University of Udine Department of Mathematics, Computer Science and Physics

MODELLING MULTI-AGENT EPISTEMIC PLANNING IN ASP



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Chapter 1

Multi-Agent Epistemic Planning



Epistemic Reasoning

Reasoning not only about agents' perception of the world but also about agents' knowledge and/or beliefs of her and others' beliefs.



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Multi-agent Epistemic Planning Problem **bolander2011epistemic**

Finding plans where the goals can refer to:

- the state of the world
- the knowledge and/or the beliefs of the agents







Initial State

- Snoopy and Charlie are looking while Lucy is ¬looking
- No one knows the coin position.



Multi-Agent Epistemic Planning **An Example**



Goal State

- Charlie knows the coin position
- Lucy knows that Charlie knows the coin position
- Snoopy does not know anything about the plan execution





Given a set of agents

Belief formulae

where $\mathtt{ag}\in$, $\alpha\subseteq$

We use the operators $\mathsf{B}_{\mathtt{ag}}$ and C_α to model the beliefs and the common knowledge of the agents.

Given a set of agents

Belief formulae

We use the operators B_{ag} and C_{α} to model the beliefs and the common knowledge of the agents.

Properties of B_{ag} KD45 and S5 Axioms Given the fluent formulae ϕ , ψ and the worlds i, j BK $\mathsf{D} \neg \mathcal{R}_{\mathsf{i}} \bot$ $\mathsf{K} \ (\mathcal{R}_{\mathbf{i}}\varphi \wedge \mathcal{R}_{\mathbf{i}}(\varphi \implies \psi)) \implies \mathcal{R}_{\mathbf{i}}\psi$ BK. $T \mathcal{R}_{i} \varphi \implies \varphi$ 4 $\mathcal{R}_{i}\varphi \implies \mathcal{R}_{i}\mathcal{R}_{i}\varphi$ BK.

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K.

where $ag \in , \alpha \subseteq$

Chapter 2

Possibilities



- Introduced by Gerbrandy and Groeneveld Gerbrandy1997
- Used to represent multi-agent information change
- Based on non-well-founded sets



Possibility Gerbrandy1997

Let be a set of agents and ${\mathcal F}$ a set of propositional variables:

- A possibility u is a function that assigns to each propositional variable $l \in \mathcal{F}$ a truth value $u(l) \in \{0, 1\}$ and to each agent $ag \in a$ set of possibilities $u(ag) = \sigma$ (information state).

Intuitively ...

- The possibility u is a possible interpretation of the world and of the agents' beliefs
- $u(\mathsf{I})$ specifies the truth value of the literal I
- u(*ag*) is the set of all the interpretations the agent ag considers possible in u
- Representable with graphs: we will use graph terminology

Chapter 3

The action language $m\mathcal{A}^{\rho}$

We introduced the action language $m\mathcal{A}^{\rho}$ in **Fab20**

- Used to describe MEP problems
- Uses possibilities as states
- Actions preconditions: belief formulae





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 - Ontic: modifies some fluents of the world Charlie *opens* the box
 - Sensing: senses the true value of a fluent Charlie *peeks* inside the box
 - Announcement: announces the fluent to other agents Charlie *announces* the coin position







An execution of an action might change or not an agents' belief accordingly to her degree of awareness

Action type	Full observers	Partial Observers	Oblivious
Ontic	\checkmark		\checkmark
Sensing	\checkmark	\checkmark	\checkmark
Announcement	\checkmark	\checkmark	\checkmark

Chapter 4

PLATO



PLATO, ePistemic muLti-agent Answer seT programming sOlver:

- Declarative encoding in ASP of MEP
- Based on the language $m\mathcal{A}^{\rho}$
- Main components: *initial state generation*, *entailment*, *transition function*
- Exploits clingo's multi-shot capabilities Geb19
- Formal proof of correctness

PLATO ASP Encoding

Encoding possibilities

Let u be a possibility.

ASP encoding: possibilities

We encode u with the atom $possible_world(T_u, R_u, P_u)$, where:

- T_{u} tells us when u was created
- R_u is the *repetition* of u
- $\ensuremath{\mathtt{P}}_u$ is the numerical index of u

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ASP encoding: pointed possibility

If u is the possibility that represents the *real configuration* of the world, we encode it with the atom $pointed(T_u, R_u, P_u)$.

