

# Expressing and Exploiting the Common Subgoal Structure of Classical Planning Domains Using Sketches

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## In a Nutshell

- ▶ **Classical planning**
- ▶ We consider **tractable planning domains**
- ▶ **Policy sketch** defines **subgoal structure**
- ▶ **Contribution:** We encode subgoal structure using compact policy sketches to solve whole domains in provably low poly time
- ▶ Subproblems are solved with iterated width
- ▶ Partial plans are serialized

## Iterated Width

- ▶  $IW(k)$  is breadth-first search where a newly generated state  $s$  is pruned if  $novelty(s) > k$
- ▶  $novelty(s) :=$  smallest size of tuple of atoms made true for the first time
- ▶  $IW(k)$  requires  $\exp(k)$  time
- ▶ When does  $IW(k)$  solve a problem?

## Width

The **width**  $w(P)$  of problem  $P$  is the minimum  $k$  for which there exists a sequence of atom tuples  $t_0, t_1, \dots, t_m$  each consisting of size at most  $k$  atoms, such that

1.  $t_0$  is true in the initial state of  $P$ ,
  2. all opt. plans for  $t_i$  can be extended into an opt. plan for  $t_{i+1}$  by adding a single action,  $i = 1, \dots, m-1$ ,
  3. if  $\pi$  is an opt. plan for  $t_m$ , then  $\pi$  is an opt. plan for  $P$ .
- ▶ **Theorem:** if  $w(P) \leq k$  then  $IW(k)$  **solves**  $P$  **optimally** in  $\exp(k)$  time

## The Problem of Unbounded Width

- ▶ **Single goal atom**  $\Rightarrow$  often small width
- ▶ **Conjunctive goals**  $\Rightarrow$  often unbounded width
  - ▶ **Serialized Iterated Width (SIW)**
    - ▶ SIW( $k$ ) runs sequence of  $IW(k)$  searches
    - ▶ Each  $IW$  search decreases goal counter  $\#g$
    - ▶ Subproblems of achieving single goal atom
- ▶ **SIW still fails if ...**
  - ▶ it traps into an unsolvable state
  - ▶ it generates a subproblem of greater width
  - ▶ the subproblem has too large width
- ▶ **Richer decompositions using policy sketches**

## Policy Sketches

- ▶ Consider some possibly infinite class of problems  $Q$  over some common domain  $D$
- ▶ **Policy sketch** (sketch)  $R$  defines subgoal structure in every  $P \in Q$
- ▶ Sketch  $R$  is set of **rules** of form  $C \mapsto E$  over **features**  $\Phi$
- ▶ **Sketch width**  $w_R(Q)$  is maximum width of all subproblems in all  $P \in Q$
- ▶ **SIW<sub>R</sub>** serializes according to subgoals defined by sketch  $R$
- ▶ **Theorem:** if  $w_R(Q) \leq k$  then  $SIW_R$  solves all  $P \in Q$  in  $\exp(k)$  time

## Example Domain: Grid

- ▶ Domain description:
  - ▶ Robot, key(s), lock(s) distributed in a grid
  - ▶ Robot cannot move on a place with closed lock
  - ▶ Goal: well place keys; can require opening locks
- ▶ SIW generates subproblem of large width
- ▶ **Features**  $\Phi = \{l, \#g, kl, kg\}$ 
  - ▶  $l$  is number of closed locks
  - ▶  $\#g$  is number of wellplaced keys
  - ▶  $kl$  whether robot holds key to open lock
  - ▶  $kg$  whether robot holds misplaced key
- ▶ **Rules**  $R_\Phi = \{r_1, r_2, r_3, r_4\}$ 
  - ▶  $r_1 = \{l > 0\} \mapsto \{l, \#g?, kl?, kg?\}$
  - ▶  $r_2 = \{l = 0, \#g > 0\} \mapsto \{\#g, kl?, kg?\}$
  - ▶  $r_3 = \{l > 0, \neg kl\} \mapsto \{kl, kg?\}$
  - ▶  $r_4 = \{l = 0, \#g > 0, \neg kg\} \mapsto \{kl?, kg\}$
- ▶  $w_{R_1}(Q) = 2$  for  $R_1 = \{r_1, r_2\}$
- ▶  $w_{R_2}(Q) = 1$  for  $R_2 = \{r_1, \dots, r_4\}$

## Experiments

Domain	SIW(2)			SIW <sub>R</sub> (2)			LAMA		Dual-BFWS	
	S	T	MW	S	T	MW	S	T	S	T
Barman (40)	0	-	-	40	0.9	2	40	505.3	40	162.8
Childsnack (20)	0	-	-	20	10.8	1	6	2.6	8	216.9
Driverlog (20)	8	0.5	2	20	0.8	1	20	7.6	20	4.2
Floortile (20)	0	-	-	20	0.2	2	2	9.9	2	176.3
Grid (5)	1	0.1	2	5	0.1	1	5	3.6	5	3.7
Schedule (150)	62	1349.1	2	150	54.7	2	150	15.3	150	151.4
TPP (30)	11	74.7	2	30	0.4	1	30	16.5	29	99.6
# Solved	0/7			7/7			5/7		4/7	