On the Computational Complexity of Stackelberg Planning and Meta-Operator Verification

Primary Keywords: (4) Theory

Abstract

Stackelberg planning is a two-player variant of classical planning, in which one player tries to "sabotage" the other player in achieving its goal. This yields a bi-objective planning problem, which appears to be computationally more challenging

- than the single-player case. But is this actually true? All investigations so far focused on practical aspects, i.e., algorithms, and applications like cyber-security or very recently for meta-operator verification in classical planning. We close this gap by conducting the first theoretical complexity analy-
- sis of Stackelberg planning. We show that in general Stackelberg planning is no harder than classical planning. Under a polynomial plan-length restriction, however, Stackelberg planning is a level higher up in the polynomial complexity hierarchy, suggesting that compilations into classical planning
 come with an exponential plan-length increase. In attempts to
- identify tractable fragments exploitable, e.g., for Stackelberg planning heuristic design, we further study its complexity under various planning task restrictions, showing that Stackelberg planning remains intractable where classical planning is not. We finally inspect the complexity of the meta-operator
- verification, which in particular gives rise to a new interpretation as the dual problem of Stackelberg plan existence.

Introduction

Stackelberg planning (Speicher et al. 2018a) is a two-player
 variant of classical planning, where one player (the *leader*)
 tries to "sabotage" the other player (the *follower*). The leader
 moves first, committing to an action sequence, which subsequently the follower needs to complete to a plan. The leader's objective is maximizing the follower's optimal plan

- 30 cost while minimizing her own cost. This type of planning is useful for real-world adversarial settings commonly found in the cyber-security domain (Speicher et al. 2018b; Di Tizio et al. 2023). *Leader-follower search* (Speicher et al. 2018a) is the so far only algorithm paradigm proposed for solv-
- ing such tasks. In essence, it boils down to a search in the leader state space, solving for every visited leader state the follower's associated classical planning task. Given that exponentially such follower tasks must be solved in the worst case, one might wonder whether Stackelberg planning is in
- ⁴⁰ fact computationally more difficult than classical variant. Past work on Stackelberg planning however so far focused on algorithmic improvements rather than studying this question (Torralba et al. 2021; Sauer et al. 2023).

To close this gap, we present the first theoretical investigation of Stackelberg planning's complexity. We show that Stackelberg planning remains PSPACE-complete in general. However, Stackelberg planning with polynomial plan-length bounds is Σ_2^P -complete, contrasting the NP-completeness of the corresponding classical planning problem (Bylander 1994). Assuming that the polynomial hierarchy does not collapse, this suggests that compilations of Stackelberg planning into classical planning need to come with an exponential increase in plan length.

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The analysis of tractable fragments has shown to be an important source for the development of domain-independent heuristic in classical planning (e.g., Hoffmann and Nebel 2001; Domshlak, Hoffmann, and Katz 2015). With the vision of establishing a basis for the development of leaderfollower search heuristics, we analyze the complexity of Stackelberg planning under various syntactic restrictions. An overview of our results is given in Tab. 1.

Lastly, we explore a problem related to Stackelberg planning: *meta-operator* (Pham and Torralba 2023) verification. Meta-operators are action-sequence wild cards, which can be instantiated freely for every state satisfying the operator's precondition as long as operator's effects match. Pham and Torralba have cast verifying whether a given action is a valid meta-operator as a Stackelberg planning task. We show that meta-operator verification PSPACE-complete and Π_2^P complete under a polynomial plan-length restriction. This gives rise to a new interpretation of the meta-operator verification as the dual problem of Stackelberg planning.

Note to Reviewers: This is a short-paper version without proofs. All proofs are in the supplement, which we will publish. Alternatively, if you so desire, we can include all proofs into a long version of paper (see alternative attached).

Background

Classical Planning We assume STRIPS notation (Fikes and Nilsson 1971). A planning task is a tuple $\Pi = \langle V, A, I, G \rangle$ consisting of a set of propositional *state variables* (or *facts*) V, a set of *actions* A, an *initial state* $I \subseteq V$, and a *goal* $G \subseteq V$. For $p \in V$, p and $\neg p$ are called *literals*. A *state* s is a subset of V, with the interpretation that all state variables not in s do not hold in s. Each action $a \in A$ has a *precondition* pre(a), a conjunction of literals, an *add effect* (also called positive effect) $add(a) \subseteq V$, a *delete effect* (neg-

