

# Classical Planning via State-space search

Mostly from slides by  
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with slight modifications (in green).

Originals here:

<http://www.cse.unsw.edu.au/~cs3431/wiki/slides/2008/malcolmr-planning/CS3431-1.ppt>

# Textbook

- Chapter 10 is entirely on classical planning.

# What is planning?

Planning is an AI approach to control

Deliberation about action

Key ideas

- We have a **model** of the world

- Model describes **states** and **actions**

- Give the planner a **goal** and it outputs a **plan**

- Aim for **domain independence**

Planning is search

# Classical planning

**Classical planning** is the name given to early planning systems (before about 1995)

Most of these systems are based on the Fikes & Nilsson's STRIPS notation for actions

Includes both **state-space** and **plan-space** planning algorithms.

# The Model

Planning is performed based on a given model of the world.

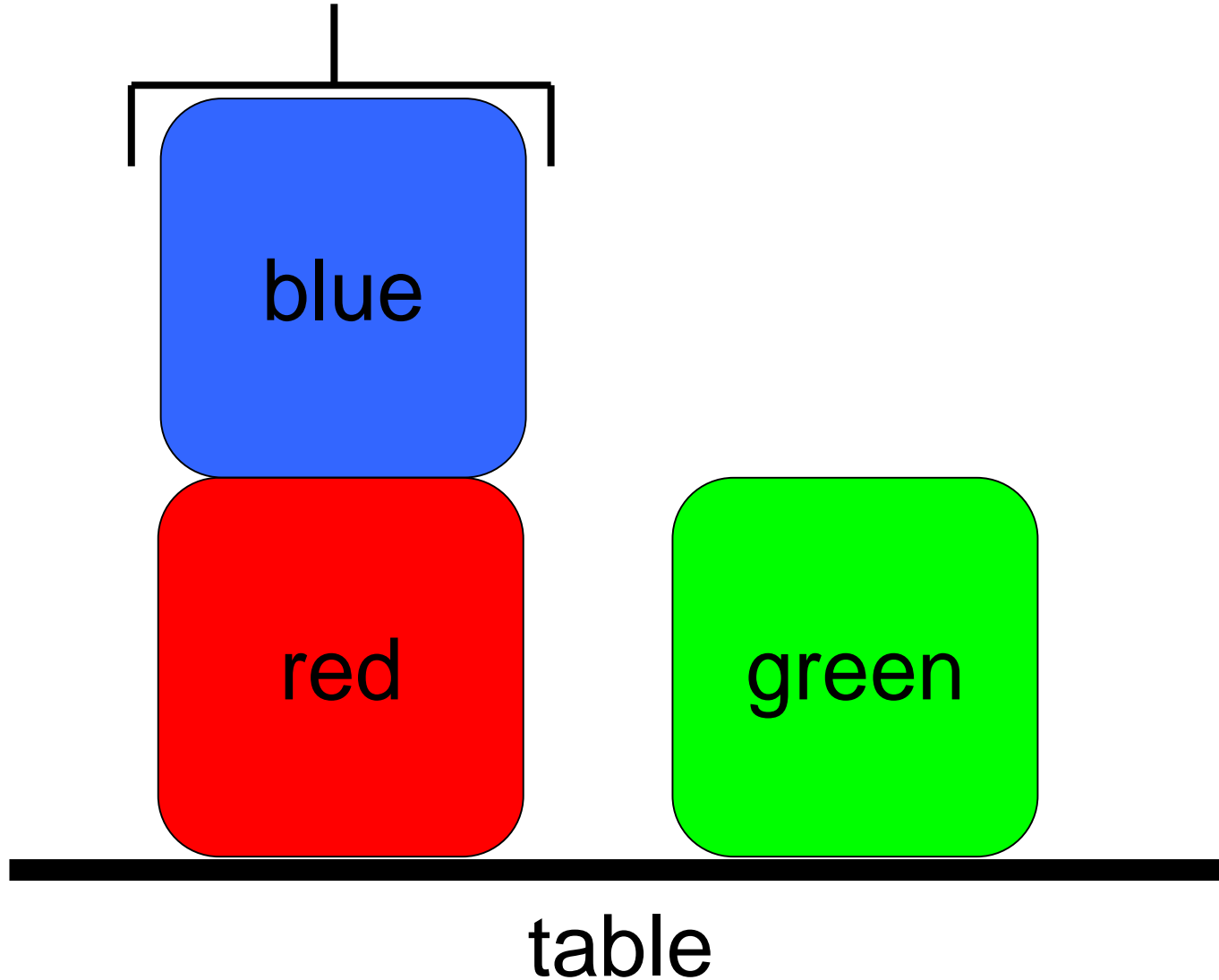
A model  $\Sigma$  includes:

- A set of states,  $S$
- A set of actions,  $A$
- A transition function,  $\gamma : S \times A \rightarrow S$

# Restrictions on the Model

1.  $S$  is **finite**
2.  $\Sigma$  is **fully observable**
3.  $\Sigma$  is **deterministic**
4.  $\Sigma$  is **static** (no external events)
5.  $S$  has a **factored representation**
6. Goals are restricted to **reachability**.
7. Plans are **ordered sequences** of actions
8. Actions have **no duration**
9. Planning is done **offline**

# Example: Blocks World

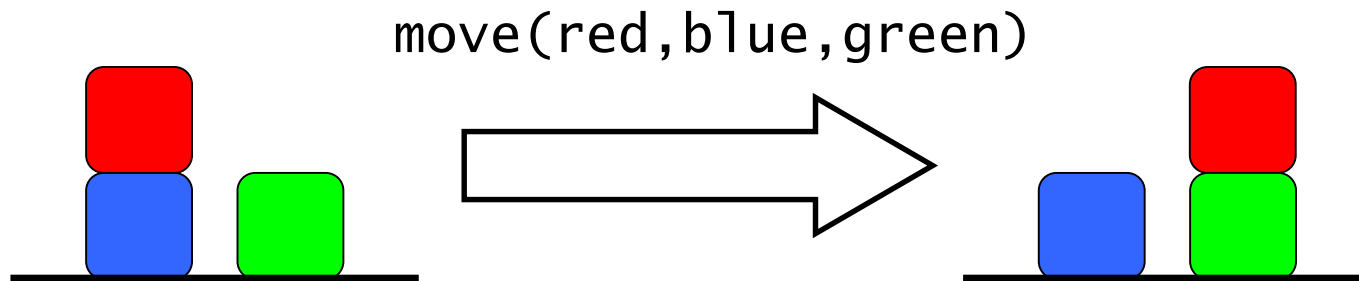


# Example: Blocks World

$S$  = the set of all different configurations of the blocks

$A$  = the set of “move” actions

$\gamma$  describes the outcomes of actions





# States, actions and goals

States, actions and goals are described in the language of **symbolic logic**.

**Predicates** denote particular features of the world:

Eg, in the blocks world:

- `on(block1, block2)`
- `on_table(block)`
- `clear(block)`

# Representing States

States are described by conjunctions of ground predicates (possibly negated).

`on(blue, red)  $\wedge$   $\neg$  on(green, red)`

The **closed world assumption** (CWA) is employed to remove negative literals:

`on(blue, red)`

That is, everything that is not explicitly stated to be true is assumed to be false.

The state description is **complete**.

# Representing Goals

The goal is the specification of the task

A goal is a usually conjunction of predicates:

`on(red, green) ∧ on_table(green)`

The CWA does **not** apply.

So the above goal could be satisfied by:

`on(red, green) ∧ on_table(green) ∧  
on(blue, red) ∧ clear(blue) ∧ ...`

# Representing Actions

Actions are described in terms of **preconditions** and **effects**.

Preconditions are predicates that must be true **before** the action can be applied.

Effects are predicates that are made true (or false) **after** the action has executed.

Sets of similar actions can be expressed as a **schema** (roughly, actions with variables).

# STRIPS operators

An early but still widely used form of action description is as “STRIPS operators”.

