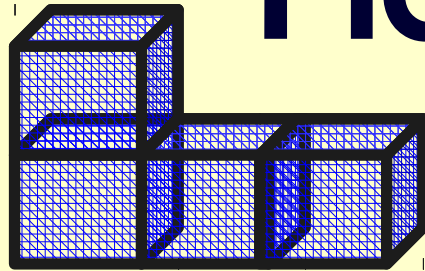
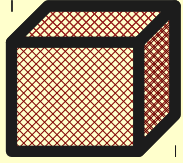


# Deterministic Sequential Planning

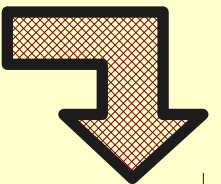
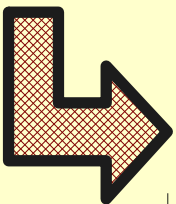


*Milan Ježek*

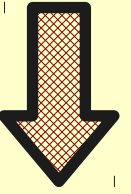


# Outline

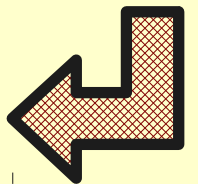
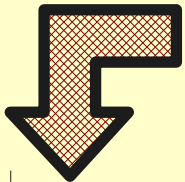
- ◆ **Deterministic sequential planning**
- ◆ **Best planners of IPC 2011**
- ◆ **Plan-space planning**
- ◆ **My Basic Planner**

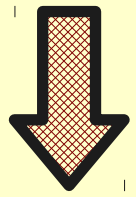


# Restricted State-Transition System $\Sigma = (S, A, \gamma)$



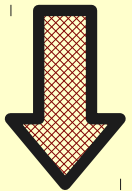
- **S** - Set of **states**
- **A** - Set of **actions**
- (**E** - Set of **events**)
- **$\gamma$**  - Transition function  $\gamma: S \times A \rightarrow P(S)$

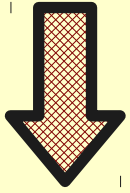




# Planning Problem $P = (\Sigma, s_0, g)$ :

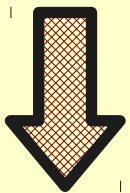
- $\Sigma$  - System modeling **states** and **transitions**
- $s_0$  - The **initial state**
- $g$  - The **goal states**

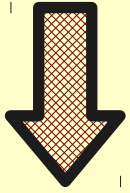




# States and Goals

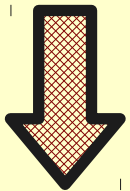
- ◆ Represented as **sets of facts**
- ◆ **Closed World Assumption (CWA)**
  - ◆ Fact not listed in a state are assumed to be false
- ◆ **Goal state** - any state with all the goal facts

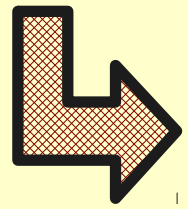




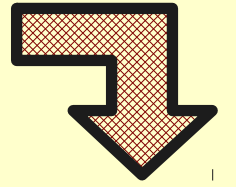
# Operators and Actions

- ◆ **Operator**  $o = (\text{name}(o), \text{precond}(o), \text{effects}(o))$
- ◆ An **action** is any ground instance of an operator
- ◆ **Move**( $r, l, m$ ) // Example of an operator
  - ◆ **Precond:**  
adjacent( $l, m$ ), at( $r, l$ ), not occupied( $m$ )
  - ◆ **Effects:**  
at( $r, m$ ), occupied( $m$ ), not occupied( $l$ ), not at( $r, l$ )

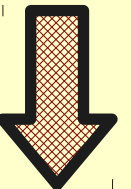




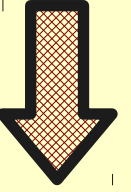
# Solution of Planning Problem



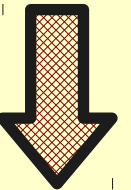
- Sequence of **actions**  $\langle a_1, a_2, \dots, a_k \rangle$
- Sequence of **states**  $\langle s_0, s_1, \dots, s_k \rangle$
- Such that:
  - $s_i = \mathbf{\gamma}(s_{i-1}, a_i)$
  - $s_k$  satisfies  $g$



