Planning problems

ic Gossip

Observability-based knowledge

Epistemic planning

Encodings

# Multiagent epistemic planning

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The importance of reasoning about knowledge and belief

- S. Baron Cohen's False-belief-tasks (Sally-Ann Test, ...)
  - [S. Baron Cohen 1985]
    - https://www.youtube.com/watch?v=jbL34F81Rz0
    - https://www.youtube.com/watch?v=N6ylH-LYjOM
- typically fail the test:
  - children under 3
  - autistic children
- hypothesis: specific human capacity of reasoning about other agents' beliefs ('mind reading', 'theory of mind')
  - relevant for any interaction with a human being
  - specifically: planning future actions involving others
- epistemic reasoning = reasoning about knowledge and belief (large sense)

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Epistemic planning

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Challenge: robots with theory of mind [Milliez et al. 2014]

- at step 3, GREEN's beliefs become false
  - colored arrows = beliefs about white book position (red = robot)
  - colored spheres = reachability of an object for an agent









3

Planning problems

# Epistemic reasoning in planning

- single-agent planning
  - uncertainty about initial situation
  - uncertainty about action effects
  - sensing actions (alias knowledge producing actions)
  - $\Rightarrow$  contingent/conformant planning
- e multiagent planning
  - initial situation

. . .

first-order: I don't know whether p. second-order: I don't know whether you know that p. I know that you don't know whether p.

goal

first-order: I want to know whether p. second-order: I want to know whether you know that p. I want you to know that q.

third-order: ...

#### actions

• have epistemic effects: sensing, communication

# Problems, problems

- representation problems:
  - model 'expiry date' for knowledge/belief?
    - light in room x is on at time point T
    - *j* is in room *x* (so *j* believes that the light is on at *T*)
    - *j* leaves the room at *T*+1
    - at T' > T, does j still believe that the light in x is on?
  - higher-order belief revision?
  - simple integrations of epistemic and spatial reasoning?
  - $\Rightarrow$  to be solved in any application!
- reasoning problems:
  - epistemic reasoning is difficult
    - at least PSPACE (just as classical planning)
    - EXPTIME complete if common knowledge/belief involved
  - no 'epistemic planning's blocksworld' (yet)
  - no good benchmarks (yet)

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# Outline



- 2 States and goals: Epistemic Logic
- 3 Actions and plans: Dynamic Epistemic Logic
- 4 The simplest multiagent epistemic planning problem: gossiping
- Observability-based knowledge
- Epistemic planning with conditional effects

### Embeddings

# What's in a planning problem?

 $planning \ problem = \langle \texttt{init}, \texttt{goal}, \texttt{actionLaws} \rangle$ 

#### Iogical form of init: proposition

- proposition = set of states ('possible worlds')
- can be described in various logical languages:
  - propositional logic
  - epistemic logic
  - ...
- classical planning:

initial state =		a single possible world	
	=	a valuation of propositional logic	
		complete proposition	

- complete proposition
- Iogical form of goal: proposition
- Iogical form of actionLaws: action type
  - action type: arm-raising
  - action token: Paulo's raising of his right arm in room 7 of building 007 on Oct. 1, 2018 at 11:55:55



```
What's in an action?
```

• "something that has precondition and effects" [AI folklore]

action =  $\langle precond, effect \rangle$ 

precond = proposition

# What's in an action effect?

- STRIPS actions: effect = conjunction of literals
- however: an action type is instantiated in different circumstances ⇒ effects typically depend on these circumstances

...,

onditional effects:

$$\texttt{effect} = \{ \langle \textit{condition}_1, L_{1,1} \land \cdots \land L_{1,m_1} \rangle, \\$$

$$\langle condition_n, L_{n,1} \land \cdots \land L_{n,m_1} \rangle$$

- example: agent *i*'s action of flipping a switch  $precond(flip_i) = AtSwitch_i$  $effect(flip_i) = \{\langle \neg On, On \rangle, \\ \langle On, \neg On \rangle \}$
- what about epistemic effects?



