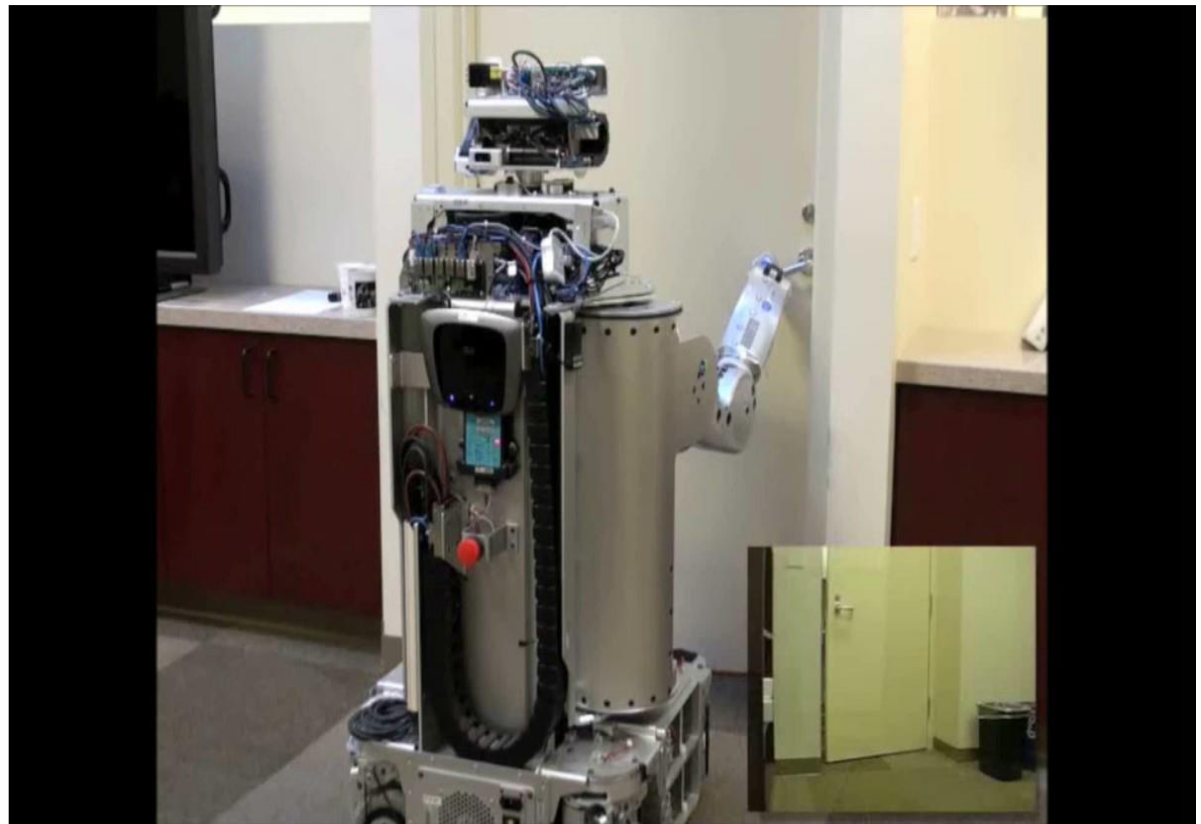
- What is M^a ?
- What is b_c^a ?
- What is b_c^w ?
- What is C ?
- What is G ?



Planning Examples

□ Motion planning for a mobile manipulator PR2 opening a door

- What is M^a ?
- What is b_c^a ?
- What is b_c^w ?
- What is C ?
- What is G ?




Planning Examples

□ Planning a travel from Barcelona to Palma Mallorca

- What is M^a ?
- What is b_c^a ?
- What is b_c^w ?
- What is C ?
- What is G ?

Ida y vuelta ▼ 1 adulto ▼ Económica ▼

✈ Barcelona (BCN) ✈ Palma de Mallorca (PMI) jue. 1/8 jue. 15/8 🔍

CONSEJO **Comprar** 
Es poco probable que el precio baje en los próximos 7 días ⓘ
Haz seguimiento de precios ☐ NO

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Escalas
☒ Directo 65 €
☒ 1 escala ▼ 170 €
☒ 2 escalas o más ▼

LAS MEJORES OPCIONES ⓘ

<input type="checkbox"/>		18:45 — 19:30 Air Europa	directo	0h 45m BCN - PMI		65 € eDreams	Ver oferta
<input type="checkbox"/>		6:30 — 7:25 Ryanair	directo	0h 55m PMI - BCN			
		97 € Kiwi.com	103 € Rumbo.es	3 más ▼			
<input type="checkbox"/>		18:45 — 19:30 Air Europa	directo	0h 45m BCN - PMI		71 € eDreams	Ver oferta
<input type="checkbox"/>		20:00 — 20:50 Ryanair	directo	0h 50m PMI - BCN			
		94 € Kiwi.com	110 € Rumbo.es	3 más ▼			

Continuous vs. Discrete vs. Hybrid Model

Continuous



Hybrid



Discrete

Ida y vuelta 1 adulto Económica

Barcelona (BCN) Palma de Mallorca (PMI) Jue. 1/8 Jue. 15/8

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<input type="checkbox"/> Ae Air Europa	18:45 — 19:30	directo	0h 45m BCN - PMI	71 € eDreams	Ver oferta
<input type="checkbox"/> Ryanair	20:00 — 20:50	directo	0h 50m PMI - BCN		

End

