

Planning for Pure-Past Linear Temporal Goals

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Planning for Temporally Extended Goals

- Capture a richer class of plans using temporal logics
 - Deterministic planning [Bacchus et al. 1996; 1997; DeGiacomo&Vardi 1999; Bacchus&Kabanza 2000; ...]
 - Planning via Model Checking [Cimatti et al. 1997; 1998; Giunchiglia&Traverso 1999; ...]
- Recently, growing interest in the use of the finite-trace variant of LTL
 - Deterministic planning [Baier&McIlraith 2006; Torres&Baier 2015; ...]
 - Nondeterministic domain models (FOND) [Camacho et al. 2017; DeGiacomo&Rubin 2018; ...]

| | Reachability Goals | Temporally Extended Goals (LTLf/LDLf) |
|---------------------------|--------------------|---------------------------------------|
| Deterministic Planning | PSPACE-complete | PSPACE-complete |
| Nondeterministic Planning | EXPTIME-complete | 2EXPTIME-complete |

Pure-Past Linear Temporal Logic (PPLTL)

- Looks at the trace backward, and evaluates formulas on the last instant of the trace (i.e., the current instant)
- Past temporal operators only: *(Y)esterday*, *(S)ince*, *(O)nce in the past*, *(H)istorically*

Computational properties:

- As expressive as LTLf, but translating one into the other is prohibitive (3EXPTIME) [DeGiacomo et al. 2020]
- PPLTL to DFA is worst-case *single* exponential (vs. *double* exponential for LTLf to DFA) [Chandra et al. 1981; DeGiacomo et al. 2020]

PPLTL in Planning

- Little attention to AI planning, but commonly employed in other areas of AI
 - non-Markovian rewards in MDPs [Bacchus et al. 1996]
 - non-Markovian models [Gabaldon2011]
 - norms in multi-agent systems [Fisher&Wooldridge2005; Knobbout et al. 2016; Alechina et al. 2018]
- Actually, many interesting properties expressed in LTLf are *polynomially* related (in their size) to their *semantic* equivalent PPLTL (and vice versa)

| DECLARE Template | Equivalent PPLTL Formula | Equivalent LTL _f Formula |
|-------------------------------------|--|--|
| init(<i>a</i>) | $O(a \wedge \neg Y(true))$ | a |
| existence(<i>a</i>) | $O(a)$ | $F(a)$ |
| absence(<i>a</i>) | $\neg O(a)$ | $\neg F(a)$ |
| absence2(<i>a</i>) | $H(a \rightarrow WYH(\neg a))$ | $\neg(Fa \wedge XF(a))$ |
| choice(<i>a, b</i>) | $O(a) \vee O(b)$ | $F(a) \vee F(b)$ |
| exclusive-choice(<i>a, b</i>) | $(O(a) \vee O(b)) \wedge \neg(O(a) \wedge O(b))$ | $(F(a) \vee F(b)) \wedge \neg(F(a) \wedge F(b))$ |
| co-existence(<i>a, b</i>) | $H(\neg a) \leftrightarrow H(\neg b)$ | $F(a) \leftrightarrow F(b)$ |
| responded-existence(<i>a, b</i>) | $O(a) \rightarrow O(b)$ | $F(a) \rightarrow F(b)$ |
| response(<i>a, b</i>) | $(\neg a S b) \vee H(\neg a)$ | $G(a \rightarrow F(b))$ |
| precedence(<i>a, b</i>) | $H(b \rightarrow O(a))$ | $(\neg b U a) \vee G(\neg b)$ |
| succession(<i>a, b</i>) | $response(a, b) \wedge precedence(a, b)$ | |
| chain-response(<i>a, b</i>) | $H(Y(a) \rightarrow b) \wedge \neg a$ | $G(a \rightarrow X(b))$ |
| chain-precedence(<i>a, b</i>) | $H(b \rightarrow Y(a))$ | $G(X(b) \rightarrow a) \wedge \neg b$ |
| chain-succession(<i>a, b</i>) | $(H(Y(a) \rightarrow b) \wedge \neg a) \wedge H(Y(\neg a) \rightarrow \neg b)$ | $G(a \leftrightarrow X(b))$ |
| not-co-existence(<i>a, b</i>) | $O(a) \rightarrow \neg O(b)$ | $F(a) \rightarrow \neg F(b)$ |
| not-succession(<i>a, b</i>) | $H(b \rightarrow \neg O(a))$ | $G(a \rightarrow \neg F(b))$ |
| not-chain-succession(<i>a, b</i>) | $H(b \rightarrow \neg Y(a))$ | $G(a \rightarrow \neg X(b))$ |