# Extensions of the Classical Representation

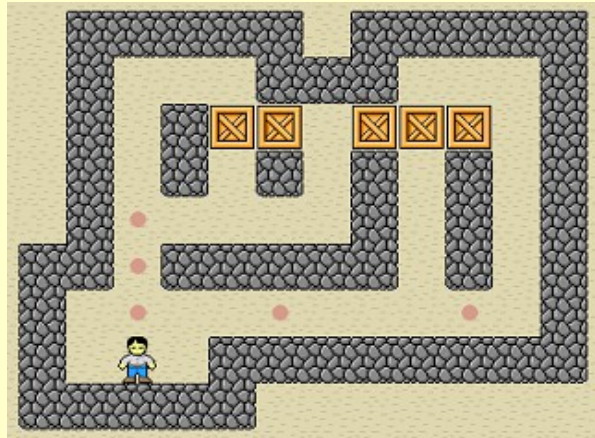
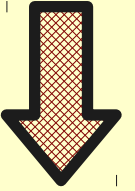


- ◆ Typed variables
- ◆ Non-negative costs
- ◆ Conditional effects
- ◆ Optional - derived predicates





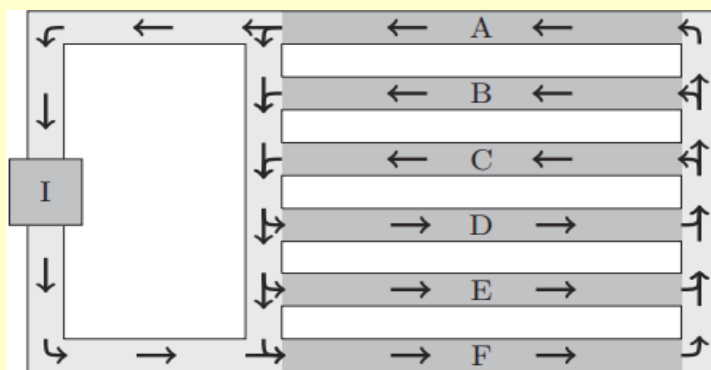
# Sequential Satisfying Domains



◆ Sokoban

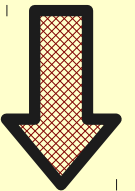


◆ Peg solitaire

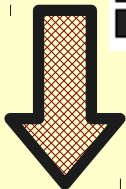
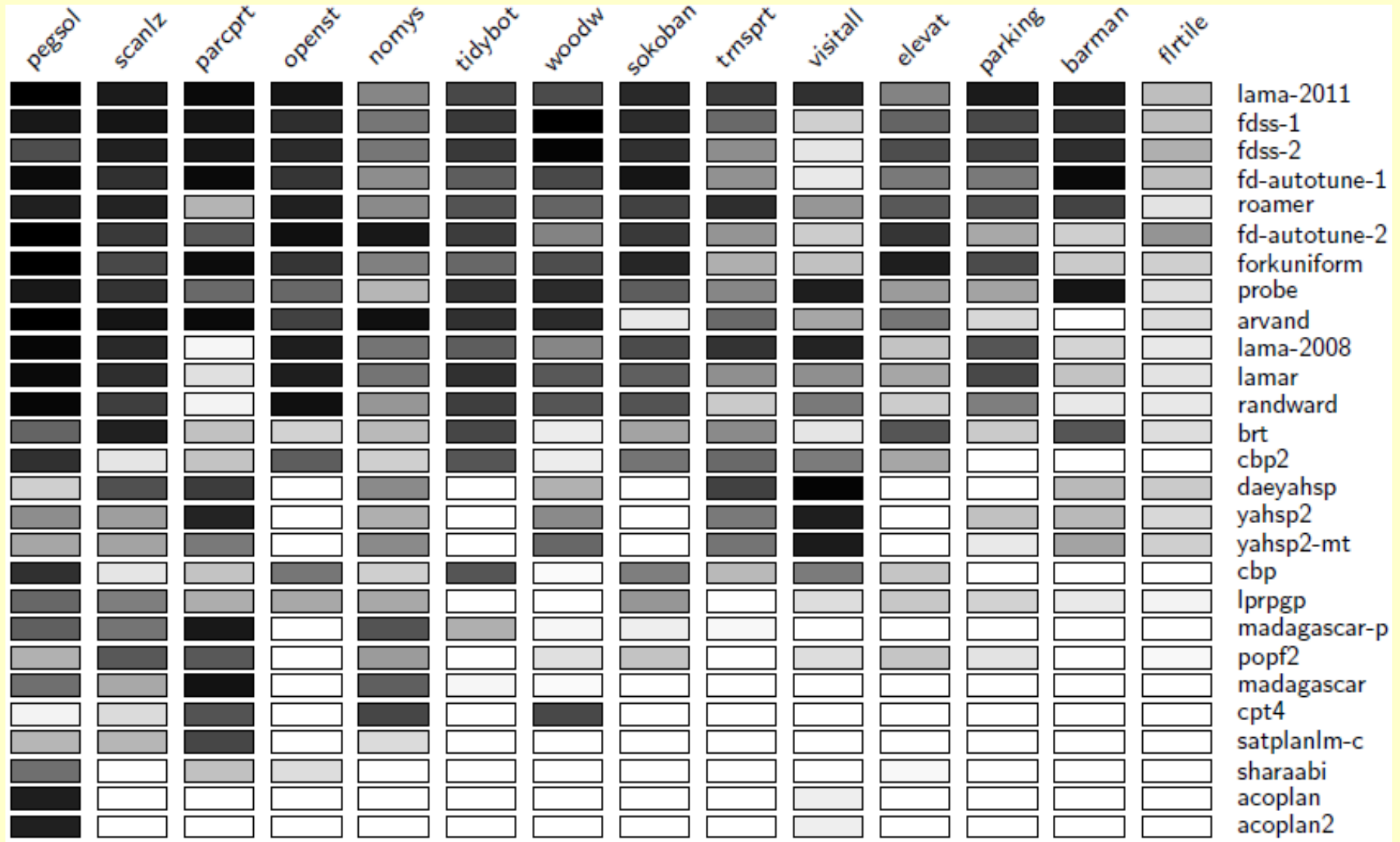
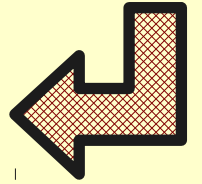
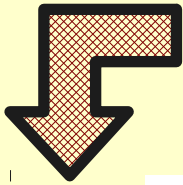


