# TL;DR

#### Setting

- optimal classical planning
- ► A<sup>\*</sup> search with safe pruning: consider subset of applicable operators at expansion
  - guarantee optimality

#### Contributions

- previously called "weak stubborn sets" (now: compliant stubborn sets) are not stubborn sets in Valmari's sense
- generalized weak stubborn sets (GWSS) reflect original definition and satisfy "operator shifting property"
- GWSS higher pruning power than GSSS and incomparable pruning power with CSS

## **SAS<sup>+</sup>** Planning Tasks

planning tasks  $\Pi = \langle \mathcal{V}, \mathcal{O}, s_0, s_{\star} \rangle$ 

- $\triangleright$   $\mathcal{V}$ : finite-domain state variables v with domain  $\mathcal{D}(v)$ ▶ atom:  $\{v \mapsto p\}$ ,  $p \in \mathcal{D}(v)$ 
  - (partial) state: set of atoms
- $\triangleright$   $\mathcal{O}$ : operators o with partial states precondition pre(o) and effect eff (o), and  $cost(o) \in \mathbb{R}_0^+$
- o applicable if  $pre(o) \subseteq s$
- $\triangleright$  o(s): successor state updated according to eff(o)
- $\blacktriangleright$  s<sub>0</sub>: initial state
- $\blacktriangleright$  s<sub>\*</sub>: partial goal state

# State-based Interference

 $o_1$  weakly interferes with  $o_2$  in state s if

- $\triangleright$   $o_1$  disables  $o_2$  in s:  $o_2$  not applicable in  $o_1(s)$ , or
- ▶  $o_1$  and  $o_2$  conflict in s:  $o_2(o_1(s)) \neq o_1(o_2(s))$
- $o_1$  interferes with  $o_2$  in state s if
- $\triangleright$   $o_1$  weakly interferes with  $o_2$  in s, or
- $\blacktriangleright$  o<sub>2</sub> disables o<sub>1</sub>

### Syntax-Based Interference

 $o_1$  syntactically weakly interferes with  $o_2$  if

- ▶  $\{v \mapsto p\} \in eff(o_1) \text{ and } \{v \mapsto p'\} \in pre(o_2)$  ("disables"), or ▶  $\{v \mapsto p\} \in eff(o_1) \text{ and } \{v \mapsto p'\} \in eff(o_2) (\text{``conflicts''})$
- $o_1$  syntactically interferes with  $o_2$  if
- $\triangleright$   $o_1$  syntactically wekly interferes with  $o_2$ , or
- ▶  $\{v \mapsto p\} \in eff(o_2)$  and  $\{v \mapsto p'\} \in pre(o_1)$  ("disables")

# **On Weak Stubborn Sets in Classical Planning**

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 $(S_3)$ 

### Generalized Strong Stubborn Sets (GSSS)

*Opt*: all strongly optimal plans for state s;  $S_{Opt}$ : all states visited by plans in *Opt* Operator subset  $T \subseteq \mathcal{O}$  GSSS in *s* if:

- C1 T contains at least one operator from at least one plan from Opt (approximation: include disjunctive action landmark for s)
- C2 for all  $o \in T$  not applicable in s, T contains necessary enabling set for o and *Opt* (approximation: include achievers of *o*)
- C3 for all  $o \in T$  applicable in s, T contains all o' which interfere with o in any state from  $S_{Opt}$  (approximation: syntax-based interference)

#### Generalized Weak Stubborn Sets (GWSS)

Like GSSS, but with C3' instead of C3

C3' for all  $o \in T$  applicable in s, T contains all o' s.t. o weakly interferes with o' in any state from  $S_{Opt}$ , and additionally: for all  $\{v \mapsto p\} \in pre(o)$ , T either contains all disablers or enablers on  $\{v \mapsto p\}$  of o in any state from  $S_{Opt}$ 

#### Examples



 $T = \{o_3\}$ :  $\blacktriangleright$  GSSS in  $s_0$ satisfies the operator shifiting property in s<sub>0</sub>

planning task with:

- $T = \{o_3\}$ :

# **Experimental Results**



# **Compliant Stubborn Sets (CSS)**

previously called "weak stubborn sets" in the planning literature

operator subset  $T \subseteq \mathcal{O}$  CSS in state s if:

- ► T contains disjunctive action landmark for s
- ▶ for all  $o \in T$  not applicable in s, T contains necessary enabling set for *o* and all applicable operator sequences in s
- ▶ for all  $o \in T$  applicable in s, T contains all o' s.t. o syntactically weakly interferes with o'

 $\blacktriangleright s_0 = \{ v \mapsto 0, X \mapsto 0, Y \mapsto 0, Z \mapsto 0 \}$  $\blacktriangleright s_{\star} = \{ X \mapsto 1, Y \mapsto 1, Z \mapsto 1 \}$ ▶  $pre(o_1) = \{v \mapsto 0\}, eff(o_1) = \{v \mapsto 1, X \mapsto 1\}$ ▶  $pre(o_2) = \{v \mapsto 1\}, eff(o_2) = \{v \mapsto 0, Y \mapsto 1\}$ ▶  $pre(o_3) = \{v \mapsto 0\}, eff(o_3) = \{Z \mapsto 1\}$ 

▶ not a GSSS in  $s_0$  ( $T = \{o_1, o_3\}$  GSSS because  $o_1$  disables  $o_3$  in  $s_0$ )  $\blacktriangleright$  no longer satisfies operator shifting property in  $s_0$  $\triangleright$  CSS in  $s_0$  ( $o_3$  does not syntactically weakly interfere with  $o_1$ )

▶ not a GWSS in  $s_0$ : C3' requires including all disablers or all enablers of  $\{v \mapsto 0\}$ : disablers  $\rightarrow T = \{o_1, o_3\}$  (= GSSS); enablers  $\rightarrow T = \{o_2, o_3\}$ 

#### **Operator Shifting** Property

Operator subset  $T \subseteq \mathcal{O}$  has the operator shifting property in state s if for all plans  $\pi$  for s, shifting the first operator o from  $\pi$  which is also in T to the front results in a plan  $\pi'$  for s, and ► *o* is applicable in all intermediate states before

its application when executing  $\pi$ .

# **Properties of GWSS**

- safe pruning
- satisfy operator shifting property
- exponentially higher pruning power than GSSS:

choosing all disablers in condition C3' leads to GSSS

- comparison with CSS:
  - CSS stricter due to restriction to syntactic interference
  - CSS less restrictive due to not requiring operator shifting property
  - incomparable pruning power