## Correlation Complexity of Classical Planning Domains

Jendrik Seipp Florian Pommerening Gabriele Röger<br>Malte Helmert<br>University of Basel<br>June 13, 2016

## Motivation

How complex must a heuristic be to guide
a forward search directly to the goal?

- What does "guide directly to the goal" mean? $\rightarrow$ descending and dead-end avoiding
- How can we measure the complexity of a heuristic? $\rightarrow$ dimension of potential heuristics


## Related Concepts

## Width

- (macro-)persistent Hamming width (Chen and Giménez, 2007; 2009)
- serialized iterated width
(Lipovetzky and Geffner, 2012; 2014)
comparisons to correlation complexity in the paper


## Definition

## Heuristic Properties

- alive state: reachable + solvable + non-goal
- descending: all alive states have an improving successor
- dead-end avoiding: all improving successors of alive states are solvable



## Potential Heuristics

- features $\mathcal{F}$ : conjunctions of facts
- weight function $w$ : assigns numeric value to each feature
- heuristic value $\varphi$ : sum of a state's feature weights
- dimension: size of largest feature

$$
\varphi(s)=\sum_{F \in \mathcal{F}} w(F)[s \models F]
$$

## Correlation Complexity

## Definition

- correlation complexity of a planning task: minimum dimension of a descending, dead-end avoiding potential heuristic for the task
- correlation complexity of a planning domain: maximal correlation complexity of all tasks in the domain


## Results

## Domains with Correlation Complexity 2

- Blocksworld-no-arm
- Gripper
- Spanner
- VisitAll


## Example

## Gripper has Correlation Complexity 2

## Weight Function

$$
\begin{aligned}
& w(\mathrm{r}-\mathrm{in}-\mathrm{B})=1 \\
& w(\mathrm{~b}-\mathrm{in}-\mathrm{A})=8 \\
& w(\mathrm{~b}-\mathrm{in}-\mathrm{G})=4 \\
& w(\mathrm{r}-\mathrm{in}-\mathrm{B} \wedge \mathrm{~b}-\mathrm{in}-\mathrm{G})=-2
\end{aligned}
$$

## Pick-in-A

$$
w(\mathrm{r}-\mathrm{in}-\mathrm{B})=1, w(\mathrm{~b}-\mathrm{in}-\mathrm{A})=8, w(\mathrm{~b}-\mathrm{in}-\mathrm{G})=4, w(\mathrm{r}-\mathrm{in}-\mathrm{B} \wedge \mathrm{~b}-\mathrm{in}-\mathrm{G})=-2
$$



B

$$
\begin{array}{ll}
\text { adds: } & \text { b-in-G } \\
\text { removes: } & \text { b-in-A } \\
\text { difference: } & +4-8=-4
\end{array}
$$

## Move-to-B

$$
w(\mathrm{r}-\mathrm{in}-\mathrm{B})=1, w(\mathrm{~b}-\mathrm{in}-\mathrm{A})=8, w(\mathrm{~b}-\mathrm{in}-\mathrm{G})=4, w(\mathrm{r}-\mathrm{in}-\mathrm{B} \wedge \mathrm{~b}-\mathrm{in}-\mathrm{G})=-2
$$



## Drop-in-B

$$
w(\mathrm{r}-\mathrm{in}-\mathrm{B})=1, w(\mathrm{~b}-\mathrm{in}-\mathrm{A})=8, w(\mathrm{~b}-\mathrm{in}-\mathrm{G})=4, w(\mathrm{r}-\mathrm{in}-\mathrm{B} \wedge \mathrm{~b}-\mathrm{in}-\mathrm{G})=-2
$$



## Move-to-A

$$
w(\mathrm{r}-\mathrm{in}-\mathrm{B})=1, w(\mathrm{~b}-\mathrm{in}-\mathrm{A})=8, w(\mathrm{~b}-\mathrm{in}-\mathrm{G})=4, w(\mathrm{r}-\mathrm{in}-\mathrm{B} \wedge \mathrm{~b}-\mathrm{in}-\mathrm{G})=-2
$$


adds:
removes: $\quad$-in-B
difference: -1

## Example Task with Correlation Complexity 3

- 3-bit Gray code:



## Conclusion and Future Work

- New measure for the complexity of classical planning tasks.
- Measures how interrelated the task's variables are.
- All studied benchmark domains have correlation complexity 2.
- Find good features and weights automatically.