| PDDL3 Operator | Equivalent PPLTL Formula | Equivalent LTL _f Formula |
|--|---|---|
| (at-end θ) | θ | $F(\theta \wedge end)$ |
| (always θ) | $H(\theta)$ | $G(\theta)$ |
| (sometime θ) | $O(\theta)$ | $F(\theta)$ |
| (sometime-after $\theta_1 \theta_2$) | $(\neg \theta_1 S \theta_2) \vee H(\neg \theta_1)$ | $G(\theta_1 \rightarrow F(\theta_2))$ |
| (sometime-before $\theta_1 \theta_2$) | $H(\theta_1 \rightarrow Y(O(\theta_2)))$ | $\theta_2 R \neg \theta_1$ |
| (at-most-once θ) | $H(\theta \rightarrow (\theta S (H(\neg \theta) \vee start)))$ | $G(\theta \rightarrow (\theta U (G(\neg \theta) \vee end)))$ |
| (hold-during $n_1 \ n_2 \ \theta$) | $\bigvee_{0 \leq i \leq n_1} (\theta \wedge Y^i(start)) \vee \bigwedge_{n_1 < i \leq n_2} H(\theta \vee WY^i(Y(true)))$ | $\bigvee_{0 \leq i \leq n_1} X^i(\theta \wedge end) \vee \bigwedge_{n_1 < i \leq n_2} WX^i(\theta)$ |
| * (hold-after $n \ \theta$) | $\bigvee_{0 \leq i \leq n} (\theta \wedge Y^i(start)) \vee O(\theta \wedge Y^{n+1}(O(start)))$ | $\bigvee_{0 \leq i \leq n} X^i(\theta \wedge end) \vee X^{n+1}(F(\theta))$ |

Handling PPLTL Goals

Intuition: given the prefix of a trace, while LTLf has to consider all possible extensions, PPLTL can simply be evaluated on the prefix (i.e., the history produced so far)

How?

Exploit the “fixpoint characterization” of temporal formulas [Gabbay et al. 1980; Manna 1982; Barringer et al., 1989; Emerson 1990]

- $\text{pnf}(p) = p$;
- $\text{pnf}(\mathbf{Y}\phi) = \mathbf{Y}\phi$;
- $\text{pnf}(\phi_1 \mathbf{S} \phi_2) = \text{pnf}(\phi_2) \vee (\text{pnf}(\phi_1) \wedge \mathbf{Y}(\phi_1 \mathbf{S} \phi_2))$;
- $\text{pnf}(\phi_1 \wedge \phi_2) = \text{pnf}(\phi_1) \wedge \text{pnf}(\phi_2)$;
- $\text{pnf}(\neg\phi) = \neg\text{pnf}(\phi)$.

To evaluate a PPLTL formula, we only need to keep track of the truth value of *some* of its subformulas!!!

Evaluating PPLTL Goals

Technique

- Collect these key subformulas as *propositions* in a set Σ_ϕ
- Define an interpretation function $\sigma: \Sigma_\phi \rightarrow \{\top, \perp\}$ that tells which propositions are true at a given instant of time
- Given the propositional interpretation of the *current instant* s_i and truth value σ_i of propositions in Σ_ϕ , evaluate any PPLTL formulas at instant i through $\text{val}()$ predicate recursively as follows:
 - $\text{val}(p, \sigma_i, s_i) \text{ iff } s_i \models p;$
 - $\text{val}(\text{Y}\phi', \sigma_i, s_i) \text{ iff } \sigma_i \models \text{"Y}\phi'";$
 - $\text{val}(\phi_1 \text{ S } \phi_2, \sigma_i, s_i) \text{ iff } \text{val}(\phi_2, \sigma_i, s_i) \vee (\text{val}(\phi_1, \sigma_i, s_i) \wedge \sigma_i \models \text{"Y}(\phi_1 \text{ S } \phi_2)");$
 - $\text{val}(\phi_1 \wedge \phi_2, \sigma_i, s_i) \text{ iff } \text{val}(\phi_1, \sigma_i, s_i) \wedge \text{val}(\phi_2, \sigma_i, s_i);$
 - $\text{val}(\neg\phi', \sigma_i, s_i) \text{ iff } \neg\text{val}(\phi', \sigma_i, s_i).$