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#### Embeddings

# Epistemic logic: language

- $K_i \varphi$  = "agent *i* knows that  $\varphi$ "
- grammar:

$$\varphi ::= p | \neg \varphi | \varphi \land \varphi | K_i \varphi$$

where p ranges over Prp and i over Agt

• first-order epistemic attitudes w.r.t. p:

K <sub>i</sub> p	K <sub>i</sub> ¬p	$\neg K_i p \land \neg K_i \neg p$

• second-order attitudes:

$K_i p \wedge K_i K_j p$	$K_i \neg p \land K_i K_j \neg p$	$(\neg K_i p \land \neg K_i \neg p) \land$
		$K_i(\neg K_jp \land \neg K_j \neg p)$
$K_i p \wedge K_i (\neg K_j p \wedge \neg K_j \neg p)$		$(\neg K_i p \land \neg K_i \neg p) \land$
		$K_i(K_j p \lor K_j \neg p)$
$K_i p \land (\neg K_i K_j p \land \neg K_i \neg K_j p)$		Ø

# Epistemic logic: possible worlds semantics

• knowledge explained in terms of possible worlds [Hintikka 1962]:

"agent *i* knows that  $\varphi$ " =  $\varphi$  true in every world that is possible for *i* 

- model  $M = (W, \{R_i\}_{i \in Agt}, V)$  with
  - W non-empty set of possible worlds
  - $R_i \subseteq W \times W$  accessibility relations
  - $V: W \longrightarrow 2^{\mathbf{Prp}}$  valuation
- *R<sub>i</sub>* is an equivalence relation (indistinguishability)
  - $R_i(w)$  = "set of worlds *i* cannot distinguish from *w*"
    - = "set of worlds compatible with i's knowledge"

#### • truth conditions:

$$\begin{array}{lll} M, w \Vdash p & \text{iff} & p \in V(w) \\ M, w \Vdash \neg \varphi & \text{iff} & \dots \\ M, w \Vdash \varphi \land \psi & \text{iff} & \dots \\ M, w \Vdash \mathcal{K}_i \varphi & \text{iff} & M, w' \Vdash \varphi \text{ for all } w' \in R_i(w) \end{array}$$

Epistemic logic: possible worlds semantics

muddy children puzzle, initial situation

$$\begin{array}{c|c}
1\overline{2} & \xrightarrow{R_2} & 12\\ R_1 & & \\ \hline R_1 & & \\ 1\overline{2} & \xrightarrow{R_2} & \overline{1}2\end{array}$$

(reflexive arrows omitted)

 $M, \mathbf{12} \Vdash m_1 \land m_2 \land K_1 m_2 \land \neg K_1 m_1 \land \neg K_1 \neg m_1$ 

Epistemic logic for epistemic planning?

- can be modeled:
  - init = formula of epistemic logic
  - goal = formula of epistemic logic
- cannot be expressed:
  - actionLaws



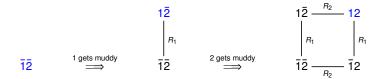
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### Embeddings

## Muddy children: Episode 1

- initially, common knowledge that nobody is muddy
- I gets muddy but isn't sure; 2 watches
- 2 gets muddy but isn't sure; 1 watches



# Dynamic epistemic logic DEL

 idea: model uncertainty about *current event* by introducing possible events

uncertainty about world	uncertainty about event	
possible worlds	possible events	
indistinguishability of worlds	indistinguishability of events	

- $\Rightarrow$  'possible event models'
- distinguish agents who observe from agents who don't N.B.: an agent typically observes only very few events
- muddy children: event model where 1 plays, 2 watches

$$skip_1 - getsMuddy_1$$

(reflexive arrows omitted)



#### DEL: event models

- $EM = (E, \{S_i\}_{i \in Agt}, precond, effect)$  event model, where
  - E is a nonempty set of events
  - $S_i \subseteq E \times E$ 
    - every S<sub>i</sub> is an equivalence relation
    - $eS_i f = "i$  perceives occurrence of e as occurrence of f"
  - precond :  $E \longrightarrow Fmls$
  - effect :  $E \longrightarrow Fmls$  s.th. effect(e) conjunction of literals (just as in STRIPS)

### DEL: product construction

• update world model WM = (W, R, V) by event model EM

 $WM \otimes EM = WM'$ 

where

# DEL for epistemic planning?

- explored since >5 years [Bolander&Anderson 2011]; [Löwe, Pacuit&Witzel 2011]; [Aucher, Maubert&Pinchinat 2014]; [Yu, Li&Wang 2015],...
  - init = formula of multiagent epistemic logic
  - goal = formula of multiagent epistemic logic
  - action type = agent + event model
- reasoning: not so easy
  - plan existence undecidable in general [Bolander&Anderson 2011]; [Aucher&Bolander 2013];

[Charrier, Maubert&Schwarzentruber 2016]

- decidable fragments: heavily restricted [Yu, Wen&Liu 2013]; [Bolander et al. 2015],...
- world models typically grow exponentially when updated
- representation: some problems that seemingly went unnoticed...