When the context is clear we will use $\textit{only} \ P_u$ instead of $(T_u, R_u, P_u).$

Encoding possibilities



Let u, v be two possibilities, let ag be an agent and let ${\bf F}$ be a fluent.

ASP encoding: information states

We encode $v \in u(ag)$ with the atom $believes(P_u, P_v, ag)$.

Encoding possibilities



Let u, v be two possibilities, let ag be an agent and let ${\bf F}$ be a fluent.

ASP encoding: information states

We encode $v \in u(ag)$ with the atom $believes(P_u, P_v, ag)$.

ASP encoding: interpretations

We encode u(F) = 1 with the atom $holds(P_u, F)$.





entails	(P,	F)	:- holds(P,F), fluent(F).
entails	(P,	neg(F))	:- not entails(P,F).
entails	(P,	and(F1,F2)	:- entails(P,F1), entails(P,F2).
entails	(P,	or(F1,F2))	:- entails(P,F1).
entails	(P,	or(F1,F2))	:- entails(P,F2).



entails	(P,	F)	:- holds(P,F), fluent(F).
entails	(P,	0())	:- not entails(P,F).
entails	(P,	and(F1,F2))	:= entails(P,F1), entails(P,F2).
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not_entails entails	(P1, (P,		<pre>:- not entails(P2,F), believes(P1,P2,AG). :- not not_entails(P,b(AG,F)).</pre>



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not_entails entails	(P1, (P,	c(AGS,F)) c(AGS,F))	:- not entails(P2,F), reaches(P1,P2,AGS). :- not not_entails(P,c(AGS,F)).

Let open be an ontic action such that

- It sets the fluent opened to true
- Only ?? and ?? are attentive





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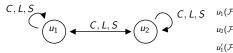


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 $pw(u'_i) := pointed(u_1), reaches(u_1, u_i, AGS), fully_obs(AGS).$ $(i \in \{1, 2\})$



 $C, L, S \quad u_{1}(\mathcal{F}) = \{\text{head, looking}_{Charlie}, \text{looking}_{Snoopy}\}$ $u_{2}(\mathcal{F}) = \{\text{looking}_{Charlie}, \text{looking}_{Snoopy}\}$ $u'_{1}(\mathcal{F}) = \{\text{opened, head, looking}_{Charlie}, \text{looking}_{Snoopy}\}$ $u'_{2}(\mathcal{F}) = \{\text{opened, looking}_{Charlie}, \text{looking}_{Snoopy}\}$



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 $\texttt{believes}(\mathbf{u}'_i, \mathbf{u}'_i, \texttt{AG}) := \texttt{pw}(\mathbf{u}'_i), \texttt{pw}(\mathbf{u}'_i), \texttt{fully_obs}(\texttt{AG}), \quad (i, j \in \{1, 2\})$ $believes(u_i, u_j, AG), pw(u_i), pw(u_j).$



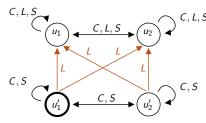
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$$\begin{split} C, L, S \quad u_1(\mathcal{F}) &= \{ \textit{head}, \textit{looking}_{\textit{Charlie}}, \textit{looking}_{\textit{Snoopy}} \} \\ u_2(\mathcal{F}) &= \{ \textit{looking}_{\textit{Charlie}}, \textit{looking}_{\textit{Snoopy}} \} \\ u_1'(\mathcal{F}) &= \{ \textit{opened}, \textit{head}, \textit{looking}_{\textit{Charlie}}, \textit{looking}_{\textit{Snoopy}} \} \\ u_2'(\mathcal{F}) &= \{ \textit{opened}, \textit{looking}_{\textit{Charlie}}, \textit{looking}_{\textit{Snoopy}} \} \end{split}$$

PLATO Transition function Sensing/Announcement actions

Let *peek* be an ontic action such that

- ?? senses the fluent heads
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Sensing/Announcement actions

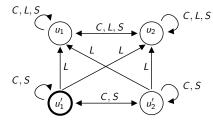
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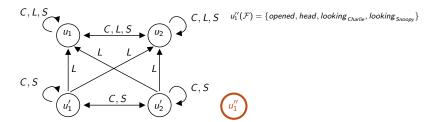


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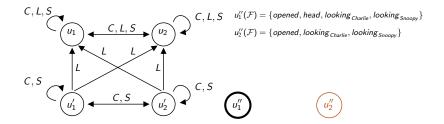