Three parts:

**Precondition** A conjunction of predicates

**Add-list** The set of predicates made **true**

**Delete-list** The set of predicates made **false**

# Blocks World Action Schema

`move(block, from, to)`

Pre:

`on(block, from) , clear(block) ,  
clear(to)`

Add:

`on(block, to) , clear(from)`

Del:

`on(block, from) , clear(to)`

# Blocks World Actions

Note that this action schema defines many actions:

move(red, blue, green)

move(red, green, blue)

etc...

We also need to define:

move\_to\_table(*block*, *from*)

move\_from\_table(*block*, *to*)

# Representing Plans

A plan is simply a **sequence** of actions.eg

```
 $\pi$  = move_from_table(red, blue),  
      move(red, blue, green),  
      move_to_table(red, green)
```

We require that every action in the sequence is **applicable**, i.e. its precondition is true before it is executed.



# Reasoning with STRIPS

An action  $a$  is **applicable** in state  $s$  if its precondition is satisfied, ie:

$$\text{pre}^+(a) \subseteq s$$

$$\text{pre}^-(a) \cap s = \emptyset$$

The result of executing  $a$  in  $s$  is given by:

$$\gamma(s, a) = (s - \text{del}(a)) \cup \text{add}(a)$$

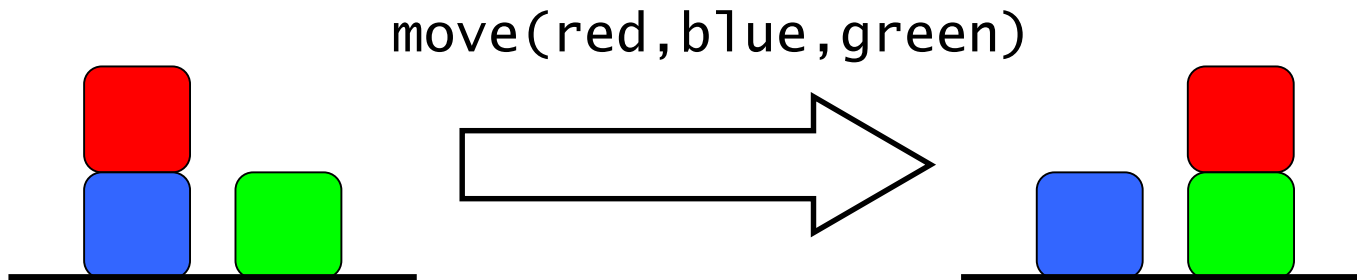
This is called **progressing**  $s$  through  $a$

# Progression example

Taking the earlier example:

```
S = on(red, blue), on_table(blue),  
    clear(red), on_table(green),  
    clear(green)
```

```
a = move(red, blue, green)
```



# Progression example

1. Check action is applicable:

`on(red, blue), clear(red), clear(green)`

2. Delete predicates from delete-list:

`on(red, blue), on_table(blue),  
clear(red), on_table(green),  
clear(green)`

3. Add predicates from add-list:

`on_table(blue), clear(red),  
on_table(green), on(red, green),  
clear(blue)`

# Progression example 2

Consider instead the action

`a = move_from_table(blue, green)`

This has precondition:

`pre(a) = on_table(blue), clear(blue),  
clear(green)`

This action cannot be executed as

`clear(blue)` is not in `s`.

i.e. it is not applicable

# Reasoning with STRIPS

We can also **regress** states.

If we want to achieve goal  $g$ , using action  $a$ ,  
what needs to be true beforehand?