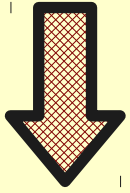
◆ Scanalyzer

- ◆ TSP
- ◆ Elevators
- ◆ Transport



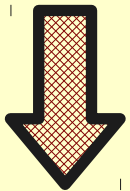
# Best planners of IPC 2011

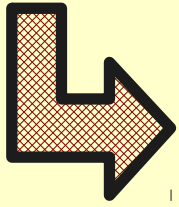




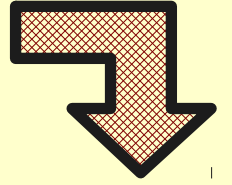
# Some used **techniques**

- Forward search, planning graph
- ◆ **Landmarks** - variable assignments that must occur at some point in every solution plan
- ◆ ACOPlan - **Ant colony optimization**
- ◆ Arvand - **Monte Carlo random walks (MRW)**
- ◆ BRT - (**Biased Rapidly exploring Tree**)
- ◆ Divide-and-Evolve – **Evolutionary computation**
- ◆ Fast downward (autotune), lama – **various algorithms and heuristics**
- ◆ Madagascar – **SAT**
- ◆ POPF2 - **Forward-Chaining Partial Order Planner**

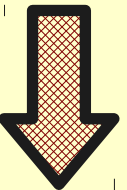




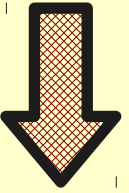
# Plan-Space Planning



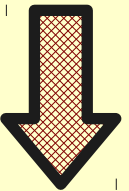
- Partially specified plans
- Refinement operations
- Least commitment principle