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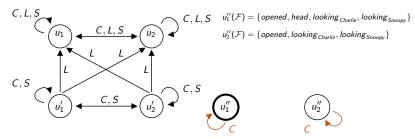
 $pw(u_2'') := pointed(u_1'), reaches(u_1', u_2', AGS), not_oblivious(AGS).$



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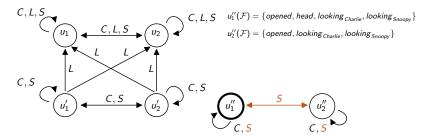


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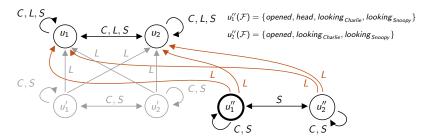
 $\begin{array}{lll} \texttt{believes}(\mathbf{u}''_i,\mathbf{u}''_j,\texttt{AG}):&=&\texttt{pw}(\mathbf{u}''_i),\texttt{pw}(\mathbf{u}'_j),\texttt{pw}(\mathbf{u}'_j),\texttt{pw}(\mathbf{u}'_j), & (i,j\in\{1,2\})\\ &&\texttt{believes}(\mathbf{u}'_i,\mathbf{u}'_j,\texttt{AG}),\texttt{partially_obs}(\texttt{AG}). \end{array}$



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Sensing/Announcement actions

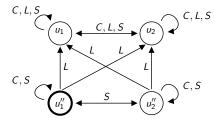
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PLATO Transition function

- Only ?? and ?? are attentive





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Let u,v be two possibilities and ψ be a belief formula.

Entailment correctness

For each u, we have that $\forall \ \psi \ \mathsf{u} \models_{\Phi} \psi$ iff $\mathsf{u} \models_{\Gamma} \psi$.

Initial state generation correctness

For each u, v such that u is the initial state in $m\mathcal{A}^{\rho}$ and v is the initial state in PLATO then $\forall \psi \ u \models_{\Phi} \psi$ iff $v \models_{\Gamma} \psi$.

Transition function correctness

Let a be an action instance. For each u, v such that $\forall \psi \ u \models_{\Phi} \psi$ iff $v \models_{\Gamma} \psi$, then $\forall \psi \ \Phi(a, u) \models_{\Phi} \psi$ iff $\Gamma(a, v) \models_{\Gamma} \psi$.

PLATO Results

Experimental evaluation



SC : $ \mathcal{AG} = 9, \mathcal{F} = 12, \mathcal{A} = 14$						
L	many	K-BIS	P-MAR			
4	.24	.24	.03	.007		
6	2.56	2.49	.16	.04		
8	36.79	38.34	4.23	.30		
9	204.52	146.343	5.79	.83		
10	TO	839.27	7.36	1.78		

Gr : $ AG = 3, F = 9, A = 24$							
L	Total	Ground	Solve	Atoms			
3	.97	.60	.36	28'615			
4	4.25	2.24	2.01	42'022			
5	32.83	2.52	30.31	71'482			
6	211.69	5.27	206.41	140'305			
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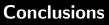
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	$\begin{bmatrix} \mathbf{C}\mathbf{C}_{-1} : \mathcal{A}\mathcal{G} = 2, \mathcal{F} = 10, \mathcal{A} = 16 \end{bmatrix}$			CC _2:	CC _2: $ \mathcal{AG} = 3, \mathcal{F} = 13, \mathcal{A} = 24$			
L	single	multi	K-BIS	P-MAR	single	multi	K-BIS	P-MAR
3	48.74	6.52	.08	.02	153.76	14.07	.13	.03
4	188.32	8.74	.16	.03	ТО	28.02	.54	.10
5	TO	7.68	1.14	.16	ТО	16.13	4.89	.60
6	1222.67	10.83	4.42	0.64	ТО	14.84	12.66	1.71
7	TO	30.08	16.06	2.61	TO	56.48	142.06	12.37

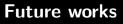
Chapter 5

Conclusions





- Exploited a declarative approach to implement Multi-Agent Epistemic Planning
- Improved readability and code maintenance
- Straightforward semantical adaptations
- Results comparable to the imperative approach
- Formal proof of correctness





- Enhancement of the entailment rules
- Implementation of heuristics
- Formal proof of equivalence between $m\mathcal{A}^*$ and $m\mathcal{A}^\rho$
- We are using PLATO to implement novel concepts in MEP, such as trust, lies and misconceptions

Conclusions Q&A The end





Thank You for the attention

References

References I

To the best of our knowledge ?? is the only *comprehensive* epistemic multi-agent planner.

