

# On Weak Stubborn Sets in Classical Planning

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- ▶ optimal classical planning
- ▶ A\* search with **safe pruning**:
  - ▶ consider **subset** of applicable operators at expansion
  - ▶ guarantee optimality

# Stubborn Sets

- ▶ origin in model checking (Valmari, APN 1989)
- ▶ established safe pruning technique in planning
- ▶ **several flavors:** weak and strong stubborn sets (Valmari, APN 1989), generalized strong stubborn sets (Wehrle & Helmert, ICAPS 2014)

# Contributions

- ▶ recently introduced **weak** stubborn sets in planning are not stubborn sets in the original sense
- ▶ define **(generalized) weak stubborn sets** according to original definition
- ▶ analyze **pruning power** of the different types

- ▶ finite-domain **state variables**
- ▶ **partial state**: set of atoms
- ▶ **operators**  $o$  to modify states  $s$ :
  - ▶  $o$  applicable in  $s$  if **precondition** of  $o$  satisfied
  - ▶ successor state  $o(s)$  incorporates **effect** of  $o$

# Interference

$o_1$  **weakly interferes** with  $o_2$  in state  $s$  if both operators are applicable in  $s$  and

- ▶  $o_1$  **disables**  $o_2$  in  $s$ :  $o_2$  not applicable in  $o_1(s)$ , or
- ▶  $o_1$  and  $o_2$  **conflict** in  $s$ :  $o_2(o_1(s)) \neq o_1(o_2(s))$

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# Generalized Strong Stubborn Sets (GSSS)

Operator subset  $T$  GSSS in state  $s$  if:

- C1**  $T$  contains at least one operator from at least one strongly optimal plan
- C2** for all  $o \in T$  not applicable in  $s$ ,  $T$  contains necessary enabling set for  $o$
- C3** for all  $o \in T$  applicable in  $s$ ,  $T$  contains all  $o'$  which interfere with  $o$  in any state



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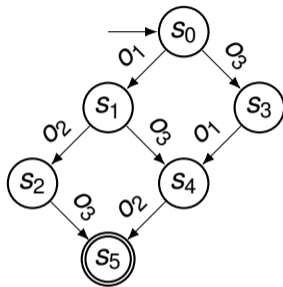
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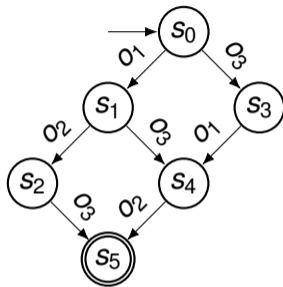
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# GSSS: Example

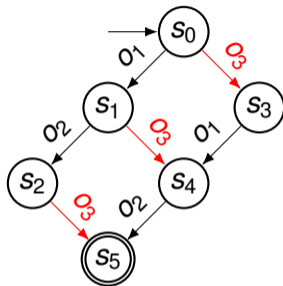


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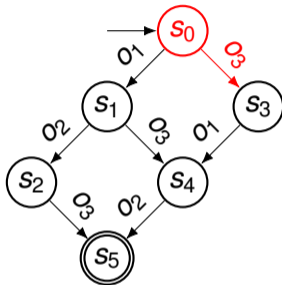
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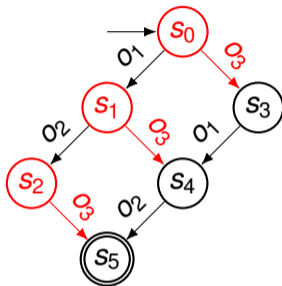


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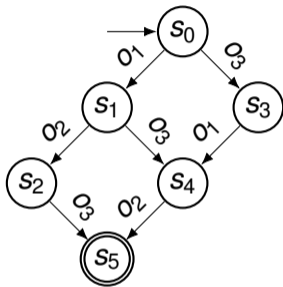
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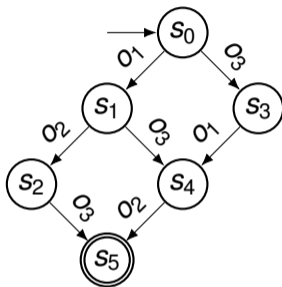
**C3** nothing to do: no operator interferes with  $o_3$  in any state



# Operator Shifting Property

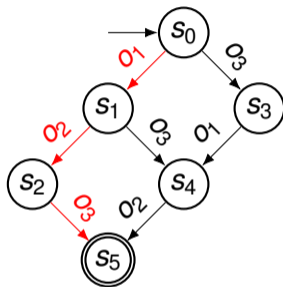


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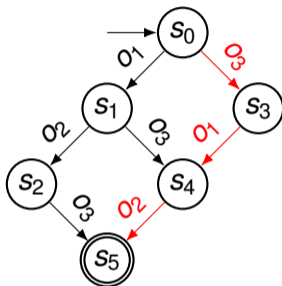
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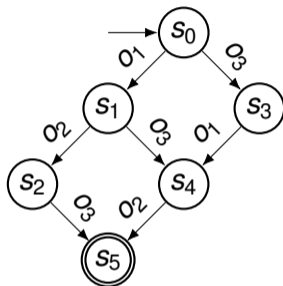
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- ▶  $o_3$  is applicable in the intermediate state  $o_1$

