

Abstraction Heuristics for Factored Tasks

Clemens Büchner¹ Patrick Ferber¹ Jendrik Seipp² Malte Helmert¹

June 4, 2024

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University
of Basel

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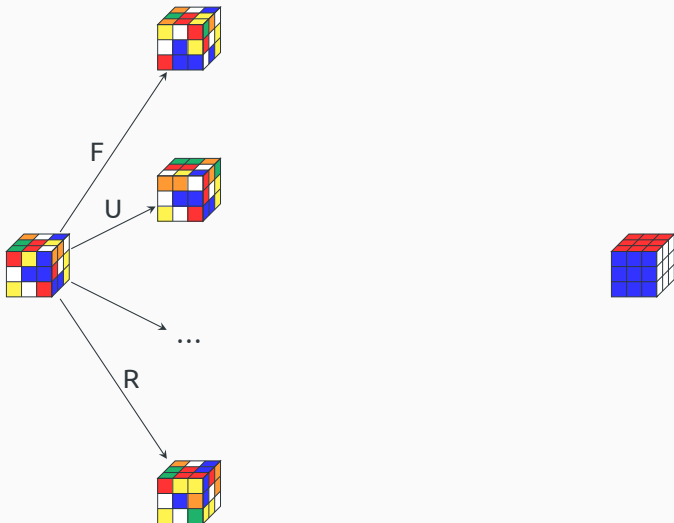
Introduction



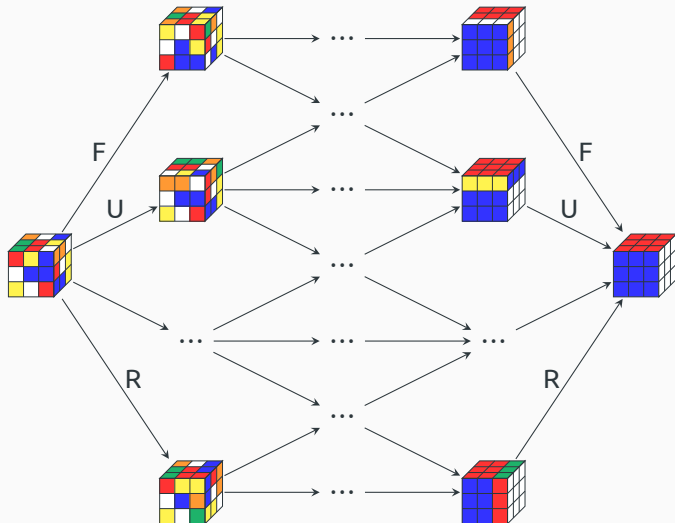
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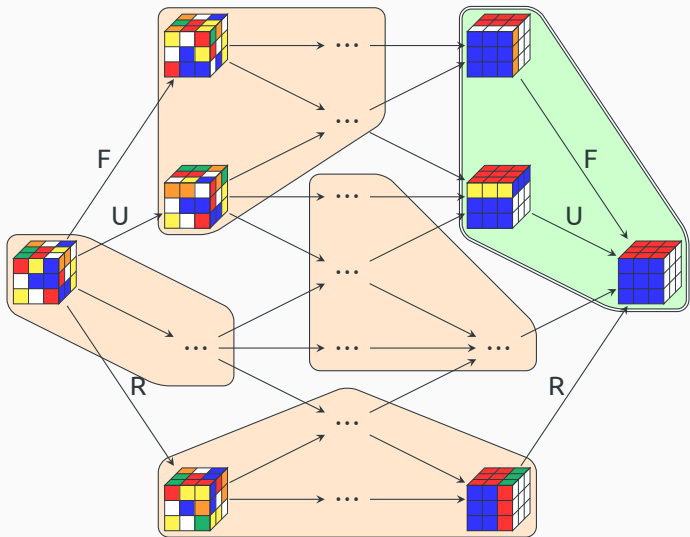
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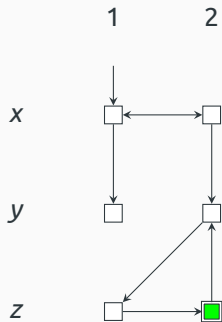
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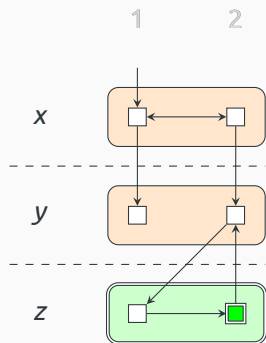


