# Loop Detection in the PANDA Planning System

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## Loop Detection in HTN Planning

- HYPERTENSION, the winner of the track on *Totally-Ordered HTN Planning* of the 2020 IPC comes with an interesting search technique
- ▶ it tracks parts of the decomposition path in the state of the problem and
- ▶ uses this information to leave decomposition structures that otherwise would have resulted in an infinite loop of its depth first search
- This can be seen as a preliminary form of loop detection
- In classical planning, most (search-based) planning systems use a loop detection/a graph search
- In HTN planning, this is computationally costly in the general case

## Loop Detection in HTN Planning

- Search nodes contain a state and a task network
- We need to compare both to identify duplicates
- → Here we focus on task networks
- It has been shown that checking whether task networks are isomorphic is as hard as graph isomorphism

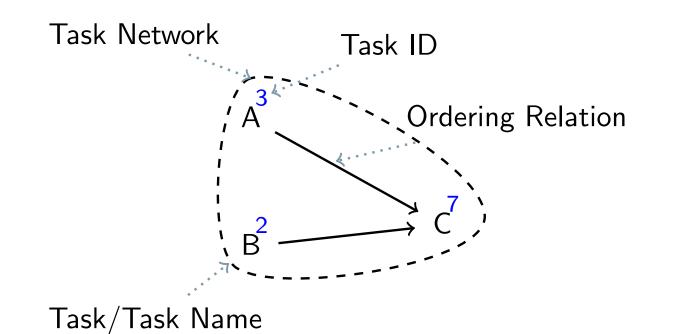


Figure 1: Schema of task networks.

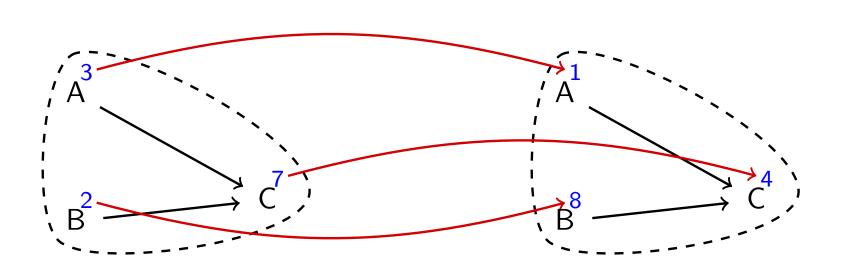


Figure 2: ID mapping between isomorphic tasks.

#### Loop Detection in HTN Planning

- We integrate loop detection into the progression search of the PANDA system
- We integrate it in the mechanics of the search, obtaining a graph search

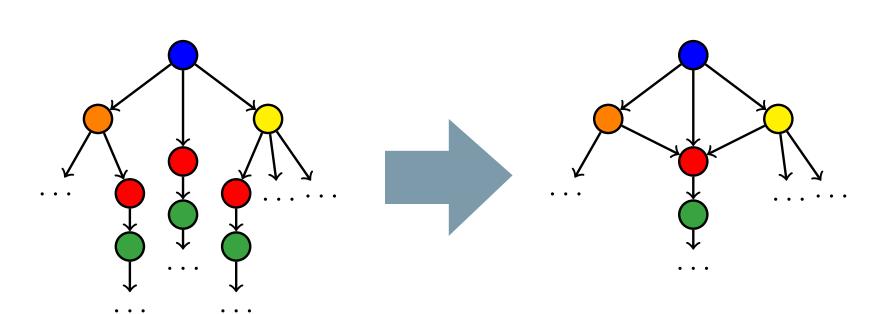


Figure 3: From tree search to graph search.

#### Loop Detection in HTN Planning

- To make the comparison feasible, we
- ▶ introduce approximations and
- exploit special cases

## Task Hash Approximation

- Determine for each task how often it is in the task network
- Compare or hash the resulting table
- Non-isomorphic task networks might have same table and same hash
- → Search becomes incomplete

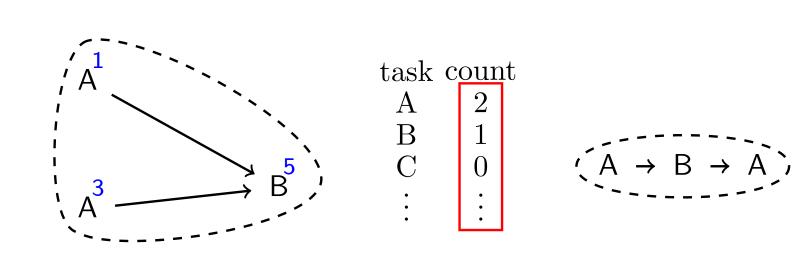


Figure 4: Task Hash approximation.

