

Planning and Optimization

D7. Delete Relaxation: Analysis of h^{\max} and h^{add}

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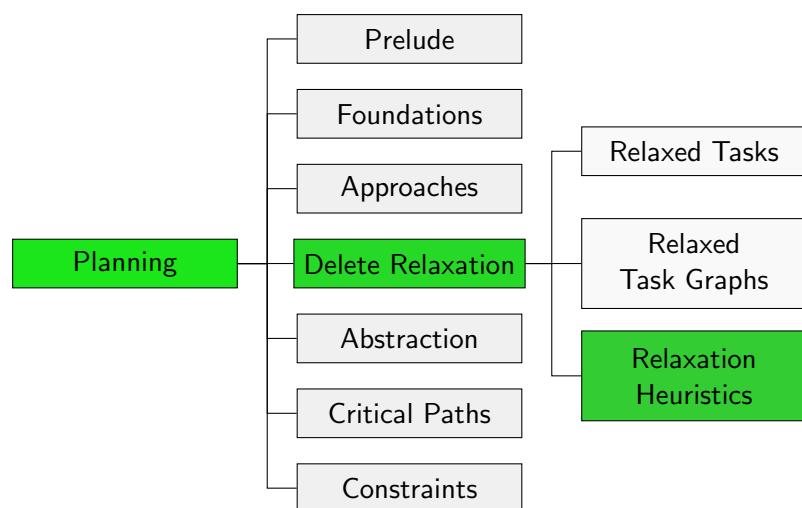
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D7.1 Choice Functions

D7.2 Best Achievers

D7.3 Summary

Content of this Course



D7.1 Choice Functions

Motivation

- ▶ In this chapter, we analyze the behaviour of h^{\max} and h^{add} more deeply.
- ▶ Our goal is to understand their shortcomings.
 - ▶ In the next chapter we then used this understanding to devise an improved heuristic.
- ▶ As a preparation for our analysis, we need some further definitions that concern **choices** in AND/OR graphs.
- ▶ The key observation is that if we want to establish the value of a certain node n , we can to some extent **choose** how we want to achieve the OR nodes that are relevant to achieving n .

Choice Functions

Definition (Choice Function)

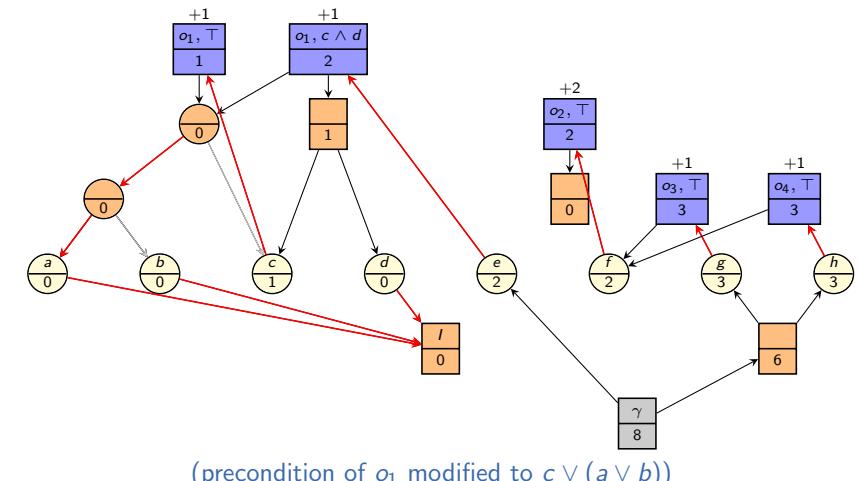
Let G be an AND/OR graph with nodes N and OR nodes N_V .

A **choice function** for G is a function $f : N' \rightarrow N$ defined on some set $N' \subseteq N_V$ such that $f(n) \in \text{succ}(n)$ for all $n \in N'$.

- ▶ In words, choice functions select (at most) **one** successor for each OR node of G .
- ▶ Intuitively, $f(n)$ selects by which disjunct n is achieved.
- ▶ If $f(n)$ is undefined for a given n , the intuition is that n is not achieved.

Preview: Choice Function & Best Achievers

Preserve at most one outgoing arc of each OR node, but node values may not change.



Once we have decided how to achieve an OR node, we can remove the other alternatives:

Definition (Reduced Graph)

Let G be an AND/OR graph, and let f be a choice function for G defined on nodes N' .

The **reduced graph** for f is the subgraph of G where all outgoing arcs of OR nodes are removed except for the chosen arcs $\langle n, f(n) \rangle$ with $n \in N'$.