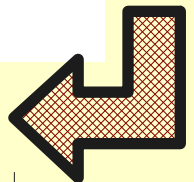
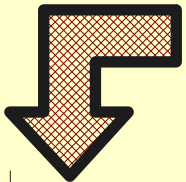
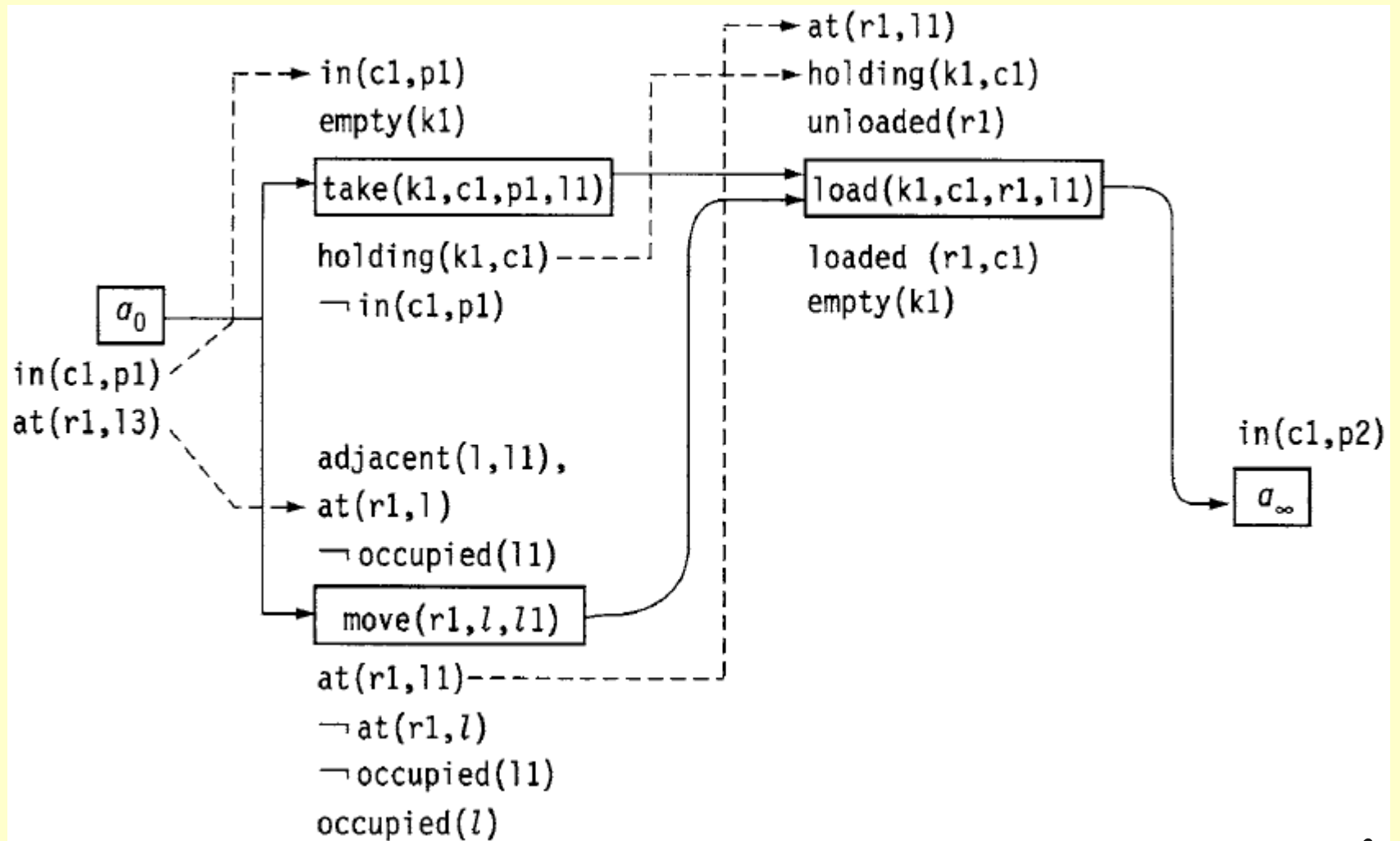
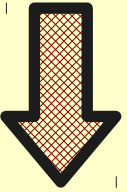
# Partial Plan $\Pi = (A, <, B, L)$

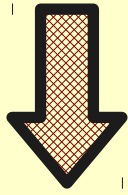


- **A** - Set of **partially instantiated operators**  $\{a_1, \dots, a_k\}$
- **<** - **Partial order** on A ( $a_i < a_j$ )
- **B** - Set of **constraints**  $x=y, x \neq y$  or  $x \in D_x$
- **L** - Set of **causal relations** ( $p: a_i \rightarrow a_j$ )



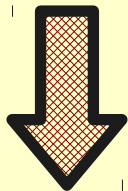
# Partial Plan $\Pi = (A, <, B, L)$





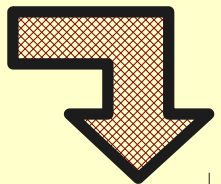
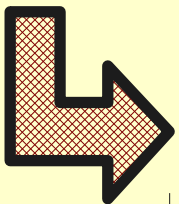
# Plan-Space Planning

- ◆ Start with an **empty plan**
- ◆ **Repair** all **flaws** in partial plan step by step
  - ◆ **Add actions** to satisfy **open goals**
  - ◆ **Remove threats**
    - ◆ **Bind variables**
    - ◆ **Add ordering** between actions
    - ◆ **Add causal relations**