An action  $a$  is **relevant** for  $g$ , if:

$$g \cap \text{add}(a) \neq \emptyset$$

$$g \cap \text{del}(a) = \emptyset$$

The result of regressing  $g$  through  $a$  is:

$$\gamma^{-1}(g, a) = (g - \text{add}(a)) \cup \text{pre}(a)$$

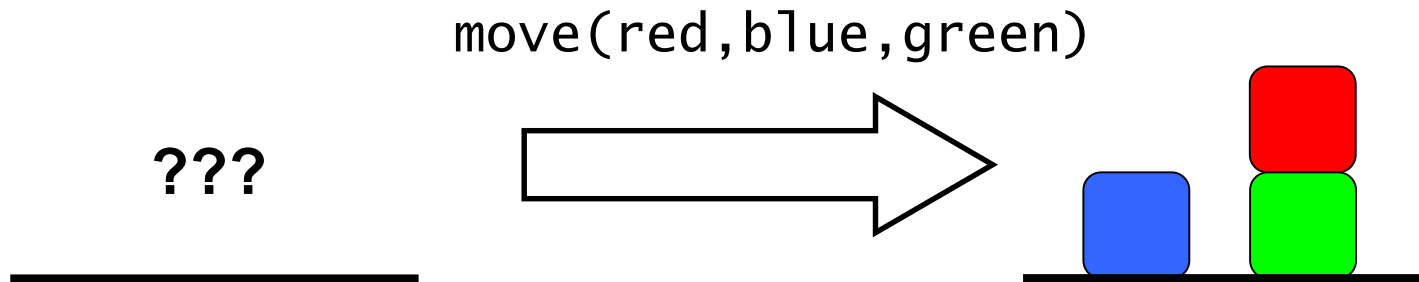
# Regression Example

Take the goal:

`g = on (red, green) , on_table (blue)`

Regress through action:

`a = move (red, blue, green)`



# Regression Example

1. Check action is relevant:

$$g \cap \text{add}(a) = \{\text{on}(\text{red}, \text{green})\} \neq \emptyset$$

$$g \cap \text{del}(a) = \emptyset$$

2. Remove predicates from add list:

**on(red, green)**, on\_table(blue)

3. Add preconditions:

on\_table(blue), **on(red, blue)**,  
**clear(red)**, **clear(green)**

# Regression example 2

Consider instead the action

$a = \text{move\_to\_table}(\text{red}, \text{blue})$

This has effects:

$\text{add}(a) = \text{on\_table}(\text{red}), \text{clear}(\text{blue})$

This action is not relevant as it does not achieve any of the goal predicates, ie:

$$g \cap \text{add}(a) = \emptyset$$



# Regression Example 3

Consider instead the goal

$$g = \text{clear}(\text{blue}) , \text{clear}(\text{green})$$

Now  $a = \text{move}(\text{red}, \text{blue}, \text{green})$  achieves  $\text{clear}(\text{blue})$  but is not relevant, as it conflicts with the goal:

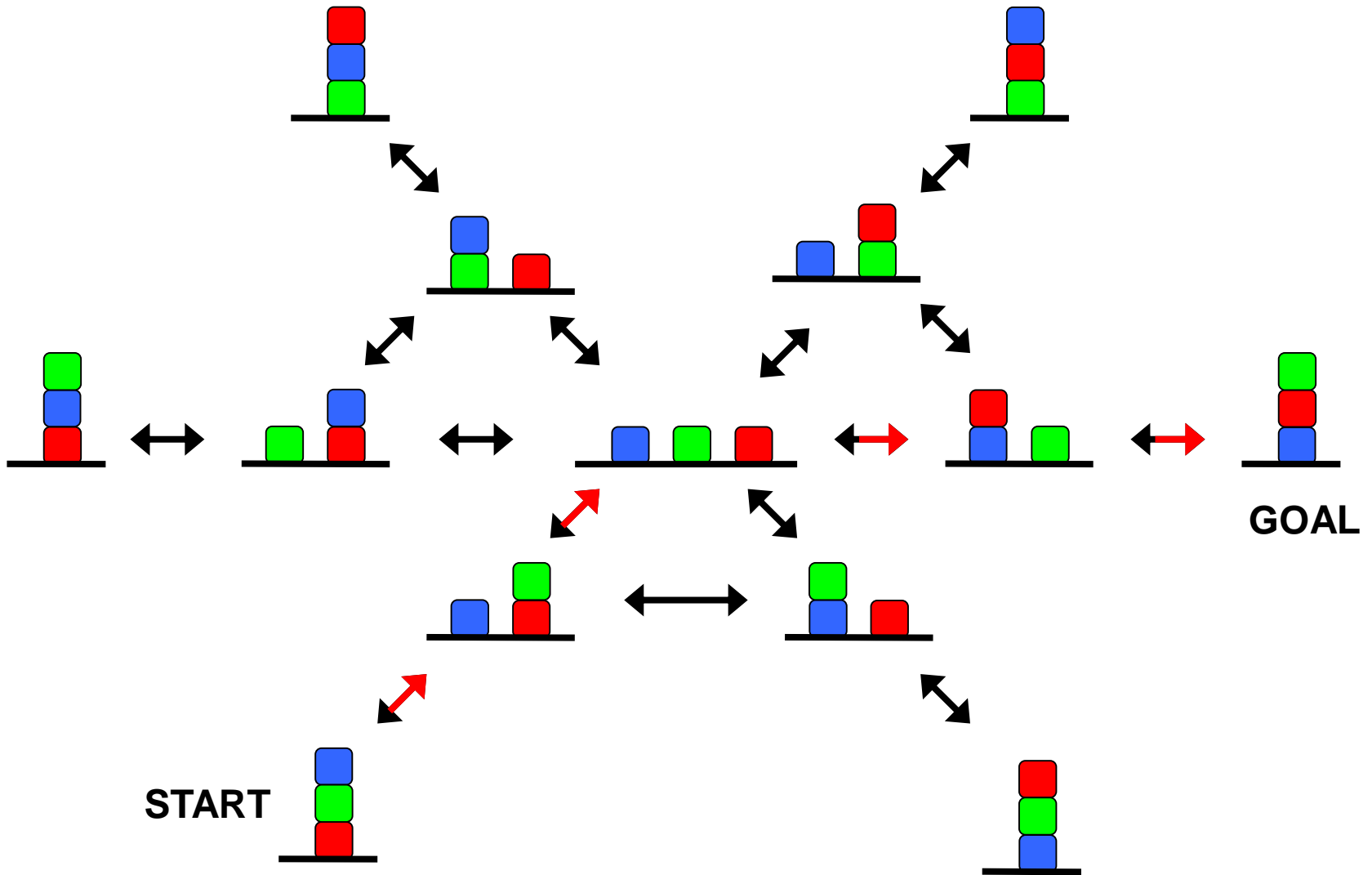
$$g \cap \text{del}(a) = \{\text{clear}(\text{green})\} \neq \emptyset$$

# Planning as state-space search

Imagine a directed graph in which nodes represent states and edges represent actions.

An edge joins two nodes if there is an action that takes you from one state to the other.

# Graph of state space



# Forward/Backward chaining

Planning can be done as **forward** or **backward chaining**.

Forward chaining starts at the initial state and searches for a path to the goal using progression.

Backward chaining starts at the goal and searches for a path to the initial state using regression.

# Forward Search

Forward-search( $s, g$ )

**if**  $s$  satisfies  $g$  **then** return empty plan

$applicable = \{a \mid a \text{ is applicable in } s\}$

**if**  $applicable = \emptyset$  **then** fail

**choose** action  $a \in applicable$

$s' = \gamma(s, a)$

$\pi' = \text{Forward-search}(s', g)$

return  $a.\pi'$

# Backward Search

Backward-search( $s, g$ )

**if**  $s$  satisfies  $g$  **then** return empty plan

$relevant = \{a \mid a \text{ is relevant to } g\}$

**if**  $relevant = \emptyset$  **then** fail

**choose** action  $a \in relevant$

$g' = \gamma^{-1}(g, a)$

$\pi' = \text{Backward-search}(s, g')$

return  $\pi'.a$

# Heuristics for planning

Remember  $A^*$ : we want an (under) estimate of the distance to a goal. One approach: do a quick plan (for the node to be evaluated) under relaxed constraints. For example:

- ***Ignore preconditions:*** How many steps would it take if actions had no preconditions?
- ***Ignore delete lists:*** How many steps would it take if actions had no delete lists?

Are these admissible? Do you see any issues?