	Plan existence		Optimal planning		
Syntactic restrictions	PLANSAT	STACKELSAT	PLANMIN	N STACKELMIN	METAOPVER
* preconds * effects $ \pi $ not bounded	PSPACE	PSPACE (Theorem 1)	PSPACE	PSPACE (Theorem 2)	PSPACE (Theorem 10)
* preconds * effects $ \pi \in \mathcal{O}(n^k)$	NP	$\Sigma_2^{\rm P}$ (Theorem 3)	NP	$\Sigma_2^{\rm P}$ (Theorem 3)	$\Pi_2^{\rm P}$ (Theorem 11)
1 precond 1+ effect	NP	$\Sigma_2^{\rm P}$ (Theorem 4)	NP	$\Sigma_2^{\rm P}$ (Corollary 1)	_
*+ preconds 1 effect	Р	NP (Theorem 5)	NP	$\Sigma_2^{\rm P}$ (Theorem 7)	_
0 preconds 2 effects	Р	P for ∞ effects (Theorem 6)	NP	$\Sigma_2^{\rm P}$ (Theorem 8)	_
0 preconds 1 effect non-unit cost	Р	P for ∞ effects (Theorem 6)	Р	NP (Theorem 9)	-

Table 1: Overview of our complexity results. For comparison, the PLANSAT and PLANMIN columns show the complexity of classical planning under the respective task restrictions, as given by (Bylander 1994). All results prove completeness with respect to the different complexity classes. * means arbitrary number, + only positive, + arbitrary positive, and n+n positive.

ative effect) $del(a) \subseteq V$, and a non-negative $cost c(a) \in \mathbb{N}_0$. a is applicable in a state s iff $s \models pre(a)$. Executing a in s yields the state $s[a] = (s \setminus del(a)) \cup add(a)$. These definitions are extended to action sequences π in an iterative manner. The cost of π is the sum of costs of its actions. π is called an *s*-plan if π is applicable in *s* and $G \subseteq s[\![\pi]\!]$. π is an *optimal s*-plan if $c(\pi)$ is minimal among all *s*-plans. An (optimal) plan for Π is an (optimal) *I*-plan. If there is no *I*-plan,

we say that Π is *unsolvable*. Two decision problem formu-95 lations of classical planning are considered in the literature. *PLANSAT* is the problem of given a planning task Π , deciding whether there exists any plan for Π . *PLANMIN* asks, given in addition a (binary-encoded) cost bound B, whether there is a plan π for Π with cost $c(\pi) \leq B$. Both problems 100

are known to be PSPACE-complete (Bylander 1994).

Stackelberg Planning A Stackelberg planning task (Speicher et al. 2018a) is a tuple $\Pi^{LF} = \langle V, A^L, A^F, I, G^F \rangle$, where the set of actions is partitioned into one for each player. A *leader plan* is an action sequence π^L 105 prayer. A reduce plan is an action sequence $\pi = \langle a_1^L, \ldots, a_n^L \rangle \in (A^L)^n$ that is applicable in I. π^L induces the follower task $\Pi^F(\pi^L) = \langle V, A^F, I[\![\pi^L]\!], G^F \rangle$. An (optimal) follower response to π^L is an (optimal) plan for $\Pi^F(\pi^L)$. We denote by $c^F(\pi^L)$ the cost of the optimal follower response to π^L is cost of the optimal follower response to π^L . mal follower response to π^L , defining $c^F(\pi^L) = \infty$ if 110 $\Pi^F(\pi^L)$ is unsolvable. Leader plans are compared via a dominance order between cost pairs where $\langle c_1^L, c_1^F \rangle$ weakly dominates order between cost pairs where $\langle c_1, c_1 \rangle$ weakly dominates $\langle c_2^L, c_2^F \rangle$ ($\langle c_1^L, c_1^F \rangle \sqsubseteq \langle c_2^L, c_2^F \rangle$), if $c_1^L \le c_2^L$ and $c_1^F \ge c_2^F$. $\langle c_1^L, c_1^F \rangle$ (strictly) dominates $\langle c_2^L, c_2^F \rangle$ ($\langle c_1^L, c_1^F \rangle \sqsubset \langle c_2^L, c_2^F \rangle$), if $\langle c_1^L, c_1^F \rangle \sqsubseteq \langle c_2^L, c_2^F \rangle$ and $\langle c_1^L, c_1^F \rangle \ne \langle c_2^L, c_2^F \rangle$. To simplify notation, we write $\pi_1^L \sqsubset$ π_2^L if $\langle c(\pi_1^L), c^F(\pi_1^L) \rangle \sqsubset \langle c(\pi_2^L), c^F(\pi_2^L) \rangle$. A leader plan 115 π^L is optimal if it is not dominated by any leader plan. Previous works have considered algorithms for computing the set of all optimal solutions, called the Pareto frontier. 120

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Stackelberg Planning Decision Problems

We distinguish between two decision-theoretic formulations of Stackelberg planning, akin to classical planning:

Definition 1 (STACKELSAT). Given Π^{LF} , STACKELSAT is the problem of deciding whether there is a leader plan π^L 125 that makes $\Pi^{F}(\pi^{L})$ unsolvable.

