# Subset-Saturated Transition Cost Partitioning

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## In a Nutshell

- Optimal classical planning
- ► A\* search with admissible heuristic
- Multiple heuristics capture different aspects of task
- ► Beneficial to combine information of these heuristics
- Cost partitioning allows admissible combination
- Greedy method: saturated cost partitioning
- ► Contribution: combine two orthonal generalizations

# Induced Transition System

A Planning task  $\Pi$  induces a weighted transition system  $\mathcal{T} = \langle S, L, T, s_0, S_{\star}, ocf \rangle$  with

- $\triangleright$  S: set of states, L: set of operator labels,
- ▶ T: set of transitions  $T \subseteq S \times L \times S$ ,
- $ightharpoonup s_0 \in S$ : initial state,  $S_{\star} \subseteq S$  set of goal states,
- $ightharpoonup ocf: L 
  ightharpoonup \mathbb{R}$  the operator costs (nonnegative)

Opt. solution for  $\Pi$  corresp. to **path**  $\langle s_0, l_1, s_1, \ldots, l_n, s_n \rangle$ in  $\mathcal{T}$  where  $s_n \in S_{\star}$  with cheapest cost  $\sum_{i=1}^n ocf(l_i)$ .

## Abstractions and Heuristics

- $\blacktriangleright h(ocf, s)$  is goal distance estimate of state s in S
- ▶ h is admissible if  $h(ocf, s) \le h^*(ocf, s)$  for all states s and  $h^*$  is perfect estimate
- ► **Abstraction** is simpler version of task where a partitioning of the states S defines the abstract states
- ► Abstraction heuristic maps states to goal distance of corresponding abstract state in the abstraction
- ► Abstraction heuristics are admissible

# Saturated Cost Partitioning (SCP)

#### Saturated cost partitioning algorithm

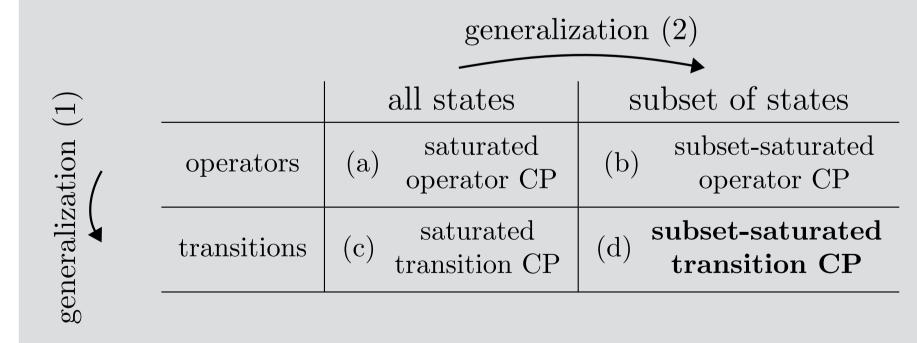
for heuristic h in sequence  $h_1, \ldots, h_n$  do

$$ocf_i \leftarrow saturate(h, ocf)$$
  
 $ocf \leftarrow ocf - ocf_i$ 

end for

- ightharpoonup saturate computes a fraction  $ocf_i$  of ocf which preserves h(ocf, s) of (later: subset of) all states S
- $ightharpoonup \langle ocf_i, \ldots, ocf_n \rangle$  is a cost partitioning (CP)
- ▶ CP property:  $\forall l \in L : \sum_{i=1}^{n} ocf_i(l) \leq ocf(l)$
- $\blacktriangleright h_1(ocf_i,s) + \ldots + h_n(ocf_n,s)$  is admissible

## Generalizations of SCP



### (1) Costs partitioned among transitions

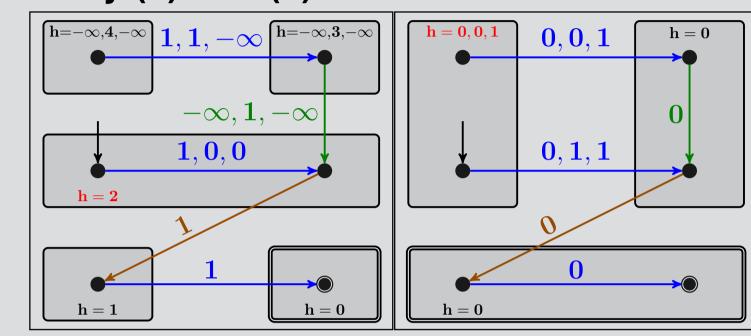
- $ightharpoonup saturate returns <math>tcf_i: T \to \mathbb{R}$  instead of  $ocf_i$
- More economical: often uses fewer costs
- ightharpoonup Tractability depends on  $tcf_i$ , often manageable

### (2) Saturate for subset of states S'

- ► E.g. reachable, closer to goal, or single state
- ightharpoonup saturate preserves estimates of only states S'
- More economical: often uses fewer costs

## Our Contributions

► Unify (1) and (2)



- ▶ Initial costs ocf(l) = 1 for all  $l \in L$
- Edge and node denotations (b),(c),(d)
- (b) and (d) saturate for reachable states
- ►  $h(s_0)$ :  $h^{(b)} = h^{(c)} = 2 + 0 < 2 + 1 = h^{(d)}$
- **Fast computation of** h(tcf, s)
  - Backward search in abstraction avoiding abstract weight computations
  - ▶ Make use of lower bound 0 because tcfis always nonnegative
- **Restrictions on**  $tcf_i$  (as alternative to  $ocf_i$ )
  - Heuristic estimate in unsolvable state is  $\infty$  independent of  $tcf_i$
  - ▶ Almost no value in cost assignment  $\neq 0$

# Experiments

	(a)	(b)	(c)	(d)
(a)	_	47	164	59
(b)	488	_	390	55
(c)	345	236	_	34
(d)	683	400	482	_
Coverage	1056	1061	1024	1083