# DEL for epistemic planning: problems

- event models rather describe action tokens
- actionLaws describe types, not tokens
- how to describe conditional effects?
  - list all possible cases of perception of the actual event
  - infinitely many conditional effects needed
- conditional effects of getMuddy(i):

```
(\top, m_i)
(inGarden<sub>j</sub>, K<sub>j</sub>m<sub>i</sub>)
(K<sub>i</sub>inGarden<sub>j</sub>, K<sub>i</sub>(K<sub>j</sub>m<sub>i</sub> \lor K<sub>j</sub>\negm<sub>i</sub>))
(K<sub>j</sub>K<sub>i</sub>inGarden<sub>j</sub>, ...)
```

```
(CK_{i,j}inGarden_j, CK_{i,j}(K_jm_i \lor K_j \neg m_i))
```

⇒ event model with an infinite number of points!
even when finite, event models have to be big



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### Embeddings

# Planning problems Epi. Logic Oyn. Epi. Logic Ooco Gossip Observability-based knowledge Epistemic planning cocoo

# The gossip problem

- [Baker&Shostak, Discrete Mathematics 1972]
- *n* friends
- each friend *i* has a secret  $\Sigma_i$
- two friends can call each other to exchange all the secrets they know
- how many calls to spread all secrets among all friends?



# Planning problems Epi. Logic Oyn. Epi. Logic Oocooco Oocooco Oocooco Oocooco Deservability-based knowledge Epistemic planning oocooco

# The gossip problem

- relevant for distributed database, social networks, disease spreading, ...
- hot topic in the DEL community
- different kinds of protocols; here:
  - complete graph
    - other graphs:
      - [Cooper et al., Discrete Maths, to appear]
  - centralized protocol
    - distributed variants:

[Apt et al., TARK 2016; IJCAI 2017] [van Ditmarsch et al., LOFT 2016]

#### • paradigmatic epistemic planning problem?

'multiagent planning's blocksworld'



# The gossip problem: solution

• initial state: 
$$\left(\bigwedge_{1 \le i \le n} K_i \Sigma_i\right) \land \left(\bigwedge_{1 \le i, j \le n, j \ne i} \neg K_i \Sigma_j\right)$$

• goal: shared knowledge ('everybody knows')

$$\mathsf{EK} \ \mathsf{AllSecrets} = \bigwedge_{1 \leq i \leq n} \mathsf{K}_i \Bigl(\bigwedge_{1 \leq j \leq n} \mathsf{\Sigma}_j \Bigr)$$

- naive algorithm: 2(*n*-1) calls
- optimal algorithm:

friends	calls
2	1
3	3
4	4
5	6
6	8
÷	:
<i>n</i> ≥ 4	2( <i>n</i> –2)



# The gossip problem: attaining higher-order shared knowledge

• attain shared knowledge of level k:

EK ··· EK AllSecrets

k times

N.B.: impossible to obtain common knowledge (cf. Byzantine Generals)

• algorithm with calls to attain shared knowledge of order *k* 

[Herzig&Maffre, AI Commun. 2017]

friends	calls for $k=1$	calls for $k=2$	
2	1	1	
3	3	4	
4	4	6	
÷			÷
$n \ge 4$	$2 \times (n-2)$	3×( <i>n</i> -2)	

- for  $n \ge 4$  and  $k \ge 1$ :  $(k+1) \times (n-2)$  calls
- optimal [Cooper et al., ECAI 2016; Discrete Maths, to appear]

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### Embeddings

# Grounding knowledge on propositional observability

agent *i* observes whether propositional variable *p* is true

- originates in model checking distributed systems (MOCHA)
  - Iogic:

[v.d.Hoek&Wooldridge, AIJ 2005; v.d.Hoek et al., AAMAS 2011]

• derive indistinguishability relation:

 $R_i = \{(s, s') : s(p) = s'(p) \text{ for every } p \in PVar \text{ observed by } i\}$ 

- interpret epistemic operator in Kripke model (2<sup>PVar</sup>, R,id)
- compact models
  - valuations of classical propositional logic
    - visibility information: subset of Agt × Prp
- 'anti-Hintikka'
  - grounded on origins of knowledge (what we know comes from observation + communication)

### Propositional observability: properties

*i* observes *p* iff  $K_i p \vee K_i \neg p$  true

- all axiom schemas of S5 valid
- plus some more:
  - ③ distributes over disjunction:

 $K_i(p \lor q) \leftrightarrow (K_i p \lor K_i q)$ 

S who observes what is common knowledge:

$$(K_i p \lor K_i \neg p) \to K_j (K_i p \lor K_i \neg p)$$
$$\neg (K_i p \lor K_i \neg p) \to K_j \neg (K_i p \lor K_i \neg p)$$

 $\Rightarrow$  not appropriate for gossipping!