Definition 2 (STACKELMIN). Given Π^{LF} , and two binary-encoded numbers $B^L, B^F \in \mathbb{N}_0$. STACKELMIN is the problem of deciding whether there is a leader plan π^L with $\langle c(\pi^L), c^F(\pi^L) \rangle \sqsubseteq \langle B^L, B^F \rangle$.

Interpreting the leader's objective as rendering the follower's objective infeasible, the first definition directly mirrors the PLANSAT plan-existence decision problem. Similarly, the second definition mirrors PLANMIN in looking for solutions matching a given quantitative cost bound. It is 135 worth mentioning that both decision problems are implicitly looking for only a single point in the Pareto frontier, whereas previous practical works dealt with algorithms computing this frontier entirely. In terms of computational complexity, this difference is however unimportant. In particular, an-140 swering even just a single STACKELMIN question does in fact subsume the computation of the entire Pareto frontier if the answer is no, one necessarily had to compare the given bounds to every element in the Pareto frontier.

As in classical planning, STACKELSAT can be easily 145 (with polynomial overhead) reduced to STACKELMIN:

Proposition 1. STACKELSAT is polynomially reducible to STACKELMIN.

Given that Stackelberg planning is a proper generalization of classical planning, the Stackelberg decision problems 150 are guaranteed to be at least as hard as the respective classical planning decision problem. By applying the same proof idea as the Immerman-Szelepcsényi theorem (Szelepcsényi 1987; Immerman 1988), we can prove that it is also no harder than classical planning in the general case: 155

Theorem 1. STACKELSAT is PSPACE-complete.

Theorem 2. STACKELMIN is PSPACE-complete.

In spite of these results, algorithms for Stackelberg planning are significantly more complicated than their classical planning counterparts. In particular, the results raise the 160

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question of whether it is possible to leverage directly the classical planning methods for solving Stackelberg tasks via compilation. Polynomial compilations necessarily exist as per the theorems, yet, it is interesting to investigate which "side-effects" these might need to have. For example, it

is possible any such compilation will have exponentially longer plan, rendering this approach infeasible in practice. In order to investigate these questions, we turn to a more fine granular analysis by considering the complexity under various previously studied syntactic classes of planning tasks.

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Stackelberg Planning under Restrictions

Polynomial Plan Length

For classical planning, it is commonly known that restricting the length of the plans to be *polynomial* in the size of the planning task description, makes the decision problems become NP-complete.

Definition 3 (Polynomial Stackelberg Decision). Given Π^{LF} with non-0 action costs, and two binary-encoded numbers $B^L, B^F \in \mathbb{N}_0$ that are bounded by some polynomial

 $p \in \mathcal{O}(\ell^k)$ for $\ell = |V| + |A^L| + |A^F|$. STACKELPOLY is 180 the problem of deciding whether there is a leader plan π^L such that $\langle c(\pi^L), c^F(\pi^L) \rangle \sqsubseteq \langle B^L, B^F \rangle$.

We restrict the action cost to be strictly positive, ensuring that considering leader and follower plans with polynomial length is sufficient to answer the decision problem. STACK-ELPOLY is harder than the corresponding classical problem.

Theorem 3. STACKELPOLY is Σ_2^P -complete.

This result strongly suggests that a compilation of Stackelberg planning into classical planning is in general not possible without an exponential blow-up of some kind. Namely, 190 suppose it were possible to compile any Stackelberg planning task into classical planning in a way so that the size as well as the length of the plans of the classical planning task can be related polynomially to the size of the Stackelberg task. Suppose the plans of the Stackelberg task are polyno-195 mially bounded. Since polynomial length plan existence for classical planning is NP-complete, this would, together with our result, imply that NP = $\Sigma_2^{\rm P}$, thus collapsing the polynomial hierarchy (Arora and Barak 2007, Theorem 5.6). As this is unlikely given out current knowledge, we hence sur-200 mise that such polynomial compilations do not exist. Or in

other words: we know that an exponential blow-up in the computation is not avoidable in all circumstances.