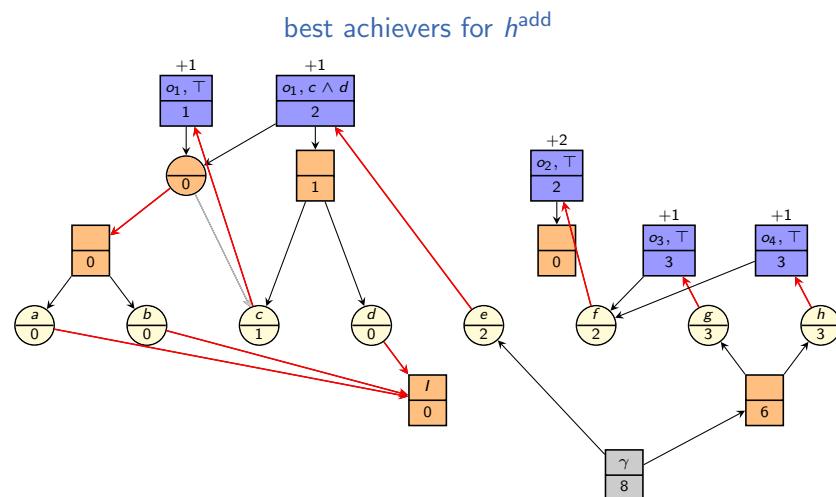
D7.2 Best Achievers

Choice Functions Induced by h^{\max} and h^{add}

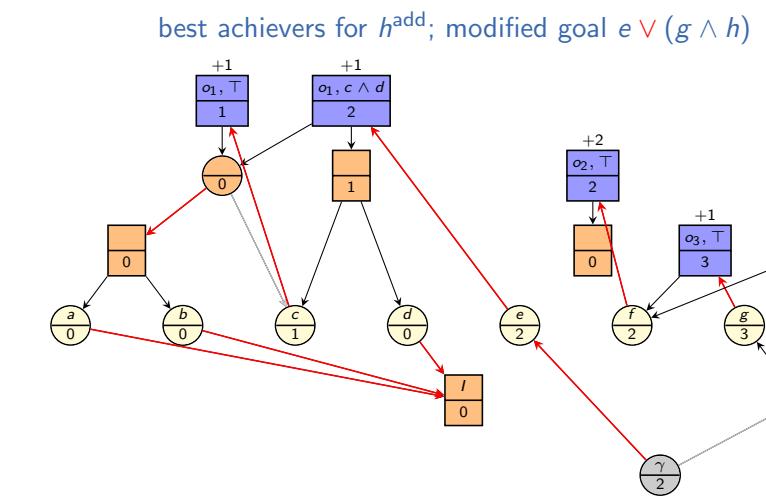
Which choices do h^{\max} and h^{add} make?

- ▶ At every OR node n , we set the cost of n to the **minimum** of the costs of the successors of n .
- ▶ The motivation for this is to achieve n via the successor that can be achieved **most cheaply** according to our cost estimates.
- ↪ This corresponds to defining a choice function f with $f(n) \in \arg \min_{n' \in N'} n'.\text{cost}$ for all reached OR nodes n , where $N' \subseteq \text{succ}(n)$ are all successors of n processed before n .
- ▶ The successors chosen by this cost function are called **best achievers** (according to h^{\max} or h^{add}).
- ▶ Note that the best achiever function f is in general not well-defined because there can be multiple minimizers. We assume that ties are broken arbitrarily.

Example: Best Achievers (1)



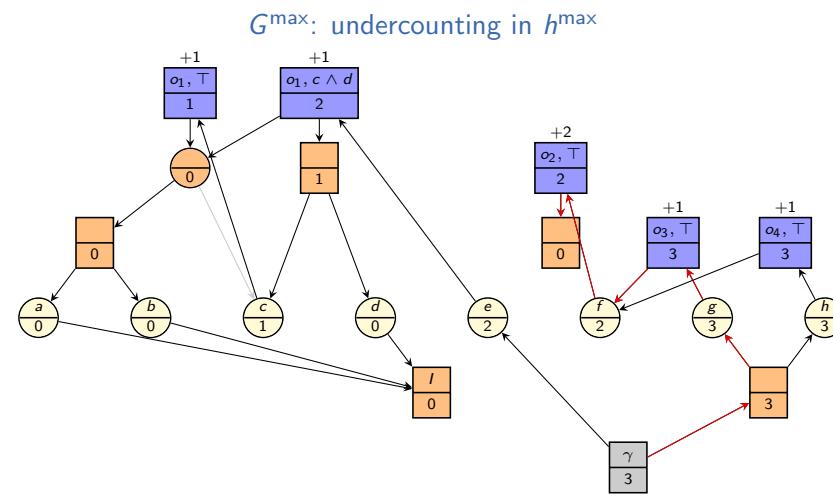
Example: Best Achievers (2)



Best Achiever Graphs

- ▶ **Observation:** The h^{\max}/h^{add} costs of nodes remain the same if we replace the RTG by the reduced graph for the respective best achiever function.
- ▶ The AND/OR graph that is obtained by removing all nodes with infinite cost from this reduced graph is called the **best achiever graph** for h^{\max}/h^{add} .
 - ▶ We write G^{\max} and G^{add} for the best achiever graphs.
- ▶ G^{\max} (G^{add}) is always **acyclic**: for all arcs $\langle n, n' \rangle$ it contains, n is processed by h^{\max} (by h^{add}) after n' .

Example: Undercounting in h^{\max}



Paths in Best Achiever Graphs

Let n be a node of the best achiever graph.

Let N_{eff} be the set of effect nodes of the best achiever graph.

The **cost** of an **effect node** is the cost of the associated operator.

The **cost** of a **path** in the best achiever graph is the sum of costs of all **effect nodes** on the path.

The following properties can be shown by induction:

- ▶ $h^{\max}(n)$ is the **maximum cost** of all paths originating from n in G^{\max} . A path achieving this maximum is called a **critical path**.
- ▶ $h^{\text{add}}(n)$ is the **sum**, over all effect nodes n' , of the cost of n' multiplied by the **number of paths** from n to n' in G^{add} .

In particular, these properties hold for the goal node n_{γ} if it is reachable.

Example: Overcounting in h^{add}



D7.3 Summary

Summary

- ▶ h^{\max} and h^{add} can be used to decide **how** to achieve OR nodes in a relaxed task graph
~~~ **best achievers**
- ▶ **Best achiever graphs** help identify shortcomings of  $h^{\max}$  and  $h^{\text{add}}$  compared to the perfect delete relaxation heuristic  $h^+$ .
  - ▶  $h^{\max}$  **underestimates**  $h^+$  because it only considers the cost of a **critical path** for the relaxed planning task.
  - ▶  $h^{\text{add}}$  **overestimates**  $h^+$  because it double-counts operators occurring on **multiple paths** in the best achiever graph.