### Higher-order observability

- idea: introduce higher-order visibility atoms
  - $S_i p = "i \text{ sees the value of } p"$   $S_i S_j p = "i \text{ sees whether } j \text{ sees the value of } p"$  $S_i S_j S_k p = "..."$

• intuitively:

$$K_{i}p \leftrightarrow p \land S_{i}p$$

$$K_{i}\neg p \leftrightarrow \neg p \land S_{i}p$$

$$K_{i}K_{j}p \leftrightarrow K_{i}(p \land S_{j}p)$$

$$\leftrightarrow K_{i}p \land K_{i}S_{j}p$$

$$\leftrightarrow p \land S_{i}p \land S_{j}p \land S_{i}S_{j}i$$

Planning problems	Epi. Logic	Dyn. Epi. Logic	Gossip	Observability-based knowledge	Epistemic planning	Encodings
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### Language

• grammar:

$$\varphi ::= \sigma p \mid \neg \varphi \mid \varphi \land \varphi \mid K_i \varphi$$

where  $\sigma p$  is a visibility atom

- $\sigma$  = sequence of visibility operators S<sub>i</sub>
- *p* = propositional variable
- propositional variables are special cases:  $\sigma$  empty

# States

#### state s = set of visibility atoms

• initial gossip state (supposing all secrets are true)

$$\mathbf{s}_0 = \{\Sigma_1, \ldots, \Sigma_n\} \cup \{S_1 \Sigma_1, \ldots, S_n \Sigma_n\}$$

• define indistinguishability relations as before:

 $sR_is'$  iff  $\forall \alpha$ , if  $S_i \alpha \in s$  then  $s(\alpha) = s'(\alpha)$ 

- problem: reflexive, but neither transitive nor symmetric
  - ØR<sub>i</sub>s for every s
  - $not(sR_i\emptyset)$  as soon as  $p \in s$  and  $S_i p \in s$
- s must be introspective
  - contains all observability atoms of form  $\sigma S_i S_i \sigma' p$ , for all *i*
- properties of introspective states:
  - R<sub>i</sub> equivalence relations
  - who observes what no longer common knowledge
    - $S_i p \rightarrow S_j S_i p$  invalid
    - $S_i p \rightarrow K_j S_i p$  invalid
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- normal form: replace  $\sigma S_i S_i \sigma' p$  by  $\top$  (introspectively valid)

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## Conditional actions

- conditional action a = (pre(a), eff(a)) where:
  - pre(a) proposition
  - *eff*(*a*) set of conditional effects; in particular:
    - add observability atoms
    - delete observability atoms
- example:

• conditional action  $a \Rightarrow$  transition relation between states  $R_a$ 



### Conditional actions: normal form

- a = (pre(a), eff(a)) is in normal form iff
  - pre(a) in normal form
    - no introspectively valid  $\sigma S_i S_i \sigma' p$
    - every conditional effect  $ce \in eff(a)$  in normal form
  - no conflicting effects
- every action can be put in normal form



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    - 2 every conditional effect  $ce \in eff(a)$  in normal form
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## Planning tasks

#### • planning task = (Act, s<sub>0</sub>, goal) where

- Act is a finite set of actions
- s<sub>0</sub> finite state (the initial state)
- $goal \in Fmls_{bool}$
- is in normal form iff

. . .