Overview of Abstraction Heuristics



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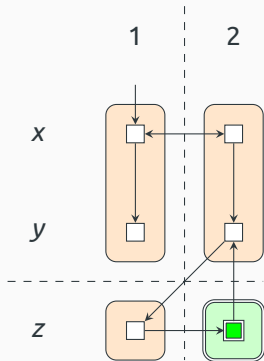
projections/pattern databases
(Culberson and Schaeffer 1998)



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domain abstractions
(Hernádvölgyi and Holte 2000)

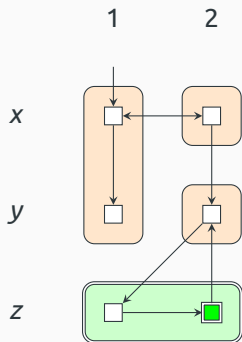


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Cartesian abstractions
(Seipp and Helmert 2013)



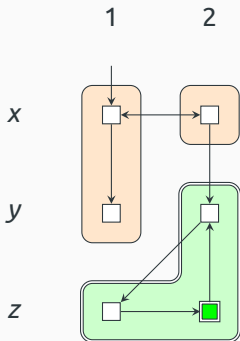
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merge-and-shrink abstractions
(Dräger, Finkbeiner, and Podelski 2006)



Limitations of Abstraction Heuristics

- **efficient** domain-independent algorithms for SAS⁺
- no **compact models** in SAS⁺ for some problem domains
- some compact models rely on **conditional effects**

Issue with Compact Problem Representations

For tasks with **general conditional effects**, deciding whether a transition exists between two abstract states is **NP-hard**.

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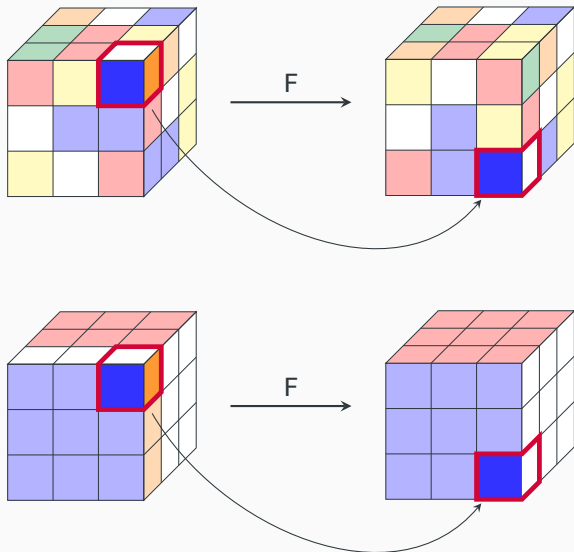
Issue with Compact Problem Representations

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Good News!

Abstractions can be computed efficiently for **factored tasks**.

Factored Conditional Effects



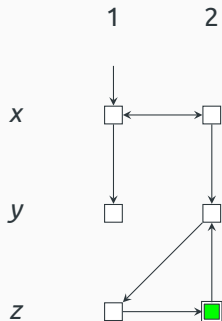
Factored Tasks

Definition (factored task)

A **factored task** is a 4-tuple

$\Pi = \langle \mathcal{V}, \mathcal{O}, I, G \rangle$ with

- **variable space** \mathcal{V}
- **factored operators** \mathcal{O} consisting of
 - **factored state relations** with
 - associated **costs**
- **factored state sets** I and G

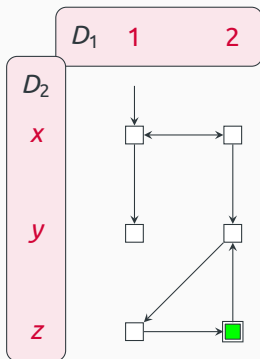


Factored Tasks

variable space

$$\mathcal{V} = \langle V_1, \dots, V_n \rangle$$

with domains D_1, \dots, D_n



Factored Tasks

variable space

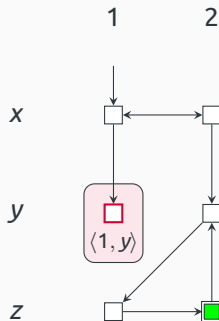
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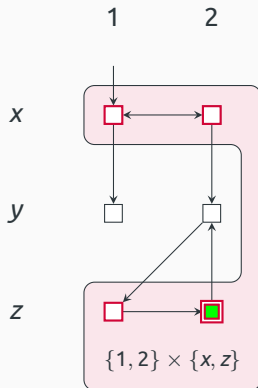
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factored state set

