Cooperative Epistemic Multi-Agent Planning with Implicit Coordination Thorsten Engesser¹, Thomas Bolander², Robert Mattmüller¹, Bernhard Nebel¹

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Why Epistemic Planning?



Implicit Coordination by projecting into the other agents' state of knowledge







- Collaborative, decentralized setting: Agents individually plan and decide, when and how to act under incomplete/distributed knowledge.
- Idea: Make observational and communicative actions part of the plan!

Dynamic Epistemic Logic

$\varphi ::= p \mid \neg \varphi \mid \varphi \land \varphi \mid K_i \varphi \mid C \varphi \mid ((a)) \varphi$

- Allows reasoning about knowledge and action consequences
- \triangleright $K_i((a))\varphi$: Agent i knows a is applicable and leads to a situation where φ holds
- Interpretation over standard S5_n Kripke models

 $\mathcal{M} = \underbrace{\bullet}_{w_1} \underbrace{1, 2}_{w_2} \underbrace{\bullet}_{n} \underbrace{w_2}_{n} \underbrace{\neg p}_{w_2} \underbrace{\neg p}_{n} \quad \blacktriangleright \mathcal{M}, w_1 \models p \text{ and } \mathcal{M}, w_2 \models \neg p$ $w_1:p$ $w_2:
egp$

Epistemic States and Actions

- **Epistemic States** (\mathcal{M}, W_d) correspond to the **belief states** $\{(\mathcal{M}, w) \mid w \in W_d\}$
- \blacktriangleright Global states $(\mathcal{M}, \{w\})$ contain complete information about the situation
- \blacktriangleright Local states (with W_d closed under R_i) match the perspective of an agent i
- Shifting perspective to the associated local state of another agent possible
- **Epistemic Actions** (\mathcal{E}, E_d) as multi-pointed Kripke structures on possible events with additional per-event pre-/postconditions
- Successor states via the **Product Update** $(\mathcal{M}', W'_d) = (\mathcal{M}, W_d) \otimes (\mathcal{E}, E_d)$

Example: Observational and Communicative Actions

- **Sensing action** sense for agent 1, checking whether p or $\neg p$: $(\bullet) \xrightarrow{1,2,3} (\bullet) \xrightarrow{2,3} (\bullet) \xrightarrow{2$ $w_2: \neg p \quad e_1: \langle p, \top \rangle \quad e_2: \langle \neg p, \top \rangle \quad w_1, e_1: p \quad w_2, e_2: \neg p$ w_1 : p
- **Communication action** inform2p for agent 1, informing agent 2 of p:

From the global perspective s_0 (given w_1 is the *actual world*):



- Agent 1 will be able to identify the actual world at run-time.
- ► $s_0 \models ((sense))K_1p$, but $s_0 \not\models K_1((sense))p$.
- $\blacktriangleright s_0 \models K_1 ((sense))(K_1 p \lor K_1 \neg p)$

From the perspective of agent 3 (using his associated local state/action):



- For agent 3, inform2p is indistinguishable to agent 1 informing agent 2 of $\neg p$.
- $\triangleright s_0 \otimes \text{sense} \models K_3((\text{inform2p}))p$, but $s_0 \otimes \text{sense} \nvDash ((\text{inform2p}))K_3p)$
- ► $s_0 \otimes \text{sense} \models K_3 ((\text{inform2p}))(K_2 p \lor K_2 \neg p)$

Cooperative Epistemic Planning Problem

- A Cooperative Epistemic Planning Problem consists of
- > An initial state s_0 , an action set A and a goal formula φ (see also [1])
- \blacktriangleright An owner function ω , determining the acting agent $\omega(a)$ for each action a

Solution Concepts

 \blacktriangleright Centralized Plan $a_1, a_2, \ldots, a_n \in A^n$, iff (concept from [1])

$s_0 \models ((a_1))((a_2)) \dots ((a_n))\varphi$

Issue: Owner of an action may not even know that the action is applicable, let alone that it makes **progress toward the goal**



 \blacktriangleright Implicitly-Coordinated Plan $a_1, a_2, \ldots, a_n \in A^n$, iff

$s_0 \models K_{\omega(a_1)}((a_1))K_{\omega(a_2)}((a_2))\dots K_{\omega(a_n)}((a_n))\varphi_q$

The owner of the first action a_1 knows that a_1 is initially applicable and will lead to a situation where the owner of the second action a_2 knows that a_2 is applicable and will lead to a situation where... the owner of the nth action a_n knows that a_n is applicable and will lead to the goal being satisfied.

- Allows the agents to self-coordinate implicitly during the plan execution **Forward search** using product updates, **shifting perspective** in each step We generalized this concept also for conditional plans
- Wait for Bob announcing Eve's true card

Conclusion and Future Work

- Synthesis of epistemic plans, with coordination as part of the plan
- Practical Issues: Scheduling & livelock avoidance
- Applications, e.g., in Human-Robot Collaboration

[1] Thomas Bolander and Mikkel Birkegaard Andersen. Epistemic planning for single and multi-agent systems. Journal of Applied Non-Classical Logics, 21(1):9–34, 2011. [2] Hans van Ditmarsch. The Russian Cards Problem. Studia Logica, 75(1):31–62, 2003.