• is solvable if there is a state s such that

$$s_0 \left( \bigcup_{a \in Act} R_a \right)^* s$$

$$s \models \text{goal}$$



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# Extending the logic by assignment programs

 extend logic of observability-based knowledge by assignment programs

$$\varphi ::= \sigma p \mid \neg \varphi \mid \varphi \land \varphi \mid K_i \varphi \mid [\pi] \varphi$$
$$\pi ::= +\sigma p \mid -\sigma p \mid \pi; \pi \mid \pi \sqcup \pi \mid \pi^* \mid \varphi?$$

• call = program:

$$call_{j}^{i} = ((K_{i}\Sigma_{1} \lor K_{j}\Sigma_{1}?; +S_{i}\Sigma_{1}; +S_{j}\Sigma_{1}) \sqcup \neg (K_{i}\Sigma_{1} \lor K_{j}\Sigma_{1})?);$$
  
...;  
$$((K_{i}\Sigma_{n} \lor K_{j}\Sigma_{n}?; +S_{i}\Sigma_{n}; +S_{j}\Sigma_{n}) \sqcup \neg (K_{i}\Sigma_{n} \lor K_{j}\Sigma_{n})?)$$

• For initial gossip state *s*<sub>0</sub>:

$$\begin{split} s_{0} &\models \left[ \mathsf{call}_{2}^{1}; \mathsf{call}_{4}^{3}; \mathsf{call}_{6}^{5}; \mathsf{call}_{3}^{1}; \mathsf{call}_{5}^{4}; \mathsf{call}_{6}^{1}; \mathsf{call}_{4}^{2}; \mathsf{call}_{5}^{3} \right] \textit{EK AllSecrets} \\ s_{0} &\models \left( \left( \bigsqcup_{1 \leq i, j \leq 6} \neg \mathsf{S}_{i} \, \Sigma_{j}?; \mathsf{call}_{j}^{i} \right)^{6} \right) \textit{EK AllSecrets} \\ s_{0} &\models \left[ \left( \bigsqcup_{1 \leq i, j \leq 6} \neg \mathsf{S}_{i} \, \Sigma_{j}?; \mathsf{call}_{j}^{i} \right)^{5} \right] \neg \textit{EK AllSecrets} \end{split}$$

Encodings

# Embedding and complexity

#### Theorem

A planning task (Act,  $s_0$ , goal) in normal form is solvable iff

$$s_0 \models ig (igsqcup s_{a \in Act} execAct(a)ig)^*ig)$$
goal

where execAct(a) encodes action a as a dynamic logic assignment program

(involves storing values of variables to trigger conditional effects correctly)

- proof of correctness of gossip algorithms in the logic
  - base case and induction step are theorems of the logic

#### Theorem

Deciding the solvability of an planning task is PSPACE-complete

# Encoding into PDDL

• formulas:

$$tr_{PDDL}(S_{i_1}...S_{i_m}p) = \begin{cases} (p) & \text{if } m = 0\\ (S-m \text{ i1 } ... \text{ im } p) & \text{otherwise} \end{cases}$$
$$tr_{PDDL}(\neg \varphi) = (\text{not } tr_{PDDL}(\varphi))$$
$$tr_{PDDL}(\varphi_1 \land \varphi_2) = (\text{and } tr_{PDDL}(\varphi_1) & tr_{PDDL}(\varphi_2)) \end{cases}$$

o conditional effects of actions:

(when 
$$tr_{PDDL}(cnd(ce))$$
  
(and  $tr_{PDDL}(\alpha_1) \dots tr_{PDDL}(\alpha_m)$   
(not  $tr_{PDDL}(\beta_1)) \dots$  (not  $tr_{PDDL}(\beta_\ell)$ )))

experiments with FDSS-2014

[Röger et al., Int. Planning Competition 2014]

- variants of the gossip problem
  - shared knowledge of order k; negative goals
- exam problem
  - teacher has prepared exam and keeps printout in his office
  - student's goal:  $S_{student} ex \land \neg S_{teacher} S_{student} ex$

# Conclusion (1)

• knowledge representation with DEL event models:

- art rather than craft
- practical problems
- conceptual problems (type vs. token)
- the other agents' observation should be based on information from the possible worlds model, not from the possible event model
  - edge-conditioned event models [Bolander, 2015]
  - special propositional variable "agent *i* is watching" [Bolander et al., JoLLI 2016]
    - part of the state, not part of the action!

# Planning problems Epi. Logic Dyn. Epi. Logic Gossip Observability-based knowledge Epistemic planning Encodings 0000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000 000000

# Conclusion (2)

- a simple epistemic planning problem: gossip
- a simple dynamic epistemic logic based on visibility
  - captures epistemic planning problems
  - in PSPACE (even with common knowledge)
  - can be mapped to classical planning
- related work
  - public actions only [Kominis&Geffner, ICAPS 2015; 2018]
  - public announcements

[v.Benthem et al., LORI 2015], [Charrier et al., KR 2016]

- boolean games [H. et al., IJCAI 2016]
- future work
  - from knowledge to belief?