Stackelberg Planning under Bylander's Syntactic Restrictions

Bylander (1994) studied the complexity of classical planning under various syntactic restrictions, drawing a concise borderline between planning's tractability and infeasibility. Bylander distinguishes between different planning task

- classes based on the number of action preconditions and ef-210 fects, and the existence of negative preconditions or effects. Table 1 provides an overview of the main classes. Here, we take up his analysis and show that even for the classes where classical planning is tractable, Stackelberg may not be. We
- consider STACKELSAT and STACKELMIN in this order. 215

Definition 4. Let $m, n \in \mathbb{N}_0 \cup \{\infty\}$. STACKELSAT^m_n is the problem of deciding STACKELSAT for Stackelberg tasks so that $|pre(a)| \le m$ and $|add(a)| + |del(a)| \le n$ hold for all actions a. If m is preceded by "+", actions may not have negative preconditions. If n is preceded by "+", actions may not have delete effects. $STACKELMIN_n^m$ is defined similarly.

We omit m (n) if $m = \infty$ $(n = \infty)$. We consider only cases where the classical-planning decision problems are in NP. Stackelberg planning is PSPACE-hard when classical planning is.

Plan Existence

Bylander (1994) has shown that PLANSAT is already NPcomplete for tasks with actions that even have just a single precondition and a single effect. Here we show that the corresponding Stackelberg decision problem is even one step 230 above in the polynomial hierarchy:

Theorem 4. STACKELSAT¹₊₁ is Σ_2^P -complete.

Bylander (1994) has shown that PLANSAT is polynomial if only positive preconditions and only a single effect per action are allowed. Even under these restrictive conditions, 235 STACKELSAT however still remains intractable:

Theorem 5. $STACKELSAT_1^+$ is NP-complete.

Stackelberg plan-existence however becomes easy, when forbidding preconditions throughout. While this class of tasks seems to be trivial at first glance, optimal Stackelberg 240 planning actually remains intractable as we show below.

Theorem 6. STACKELSAT⁰ is polynomial.

Optimal Planning

As per Proposition 1, optimal planning is in general at least as hard as deciding plan existence. All intractability results 245 shown for STACKELSAT carry over to STACKELMIN. As in all classes analyzed in the previous section, the consideration of polynomially length-bounded plans is sufficient for hardness, Σ_2^p yields a sharp upper bound to the complexity of STACKELMIN, as per Theorem 3. In particular: 250

Corrolary 1. STACKELMIN¹₊₁ is Σ_2^P -complete.

The results for STACKELSAT only provide a lower bound to the complexity of STACKELMIN. This lower bound may be strict as demonstrated by Thm. 7 and 8:

Theorem 7. STACKELMIN₁⁺¹ is Σ_2^P -complete.

Theorem 8. STACKELMIN₂⁰ is Σ_2^P -complete.

Optimal Stackelberg planning remains intractable even when all actions have no preconditions and may have only at most one effect.

Theorem 9. $STACKELMIN_1^0$ is NP-complete in general, but 260 polynomial when additionally assuming unit cost.

Complexity of Meta Operator Verification

Pham and Torralba (2023) have recently leveraged Stackelberg planning for synthesizing meta-operators in classical planning. Meta-operators, like macro-actions (Fikes and 265 Nilsson 1971), are artificial actions that aggregate the effect of action sequences, therewith introducing shortcuts in statespace search. Formally, we are given a classical planning

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task \varPi and an action σ that is not in \varPi 's action set. σ is a *meta-operator for* Π if, for every state $s \models pre(\sigma)$ that is 270 reachable from I, there exists a sequence π of Π 's actions such that $s[\sigma] = s[\pi]$. Whether a given σ is a meta-operator can be verified by solving a Stackelberg planning task.

- Here, we consider the question whether using an expressive and computationally difficult formalism like Stackel-275 berg planning is actually necessary. For this, we determine the computational complexity of meta-operator synthesis and compare it to that of Stackelberg planning, and based on this analysis point out an interesting connection.
- **Definition 5** (Meta-Operator Verification). Given Π and a 280 fresh action σ . METAOPVER is the problem of deciding whether σ is a meta-operator for Π .

Like for Stackelberg planning, the complexity of metaoperator verification in general remains the same as that of 285 classical planning:

Theorem 10. METAOPVER is PSPACE-complete.