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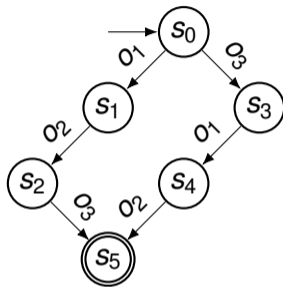
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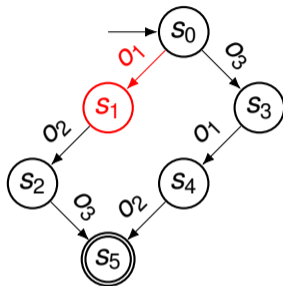
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  - C3' for all  $o \in T$  applicable in  $s$ ,  $T$  contains all  $o'$  s.t.  $o$  **syntactically weakly interferes** with  $o'$

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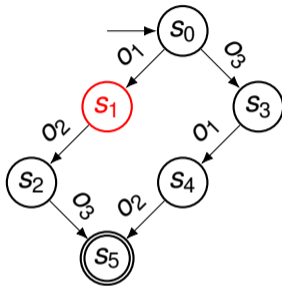
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$T = \{o_3\}$ :

- ▶ not a GSSS in  $s_0$ :  $o_1$  disables  $o_3$  in  $s_0$  ( $\rightsquigarrow T = \{o_1, o_3\}$ )

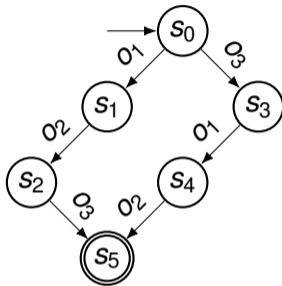
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- ▶ no longer satisfies operator shifting property:  $o_3$  not applicable in  $s_1$
- ▶ CSS in  $s_0$  ( $o_3$  does not syntactically weakly interfere with  $o_1$ )

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replace condition C3 of GSSS:

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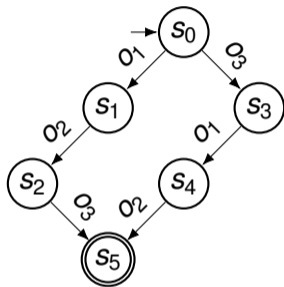
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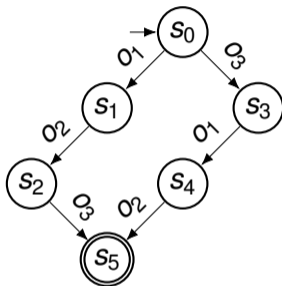
C3' for all  $\sigma \in T$  applicable in  $s$ ,  $T$  contains all  $\sigma'$  s.t.  $\sigma$  weakly interferes with  $\sigma'$  in any state, and additionally:  $T$  contains all **disablers** or **enablers** of  $\sigma$  in any state



# GWSS: Example



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$T = \{o_3\}$  not GWSS in  $s_0$ : **C3'** requires including all disablers or all enablers of  $o_3$ :

- ▶ including disablers  $\rightsquigarrow T = \{o_1, o_3\}$  (= GSSS)
- ▶ including enablers  $\rightsquigarrow T = \{o_2, o_3\}$

# Contribution: Formal Results about Properties of GWSS

- ▶ safe pruning
- ▶ satisfy operator shifting property

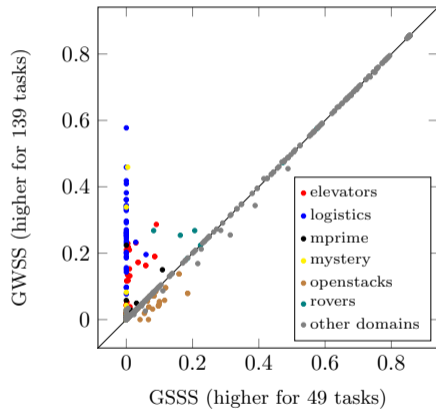
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- ▶ exponentially higher pruning power than GSSS:  
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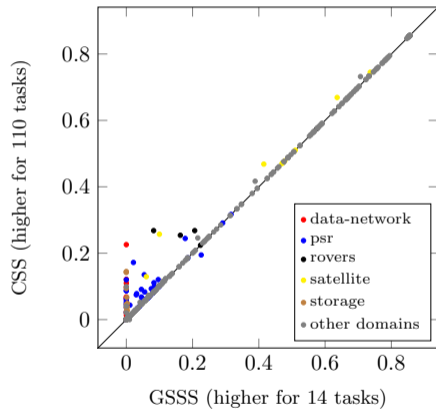
# Contribution: Formal Results about Properties of GWSS

- ▶ **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

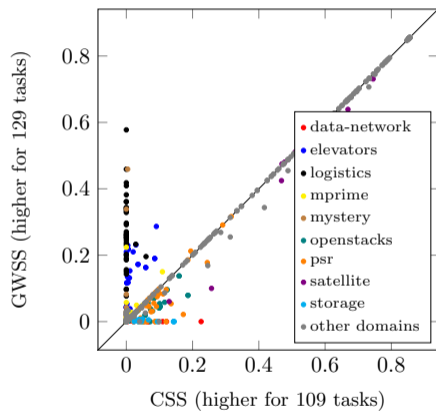
# Experimental Results: Strong vs. Weak



# Experimental Results: Strong vs. Compliant



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## summary

- ▶ previously called “weak stubborn sets” **not stubborn sets** in the original sense
- ▶ **generalized weak stubborn sets** reflect generalized original definition
- ▶ GWSS **higher pruning power** than GSSS and **incomparable pruning power** with CSS

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- ▶ GWSS **higher pruning power** than GSSS and **incomparable pruning power** with CSS

## future work:

- ▶ find strategies for deciding to include disablers or enablers for GWSS
- ▶ investigate if **relaxing the operator shifting property** beyond CSS is possible