# **Solution** for problem $P = (E, s_0, g)$

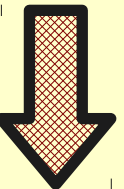
- ♦ Partial plan  $\Pi = (A, <, B, L)$ 
  - ♦ Partial ordering  $<$  and constraints  $B$  are **globally consistent**
  - ♦ **Any linearly ordered sequence of fully instantiated actions from  $A$  satisfying  $<$  and  $B$  goes from  $s_0$  to a state satisfying  $g$**





**Solution** for problem  $P = (E, s_0, g)$  ↓

- ♦ Partial plan  $\Pi = (A, <, B, L)$ 
  - ♦ Partial ordering  $<$  and constraints  $B$  are **globally consistent**
  - ♦ There are **no flaws**
    - ♦ No open goals
    - ♦ No threats



# PSP procedure

PSP( $\pi$ )

flaws  $\leftarrow$  OpenGoals( $\pi$ )  $\cup$  Threats( $\pi$ )

**if** flaws =  $\emptyset$  **then return**  $\pi$

**select any** flaw  $\varphi \in$  flaws

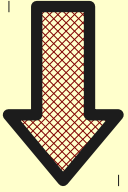
resolvers  $\leftarrow$  Resolve( $\varphi$ ,  $\pi$ )

**if** resolvers =  $\emptyset$  **then return** failure

**non-deterministically choose** a resolver  $p \in$  resolvers

$\pi' \leftarrow$  Refine( $p$ ,  $\pi$ )

**return** PSP( $\pi'$ )



# Algorithm PoP

PoP( $\pi$ , agenda) // where  $\pi = (A, <, B, L)$

if flaws =  $\emptyset$  then return  $\pi$

select any pair (aj, p) in and remove it from agenda

relevant  $\leftarrow$  Providers(p,  $\pi$ )

if relevant =  $\emptyset$  then return failure

nondeterministically choose an action  $a_i \in$  relevant

$L \leftarrow L \cup \{ (p: a_i \rightarrow a_j) \}$

update B with the binding constraints of this causal link

if  $a_i$  is a new action in A then

    update A with  $a_i$

    update  $<$  with  $(a_i < a_j), (a_0 < a_i < a_\infty)$

    update agenda with all preconditions of  $a_i$

for each threat on  $(p: a_i \rightarrow a_j)$  or due to  $a_i$  do

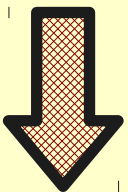
    resolvers  $\leftarrow$  set of resolvers for this threat

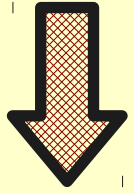
    if resolvers = 0 then return failure

    non-deterministically choose a resolver in resolvers

    add that resolver to  $<$  or to B

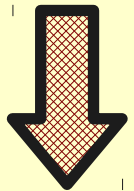
return PoP( $\pi$ , agenda)

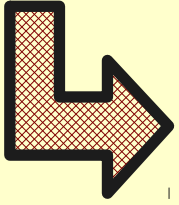




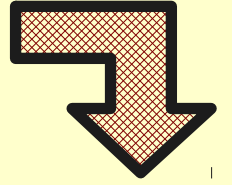
# Algorithm PoP - **extensions**

- ◆ **Conditional operators**
- ◆ **Flaw-Selection Heuristics**
- ◆ **Resolver-Selection Heuristics**

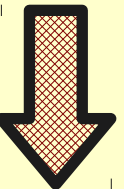




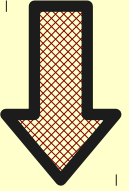
# My Basic Planner



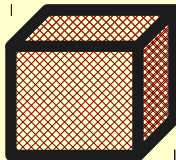
- ◆ PDDL parser
- ◆ Preprocessor
  - ◆ Analyze operators/actions
    - ◆ map possible predecessors/successors for each action
    - ◆ Replace some operators with meta-operators
  - ◆ Analyze domain/instance of the problem
    - ◆ Derive some restrictions
- ◆ Plan-Space planning
- ◆ (CSP for some sub-problems)

