

# Implementing Symbolic Pattern Databases for Planning

Matthew Fahrni, April 27, 2023



# Planning & State Spaces

- State Space  $\mathbf{S} = \langle S, A, cost, T, s_0, S_* \rangle$ 
    - $S$  finite set of states
    - $A$  finite set of actions
    - $cost$  representing cost of action
    - $T \subseteq S \times A \times S$  transitions
    - $s_0$  initial state
    - $S_*$  goal states
  - The purpose is to find a sequence of actions  $(a_1, \dots, a_n), a_i \in A$  to get from the initial state to a goal state
  - optimal planner finds sequence of actions with minimal cost
-

# SAS+ Tasks

- State Spaces too big to represent
  - instead use SAS+ Task as representation
  - SAS+ Planning task is  $\Pi = \langle V, I, G, A \rangle$ 
    - $V$  are the variables, each with a finite domain
    - $I$  is the initial state
    - $G$  are the goal states
    - $A$  are the actions, consisting of
      - the preconditions of the action
      - the effect of the action
      - the cost of the action
-

# Pattern Database

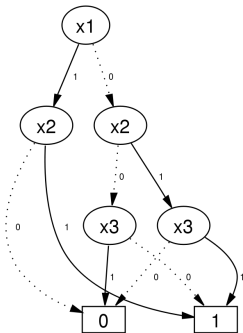
- solve problem for a subset of variables
  - save the optimal cost to goal for every abstract state
  - use singular or multiple pattern databases as a heuristic in original state space
-

# Symbolic Data Structures

- Many different Decision Diagrams exist
  - We focus on Binary Decision Diagrams (BDD) and Algebraic Decision Diagrams (ADD)
-

# Binary and Algebraic Decision Diagram

- directed acyclic graph
- every nonterminal node has exactly two arcs
- BDD has one or two terminal nodes
- ADD has finite number of terminal nodes



# Implementation

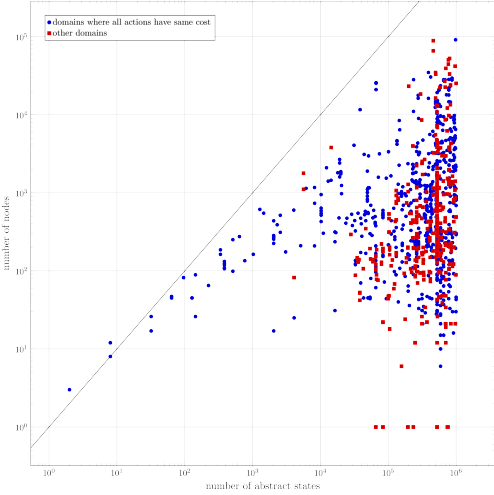
- Represent every variable  $v_i \in V$  as one or multiple BDD
  - Introduce primed variables for every variable
  - Represent the actions as Transition Relation (TR), encode them as BDD
  - Optionally merge same cost TR
  - Use Dijkstra algorithm to calculate the cost of every state
  - Save these costs inside an ADD
-

# Result

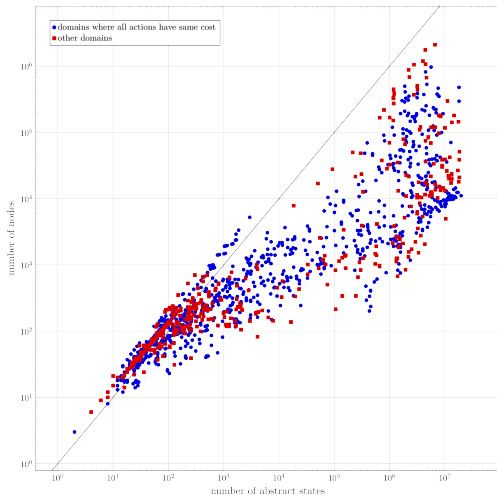
- implemented into Fast Downward (<https://www.fast-downward.org>)
  - using Colorado University Decision Diagram (CUDD) for BDD and ADD
  - the analysis was performed using the sciCORE (<http://scicore.unibas.ch/>) scientific computing center at University of Basel
  - results parsed using LAB (<https://github.com/aibasel/lab>)
-