## Task Layers Approximation

- Determine layers of tasks
- Sort and concatenate the layers
- Non-isomorphic task networks might have same layering and same hash
- → Search becomes incomplete

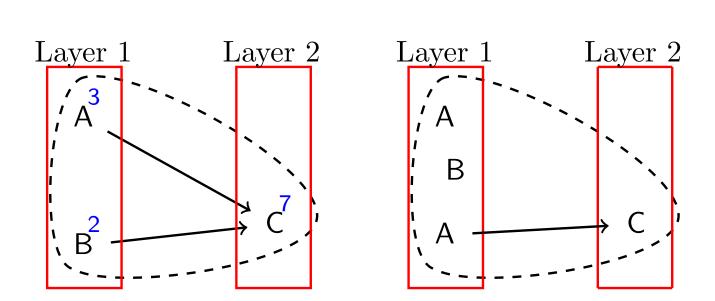


Figure 5: Task Layers approximation.

## Ordering Relations Approximation

- Determine pairs of ordering relations
- Sort and concatenate them
- Non-isomorphic task networks might have same pairs and same hash
- → Search becomes incomplete

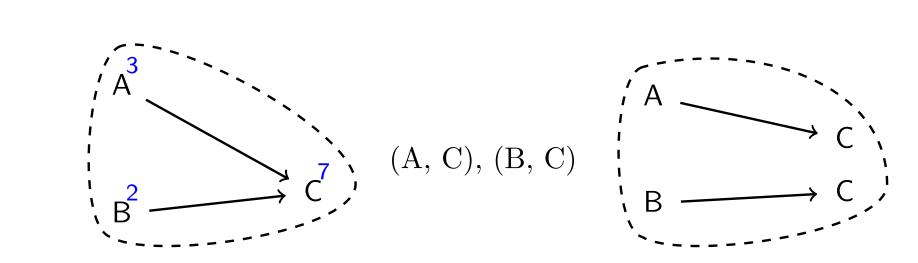


Figure 6: Ordering Relations approximation.

#### **Exact Test for Totally Ordered Problems**

- For totally ordered problems, we can compare the task sequences
- Results in an exact isomorphism test

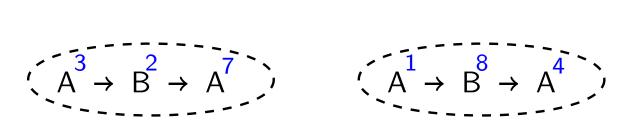


Figure 7: Exact test for totally ordered problems.

#### Exact Test for Partially Ordered Problems (1)

- For partially ordered problems, we can compare the task networks
- Results in an exact isomorphism test
- ullet Is hard to compute o first hash, compute only for hash bucket

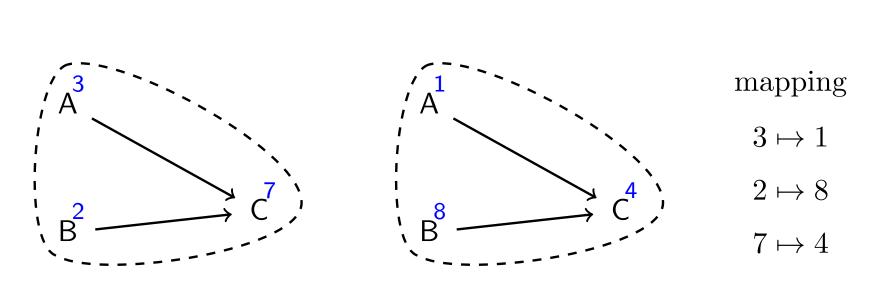


Figure 8: Exact test for partially ordered problems (1).