Theorem

Given $\langle \sigma_0, \dots, \sigma_n \rangle$, a trace $\langle s_0, \dots, s_n \rangle$ satisfies a PPLTL formula ϕ if and only if $\text{val}(\phi, \sigma_n, s_n)$

Planning for PPLTL Goals

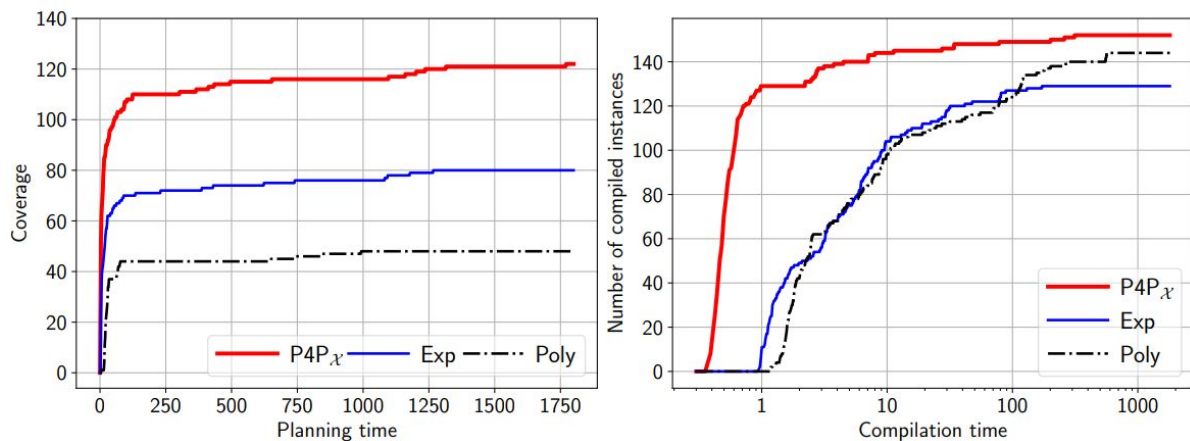
- Introduce only *few* new fluents, at most **linear** in the size of the PPLTL goal, i.e. minimal overhead
- No spurious additional actions
- Sidestep altogether the standard automata construction