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In other words, meta-operator verification could as well be compiled directly into a classical rather than a Stackelberg planning task. But how difficult or effective would such a compilation be? To shed light on this question, we again turn to a length bounded version of the problem.

Definition 6 (Polynomial Meta-Operator Verification). Given Π with non-0 action costs, a fresh action σ , and two binary-encoded numbers $B^P, B^M \in \mathbb{N}_0$ that are bounded by some polynomial $p \in \mathcal{O}(\ell^k)$ for $\ell = |V| + |A|$. poly-295 METAOPVER is the problem of deciding whether for all states $s \models pre(\sigma)$ reachable from I with a cost of at most B^P , there exists π with $c(\pi) \leq B^M$ and $s[\pi] = s[\sigma]$.

The parameters B^P and B^M define the perimeter around the initial state respectively the reached state under which 300 the meta-operator conditions are to be verified. As for Stackelberg planning, we require that the cost of all actions is strictly positive, which together with the cost bounds ensures that the radius of the perimeter is polynomially bounded.

Polynomial meta-operator verification too is on the sec-305 ond level of the polynomial hierarchy. We again point out that, under the assumption that the polynomial hierarchy does not collapse, this result shows that all classicalplanning encodings of meta-operator verification generally need to come with an exponential explosion of some kind. 310

Theorem 11. polyMETAOPVER is Π_2^P -complete.

Note that polyMETAOPVER is therefore in the cocomplexity-class of polynomial Stackelberg plan-existence, i.e., they belong to co-classes on the same level of the polynomial hierarchy. This may not be surprising given that meta-operator verification can indeed be seen as the dual of Stackelberg plan existence: while the latter asks for the existence of a (leader) action sequence where all induced (follower) action sequences satisfy some property, metaoperator verification swaps the quantifiers.

We want to point out that the duality between METAOPVER and STACKELSAT can be exploited further, showing analogous results for Bylander's (1994) task classes. Contrary to Stackelberg planning, however, the identification of tractable fragments is less useful for meta-325 operator verification due to the lack of the monotonicity invariance of the meta-operator condition. An action being a meta-operator in a task abstraction does not imply that the action is a meta-operator in the original task, and vice versa. We hence do not further explore this analysis here. 330

Related Work

Stackelberg planning is related to conformant and conditional planning, extensions of classical planning by state and/or action outcome uncertainty. Under the restriction to deterministic actions, both can be seen as a special case of 335 Stackelberg planning using the leader-reachable states as an encoding of the initial belief. With this interpretation, STACKELSAT is false iff the conditional planning task is solvable. If the follower is restricted to use the same plan independent of the leader actions, we would have a model for 340 conformant planning.

In the general case, conditional planning under partial observability and with conditional effects is EXPSPACE complete (Rintanen 2004). Both conformant and conditional planning have been investigated under the restriction 345 to only polynomially long plans, like we did here. Rintanen (1999) showed that polynomially-length-bounded conditional STRIPS planning Π_2^P complete, the co-result to our Thm. 3. His hardness proof uses a similar proof idea as ours, with technical differences owed to the different plan-350 ning formalism. Bonet (2010) studied conditional planning with non-determinstic actions, proving that polynomially bounded plan existence for conditional plans with at most kbranching points is Σ_{2k+k}^{P} -complete. Stackelberg planning corresponds k = 1, the difference between determinism and non-determinism causing the Σ_2^P vs. Σ_4^P complexity results. 355

For conformant planning, Baral, Kreinovich, and Trejo (2000) showed that plan existence is Σ_P^2 -complete, if conditional effects are allowed. Turner (2002) considered conditional and conformant planning, but his formalism 360 supported arbitrary boolean formulae as conditions, making length-1 plan existence already NP-complete.

No prior work on conformant/conditional planning considered any of Bylander's syntactical restrictions. Further, Stackelberg planning differs from conditional/conformant 365 planning in using a more complex compact description of the "relevant" states through reachability.

Conclusion

Stackelberg planning remains PSPACE-complete like classical planning in general, but is Σ_2^P complete under a polyno-370 mial plan-length bound. Hence, unless the polynomial hierarchy collapses at its first level, it is not possible to compile Stackelberg planning into classical planning without exponential blow-up. We showed that Stackelberg planning remains intractable even under various syntactical restrictions. 375 Lastly, we have proven similar results for meta-operator verification, showing that it is PSPACE-complete in general and Π_2^P -complete for the polynomial plan-length bounded case, implying the same type of results for it.

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