#### **Exact Test for Partially Ordered Problems (2)**

- Many partially ordered problems have a special structure:
- ▶ the initial task network is totally unordered and
- all methods are totally ordered
- This form is sufficient to encode semi-decidable problems
- All networks generated during search are sets of sequences
- We sort these sequences and treat them similar to TO networks

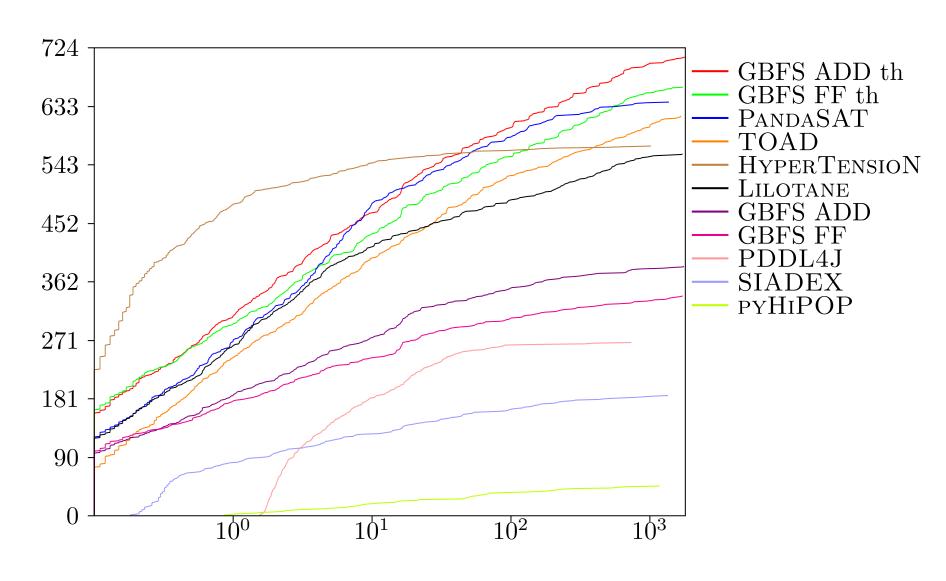


Figure 9: Empirical Results - Totally Ordered Planning.

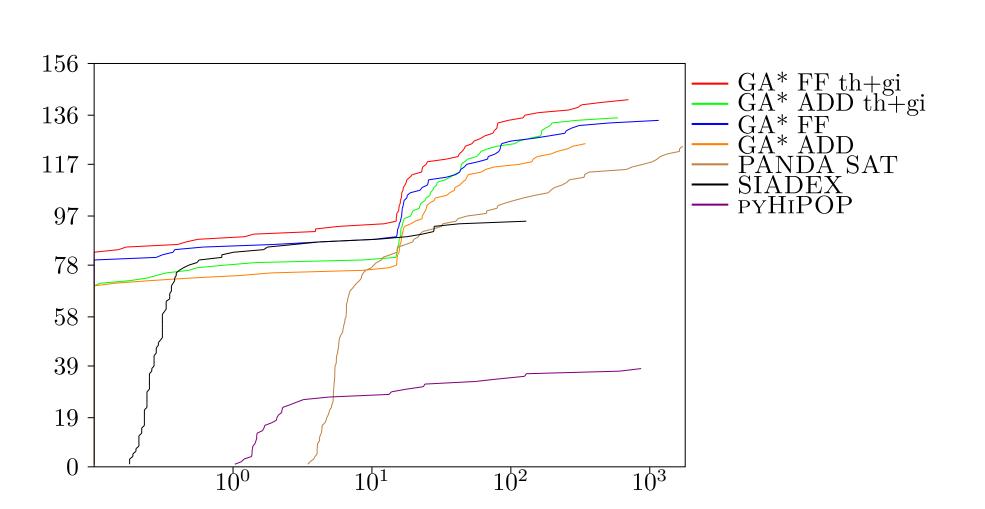


Figure 10: Empirical Results – Partially Ordered Planning.

## Conclusion

- We realized a graph search based on the progression search of the PANDA system
- To do so, we need to check for duplicate search nodes
- To make this feasible,
- we realized several approximations that render the search incomplete
- we exploit special cases during the exact calculation
- Especially on the benchmark set of the Totally Ordered Track, this highly improves PANDA's performance