| Components | Encoding | | | | | | | | | | |
|---|---|-----------------------------|--------------|---|--------------------------|---|-------------------------------------|---|---------------------------------|--|----------------------|
| Fluents \mathcal{F}' | $\mathcal{F}' := \mathcal{F} \cup \{ \text{"Y}\phi" \mid \text{"Y}\phi" \in \Sigma_\varphi \}$ | | | | | | | | | | |
| Derived Predicates \mathcal{F}'_{der} | $\mathcal{F}'_{der} := \mathcal{F}_{der} \cup \{ \text{val}_\phi \mid \phi \in \text{sub}(\varphi) \}$ | | | | | | | | | | |
| Axioms \mathcal{X}' | $\mathcal{X}' := \mathcal{X} \cup \{ x_\phi \mid \phi \in \text{sub}(\varphi) \}$ where x_ϕ is <table> <tr> <td>$\text{val}_p \leftarrow p$</td><td>$(\phi = p)$</td></tr> <tr> <td>$\text{val}_{\text{Y}\phi'} \leftarrow \text{"Y}\phi'"$</td><td>$(\phi = \text{Y}\phi')$</td></tr> <tr> <td>$\text{val}_{\phi_1 \text{ S } \phi_2} \leftarrow (\text{val}_{\phi_2} \vee (\text{val}_{\phi_1} \wedge \text{"Y}(\phi_1 \text{ S } \phi_2)"))$</td><td>$(\phi = \phi_1 \text{ S } \phi_2)$</td></tr> <tr> <td>$\text{val}_{\phi_1 \wedge \phi_2} \leftarrow (\text{val}_{\phi_1} \wedge \text{val}_{\phi_2})$</td><td>$(\phi = \phi_1 \wedge \phi_2)$</td></tr> <tr> <td>$\text{val}_{\neg\phi'} \leftarrow \neg\text{val}_{\phi'}$</td><td>$(\phi = \neg\phi')$</td></tr> </table> | $\text{val}_p \leftarrow p$ | $(\phi = p)$ | $\text{val}_{\text{Y}\phi'} \leftarrow \text{"Y}\phi'"$ | $(\phi = \text{Y}\phi')$ | $\text{val}_{\phi_1 \text{ S } \phi_2} \leftarrow (\text{val}_{\phi_2} \vee (\text{val}_{\phi_1} \wedge \text{"Y}(\phi_1 \text{ S } \phi_2)"))$ | $(\phi = \phi_1 \text{ S } \phi_2)$ | $\text{val}_{\phi_1 \wedge \phi_2} \leftarrow (\text{val}_{\phi_1} \wedge \text{val}_{\phi_2})$ | $(\phi = \phi_1 \wedge \phi_2)$ | $\text{val}_{\neg\phi'} \leftarrow \neg\text{val}_{\phi'}$ | $(\phi = \neg\phi')$ |
| $\text{val}_p \leftarrow p$ | $(\phi = p)$ | | | | | | | | | | |
| $\text{val}_{\text{Y}\phi'} \leftarrow \text{"Y}\phi'"$ | $(\phi = \text{Y}\phi')$ | | | | | | | | | | |
| $\text{val}_{\phi_1 \text{ S } \phi_2} \leftarrow (\text{val}_{\phi_2} \vee (\text{val}_{\phi_1} \wedge \text{"Y}(\phi_1 \text{ S } \phi_2)"))$ | $(\phi = \phi_1 \text{ S } \phi_2)$ | | | | | | | | | | |
| $\text{val}_{\phi_1 \wedge \phi_2} \leftarrow (\text{val}_{\phi_1} \wedge \text{val}_{\phi_2})$ | $(\phi = \phi_1 \wedge \phi_2)$ | | | | | | | | | | |
| $\text{val}_{\neg\phi'} \leftarrow \neg\text{val}_{\phi'}$ | $(\phi = \neg\phi')$ | | | | | | | | | | |
| Action Labels A | $A := A$, i.e., unchanged | | | | | | | | | | |
| Preconditions pre | $pre(a) := pre(a)$ for every $a \in A$, i.e., unchanged | | | | | | | | | | |
| Effects eff' | $eff'(a) := \{ eff_i \cup eff_{\text{val}} \mid eff_i \in eff(a) \}$, where $eff_{\text{val}} = \{ \text{val}_\phi \triangleright \{ \text{"Y}\phi" \}, \neg\text{val}_\phi \triangleright \{ \neg \text{"Y}\phi" \} \mid \text{"Y}\phi" \in \Sigma_\varphi \}$ | | | | | | | | | | |
| Initial State s'_0 | $s'_0 := \sigma_0 \cup s_0$ | | | | | | | | | | |
| Goal G' | $G' := \text{val}_\varphi$ | | | | | | | | | | |

Sound and complete approach to symbolically encode PPLTL temporally extended goal formulas in planning domains that is *linear* in both the size of the domain specification and the size of the PPLTL goal

Results for Deterministic Planning

- Introduce the Plan4Past¹ system
- Compare Plan4Past against state-of-the-art techniques for LTLf, Exp [Baier&McIlraith 2006] and Poly [Torres&Baier 2015], on a set of equivalent (semantic- and size-wise) LTLf/PPLTL formulas
- IPC domains: BLOCKS, ELEVATOR, OPENSTACKS, ROVERS



¹<https://github.com/whitemech/Plan4Past>

Summary and Future Work

- How to efficiently handle and evaluate PPLTL formulas
- Sound and complete approach to solve planning for PPLTL goals that is optimal wrt theoretical complexity with a clear advantage in practice
- To appear at ICAPS23: “Planning for Temporally Extended Goals in Pure-Past Linear Temporal Logic”

Future Work:

- Study nondeterministic planning
- Developing PPLTL-aware heuristics that exploit the structure of the formula
- Incorporate PPLTL patterns into PDDL, giving rise to PDDL4.0