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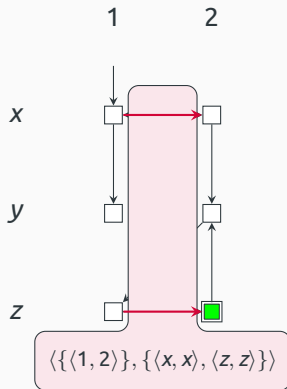
$$S = S_1 \times \dots \times S_n$$

with $S_i \subseteq D_i$

factored state relation

$$R = \langle R_1, \dots, R_n \rangle$$

with $R_i \subseteq D_i \times D_i$



Properties of Factored Tasks

- alternative view as set of **automata**
- factored tasks **generalize SAS⁺**
- **additionally** they support limited forms of
 - multiple initial states
 - disjunctive preconditions
 - conditional effects
 - angelic nondeterminism

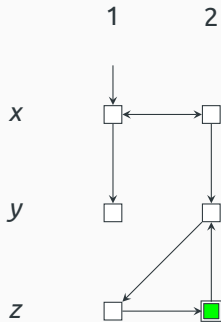
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- alternative view as set of **automata**
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- **additionally** they support limited forms of
 - multiple initial states
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 - angelic nondeterminism
- **as general as possible** given **independent variables**
- progression and regression are **symmetric**
- **Cartesian sets** are everywhere
 - factored state sets ***I*** and ***G***
 - operator **preconditions**
 - operator **postconditions**

Counterexample-Guided Cartesian Abstraction Refinement

Start with coarsest abstraction
and iterate:

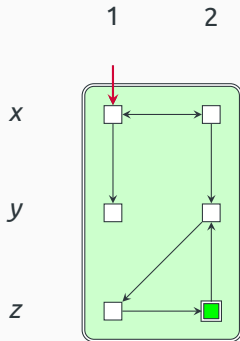
- find **abstract plan**
- **execute** in original
- if fails: **fix flaw** and repeat
- else: **return solution**



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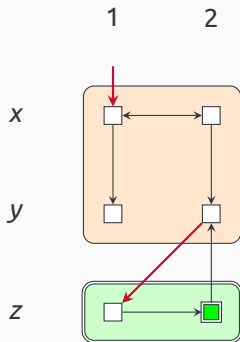
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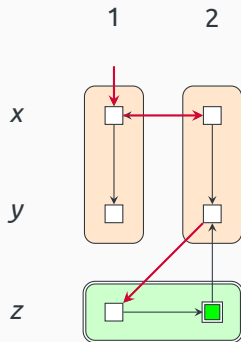


Cartesian CEGAR

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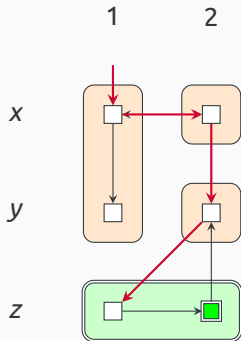
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Components of Cartesian CEGAR

- **compact representation** of abstract states
- check whether abstract state **contains concrete state**
- **progression** for executing plans
- **regression** for splitting abstract states given flaw

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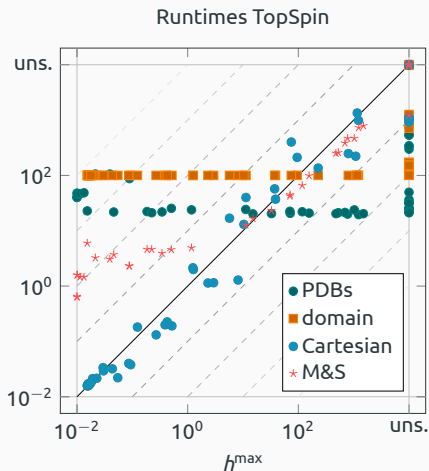
Factored tasks support all of the above **efficiently**.

- **progression and regression** yield factored state sets
- not true for tasks with **general conditional effects**

Experiments

new benchmark set
with 431 tasks

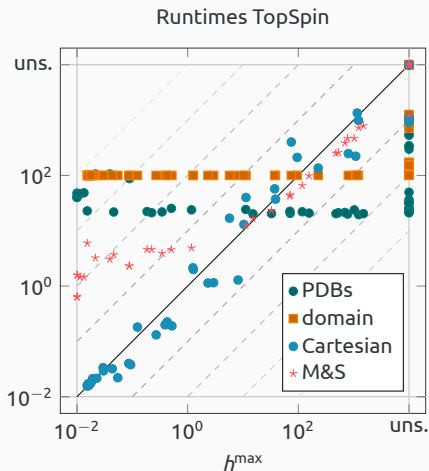
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domain abs.	218
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M&S	175



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h^{\max}	164
LM-Cut	134



Summary

- factored tasks **generalize SAS⁺**
- **Cartesian sets** are everywhere in factored tasks
- common abstractions work **efficiently** for factored tasks

Future work:

- efficient abstractions **beyond factored tasks**
- heuristics for factored tasks **beyond abstractions**