# $POP \equiv POCL, right?$

## **Complexity Results for Partial Order (Causal Link) Makespan Minimization**

### **Pascal Bercher and Conny Olz**

Institute of Artificial Intelligence, Ulm University, Germany pascal.bercher@anu.edu.au and conny.olz@uni-ulm.de

#### What is POCL?

- POCL Planning = Partial Order Causal Link Planning
- ► A planning technique that was prominent in the 80s to late 90s based on: search in the space of partial plans
- The search algorithm performs a regression-like search
- $\rightarrow$  but this is not important for the paper! It focuses on the data structure *partial plans* rather than on search.
- So what is a POCL plan?
- ► A partially ordered set of actions.
- Preconditions and effects might be "connected" with causal links. The respective actions are then called *producer* and *consumer*, respectively.
- ► Causal links *protect* their condition: no task may be ordered in between a link. (See graphical example)

#### **POP** $\neq$ **POCL**: So What?

- This has become forgotten, so there are many (sometimes "sloppy") formulations stating POCL plans to be equivalent to PO plans.
- Theorems or even algorithms might be wrong!
- Clearly, all algorithms that optimize with regard to ordering constraints need to be aware of any difference.
- ▶ What if an algorithm aims for makespan-optimal plans, but searches in the space of POCL plans? Can it be optimal? Do we *know* this yet?
- ► See the paper for a deeper discussion.
- It raises an open question: Does for each PO plan exist a POCL plan with the same makespan? This question is practically relevant as only if the answer is yes we are allowed to search makespan-minimal plans in space of POCL plans!

- When is a POCL plan a solution?
- ▶ If all preconditions are protected by a causal link
- $\rightarrow$  no open precondition flaws.
- ► No causal link can be invalidated
- $\rightarrow$  no causal threat flaws.
- $\rightarrow$  See the next example

### A POCL plan that's not a solution yet:

... because of unprotected (open) preconditions:



... and because of causal threats:



#### Makespan-minimal PO plan $\equiv$ Makespan-minimal POCL plan?

- Yes! We show that for every PO plan with makespan k there exists a POCL plan with makespan k.
- We also provide a polynomial-time procedure to *compute* such a POCL plan.

#### Optimizing Plans by *Deordering*

- Deordering is the process of (only!) deleting ordering constraints from a plan (i.e., without adding other ordering constraints) without violating executability.
- Using deordering, we can minimize the *number of ordering constraints* (thus increasing the number of linearizations) or we can minimize the makespan.

Example showing that minimizing the *number of ordering constraints* is not the same is minimizing the *makespan*:



- POP = Partial Order Planning (i.e., synonym to POCL Planning)
- Here, it means Partial Order Plan! These PO plans are essentially POCL plans without causal links.

#### • So what is a PO plan?

- ► A partially ordered set of actions.
- ► That's it no links exist.
- When is a PO plan a solution?
- ▶ If every linearization is executable. (I.e. every linearization is a solution in the standard classical sense.)
- ▶ This can be checked in polynomial time (see the paper, as this is quite complicated).

#### POP vs. POCL: Is there any *true* difference?

- Yes! (Which is important in theory and practice!)
  - Every POCL solution is a PO solution (just delete the links)
- ▶ But to turn a PO solution into a POCL solution we might have to change the ordering constraints!
- $\rightarrow$  Thus the resulting plans are not equivalent anymore! See the next example.

#### Example by Kambhampati:

_	
	<b>TT</b> 71

#### $\mathbf{p}$



 $\mathbf{P}$ 

- $p_3$  $\mathbf{A4}$
- Delete 3 orderings from A2, A3, and A4 to A5 to minimize orderings. • Delete the ordering from A1 to A5 to minimize makespan.

#### **Computational Hardness of Deordering**

- We are interested in the decision problem whether a deordering of an input plan exists that has a certain makespan.
- The computational hardness of *Reordering* was already known to be NP-complete. Reordering allows to change orderings (and links) arbitrarily.
- We show that *Deordering* is also *NP-complete*.
- Membership is trivial. For hardness we provide a reduction from 3-SAT:
- ▶ We create a PO solution with makespan 4.
- ► That plan can be deordered to a PO plan of makespan 3 if and only if the SAT formula is satisfiable.

#### Encoding:

We are given a 3-SAT formula in a form of a set of clauses  $C = \{C_1, \ldots, C_m\}$  over the set of variables  $X = \{x_1, \ldots, x_n\}$ , such that for all  $1 \le j \le m$ ,  $C_j = \{l_{j,1}, l_{j,2}, l_{j,3}\}$  is a clause of three literals over X. We construct a plan PO plan  $P = (PS, \prec)$  based on the STRIPS planning problem  $\mathscr{P} = (V, A, s_I, g)$ .

 $V = \bigcup_{1 \le i \le n} \{x_i^T, x_i^F, g_i\} \cup \bigcup_{1 \le j \le m} \{c_j\} \quad s_I = \emptyset \quad g = \{g_i \mid 1 \le i \le n\}$ 

action prec add del action prec add
-------------------------------------



Properties of this POCL plan:

It has 6 linearizations.

- All linearizations are executable, so it is a PO solution (just delete the links).
- It's not yet a POCL solution: the precondition P is still open.
- Inserting a missing link will cause a causal threat! So we will have to insert orderings.  $\rightarrow$  For this PO plan there does not exist a POCL plan with the same linearizations!

 $\{g_i\}$  $\{c_i\}$  $\{g_i, x_i^F\}$  $B_i^3$  $D_i$  $\{c_i\}$ 

Table 1: Actions for each atom  $x_i$  (left) and clause  $C_i$ (right). We define  $l_{j,r}^* \leftarrow x_k^T$  if  $l_{j,r} = x_k$  and  $l_{j,r}^* \leftarrow x_k^F$ if  $l_{j,r} = \neg x_k$ .





Deutsche Forschungsgemeinschaft DFG