

# Dantzig-Wolfe Decomposition for Cost Partitioning

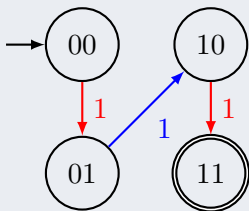
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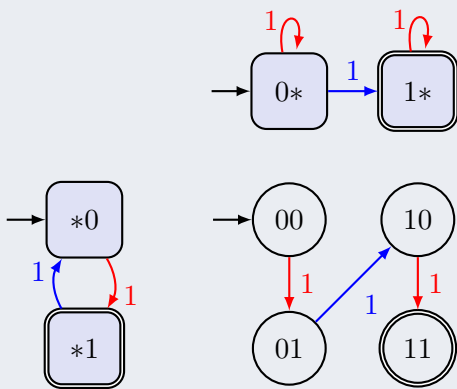
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August, 2021

## Classical Planning

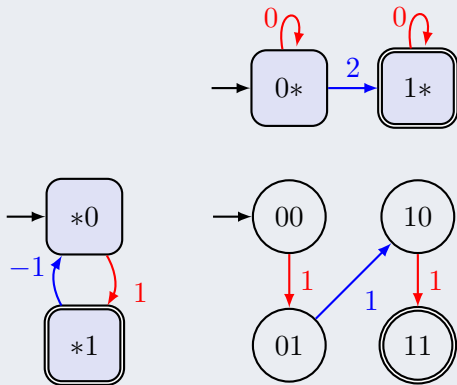


## Abstraction Heuristics



Heuristic value:  $\max\{1, 1\} = 1$

## Cost Partitioning



Heuristic value:  $2 + 1 = 3$

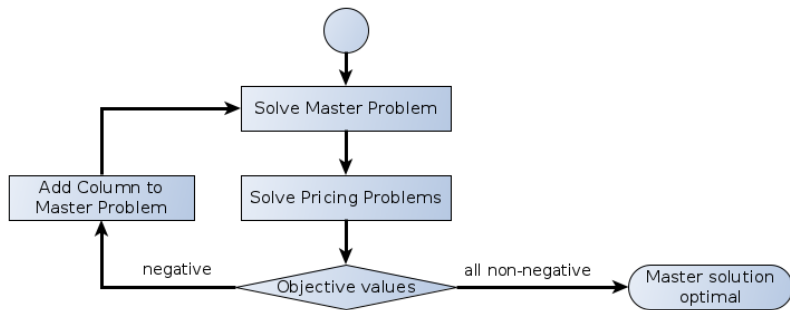
## Cost Partitioning LP

Maximize  $\sum_i h_i$  subject to

$$\sum_i c_i(o) \leq \text{cost}(o) \quad \text{for all operators } o$$

$h_i =$  heuristic  $i$  under cost  $c_i$       for all heuristics  $i$

# Solving an LP with Dantzig-Wolfe Decomposition



We applied Dantzig-Wolfe decomposition  
to the cost partitioning LP.

The master problem finds the best possible **mix** from **candidate cost functions** added by the pricing problems.

## Master Problem

$$\begin{aligned} & \text{Maximize } \sum_i \sum_j \lambda_{ij} h_{ij} \text{ subject to} \\ & \sum_i \sum_j \lambda_{ij} c_{ij}(o) \leq \text{cost}(o) \quad \text{for all operators } o \\ & \lambda_{ij} \geq 0 \end{aligned}$$



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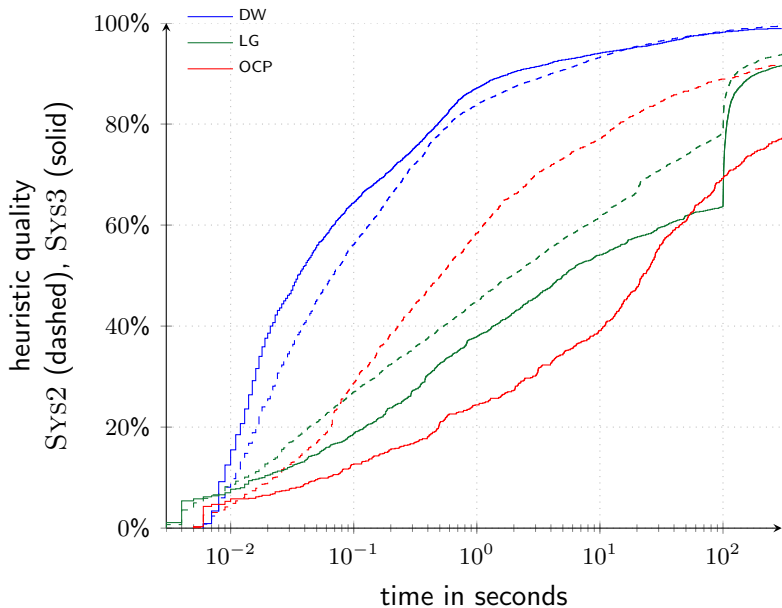
Pricing problem for an abstraction

- parametrized with the dual solution  $y$  of master problem
- generates column iff  $y$  is not a valid flow

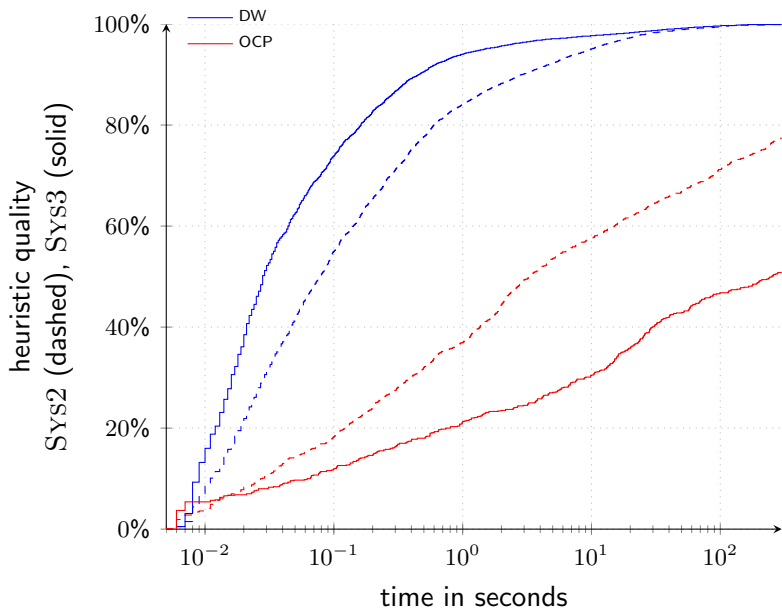
Pricing Problem

Minimize  $c(y) - h$  subject to  
 $h \leq$  heuristic  $i$  under cost  $c$

# Heuristic Quality (non-negative costs)



# Heuristic Quality (general costs)



Potential use as a planner

- Stop when solution is a **flow in all considered abstractions**.
- Otherwise add an abstraction where this is not a flow.