Other planners with the best results in the literature are:

- ?? **muise2015planning**: translates into classical planning. Only deals with a finite level of nested beliefs.
- ?? huang2017general: does not support dynamic common knowledge.

- Assembly Line (AL): two agents are responsible for processing a different part of a product. They can fail in processing their part and inform the other of the status of her task. The agents decide to assemble the product or restart. Goal: the agents must assemble the product. We change the depth of the belief formulae.
- Coin in the Box (CB). n ≥ 3 agents are in a room. There is a closed box containing a coin. None of the agents know the coin position. One agent has the key. An agent may look inside the box to sense the state of the coin and also share the result.

Backup Slides Domains II

- Collaboration and Communication (CC). n ≥ 2 agents move along a corridor with k ≥ 2 rooms in which m ≥ 1 boxes can be located. Agents can determine if a certain box is in the room they are in. They can communicate information about the boxes' position. Agents may move only to adjacent rooms.
- ► Grapevine. n ≥ 2 agents are located in k ≥ 2 rooms. Each agent ag knows a "secret" (s_ag). Agents can move to an adjacent room and share their secret within the same room.
- ► Selective Communication (SC). n ≥ 2 agents within one of the k ≥ 2 rooms in a corridor. Agents can move to an adjacent room. In only one of the rooms, agents may acquire some information q and may communicate it to others.

Backup Slides Finitary S5 Theories

Finitary S5-theory son2014finitary

Let ϕ be a fluent formula and let $i \in AG$ be an agent. A *finitary* S5-*theory* is a collection of formulae of the form:

(*i*) ϕ (*ii*) $C \phi$ (*iii*) $C (B_i \phi \lor B_i \neg \phi)$ (*iv*) $C (\neg B_i \phi \land \neg B_i \neg \phi)$

Each fluent $f \in \mathcal{F}$ must appear in at least one of the formulae (*ii*)–(*iv*) (for at least one agent $i \in \mathcal{AG}$).

A finitary S5-theory has *finitely many* S5-models up to equivalence.

Given

- $\mathcal{AG} = \{??, ??, ??\}$
- $\mathcal{F}_{-} = \{\texttt{opened}, \texttt{head}, \texttt{looking}_{\texttt{ag}} \} \texttt{ag} \in \mathcal{AG}$

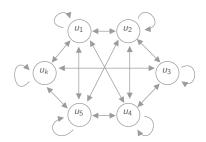


Given

- $\mathcal{AG} = \{??, ??, ??\}$
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Consider a formula of a finitary **S5** theory.



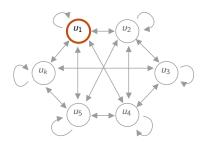
Formula type:

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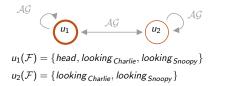
Formula type: (i) ϕ

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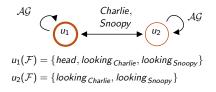
Formula type: (i) ϕ (ii) $C \phi$

Given

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Consider a formula of a finitary S5 theory.



Formula type: (i) ϕ (ii) $C \phi$ (iii) $C (B_i \phi \lor B_i \neg \phi)$

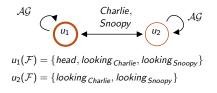
Formula: $C(B_{Lucy}head \lor B_{Lucy} \neg head)$

Given

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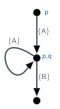
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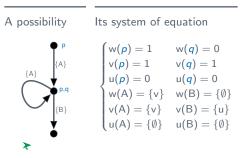
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Considering a possibility

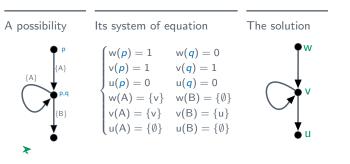
A possibility



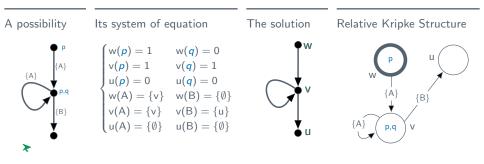
Considering a possibility Can be expressed as a *system of equations*



Considering a possibility Can be expressed as a *system of equations* Systems of equations have unique solutions



Considering a possibility Can be expressed as a *system of equations* Systems of equations have unique solutions The solution decorates a Kripke structure



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