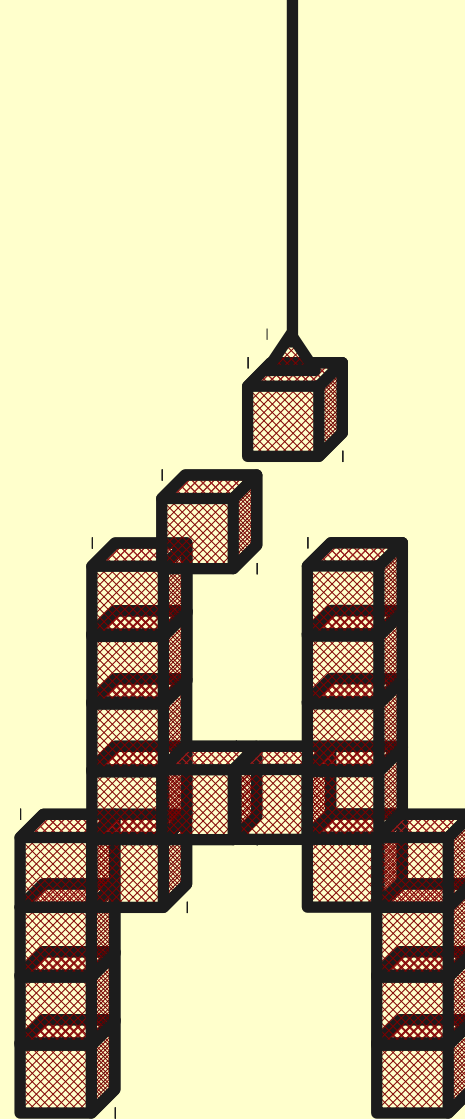
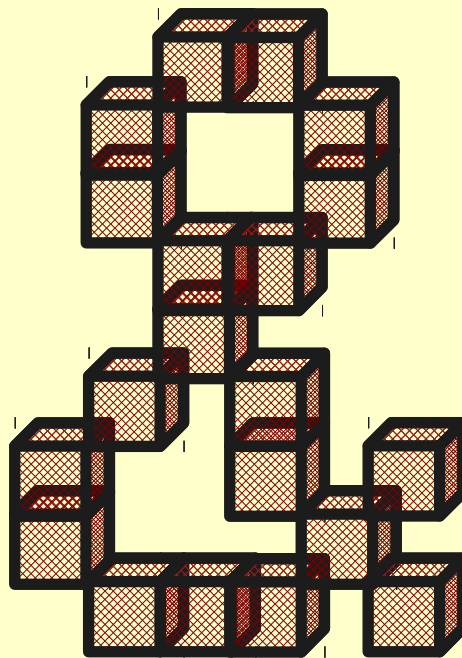
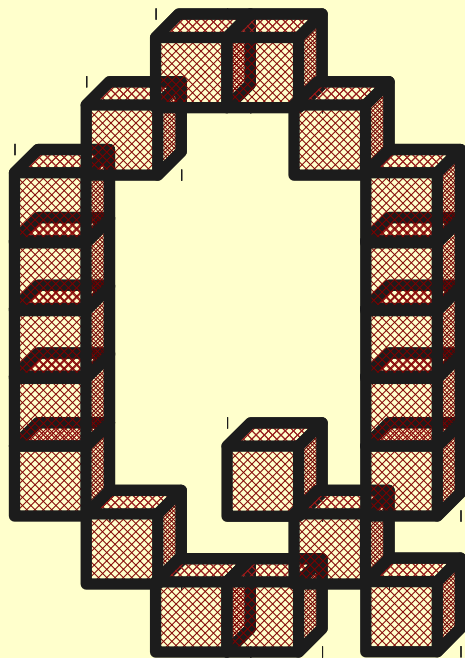


# Possible future extensions



- ♦ **Durative actions**
- ♦ **Qualitative (temporal) relations**
- ♦ **Preferences**
- ♦ **Learning (domain specific properties)**





# References

- ◆ Automated Planning: Theory and Practice; M. Ghallab, D. Nau, P. Traverso; Morgan Kaufmann, 2004
- ◆ <http://ktiml.mff.cuni.cz/~bartak/planovani/>
- ◆ <http://sokoban-jd.blogspot.cz/>
- ◆ [http://en.wikipedia.org/wiki/Peg\\_solitaire](http://en.wikipedia.org/wiki/Peg_solitaire)
- ◆ The Scanalyzer Domain: Greenhouse Logistics as a Planning Problem; M. Helmert, H. Lasinger; ICAPS 2010
- ◆ <http://www.fast-downward.org/>
- ◆ <http://ipc.icaps-conference.org/>
- ◆ <http://www.plg.inf.uc3m.es/ipc2011-deterministic/>