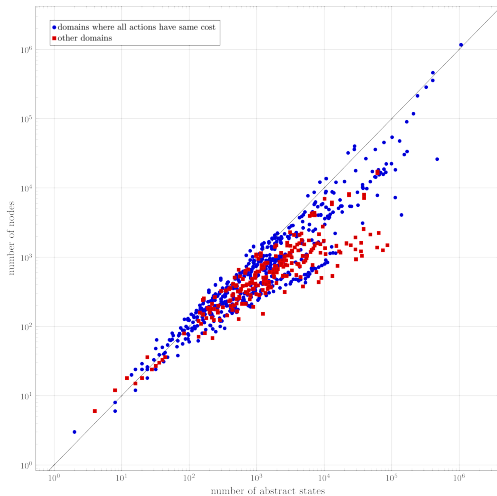
# Size Comparison: Greedy Pattern Generator



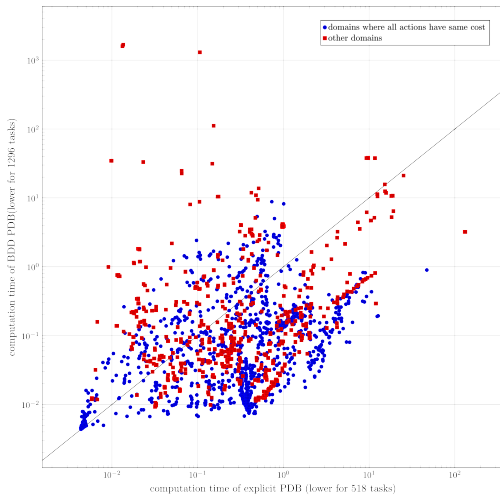
# Size Comparison: Hillclimbing Pattern Collection Generator



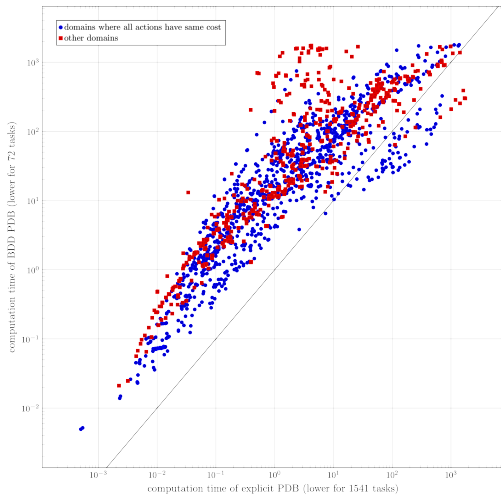
# Size Comparison: Systematic Pattern Collection Generator



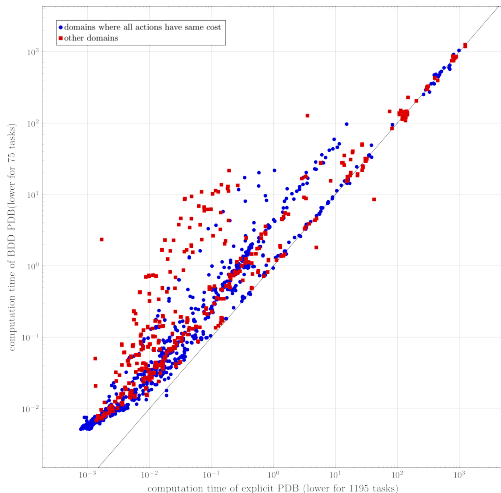
# Computation Time Comparison: Greedy Pattern Generator



# Computation Time Comparison: Hillclimbing Pattern Collection Generator



# Computation Time Comparison: Systematic Pattern Collection Generator



# Improvements



# Extensions





# Conclusion



**Thank you**  
for your attention.