

# Knowledge and some real-life problems



# Knowledge in Multi-Agent Systems (MAS)

- **MAS** is any collection of interacting agents (“muddy children”, poker game, distributed system running according to some protocol, ...)
- Description of MAS has to focus on few details the agents need to work with when following the protocol – this is the **language** used by the agents
- At any point of time each agent is in some state – agent’s **local state**

## Local state of the poker player (Ag1) :

- Cards Ag1 is holding.
- Bits made by the other players.
- Any cards Ag1 has seen during the game.
- Additional information (e.g. the strategy of some other players, namely A likes to bluff, P is conservative, ...)

# Knowledge in Multi-Agent Systems (MAS)

- At any point of time the whole MAS is in some state – system's **global state**. How this can be represented? Can it be a list of local states of all agents?

In case of *a message passing system* it is important to know how the communication channels work. This information is not provided in local state of any agent!

We need to consider **environment**, too - it describes everything relevant what is not part of local states of agents..

- The system's **global state** is a **list of local states of all the agents + local state of the environment**, namely

$$\langle s_e, s_1, s_2, \dots, s_n \rangle$$

- Time development and changes of the system are described as a **function from time to  $\mathcal{G}$**  (set of all global states) and referred to as a **run**.

# Knowledge in Multi-Agent Systems (MAS)

- **Terminology:** Let  $\mathbf{r}$  be a run and  $\mathbf{m}$  a specific time, then the **point**  $(\mathbf{r}, \mathbf{m})$  is the global state  $\mathbf{r}(\mathbf{m}) = \langle s_e, s_1, s_2, \dots, s_n \rangle$  and  $r_i(\mathbf{m}) = s_i$  is the local state of the agent  $i$ ,  
 $r_e(\mathbf{m}) = s_e$  is the local state of the environment.
- A MAS **system**  $\mathcal{R}$  over the set  $\mathcal{G}$  of global states is a set of runs over  $\mathcal{G}$ .  
*In practice, the appropriate set of runs is chosen or specified by the system designer.*
- For using the language  $\mathcal{L}$  in the **system**  $\mathcal{R}$  we need to have its interpretation for any global state. This is provided by an interpreted system  $\mathcal{I}$  consisting of a pair  $(\mathcal{R}, \pi)$ , where the function  $\pi: \mathcal{G} \times \mathcal{L} \rightarrow \{\text{true}, \text{false}\}$

# Knowledge in Multi-Agent Systems (MAS)

- **Terminology:** Let us consider two global states

$$\mathbf{s} = \langle s_e, s_1, s_2, \dots, s_n \rangle \text{ and}$$

$$\mathbf{w} = \langle w_e, w_1, w_2, \dots, w_n \rangle.$$

- The global states  $\mathbf{s}$  and  $\mathbf{w}$  are **not distinguishable** for the agent  $i$  (denoted as  $\approx_i$ ) if this agent's local state in both  $\mathbf{s}$  and  $\mathbf{w}$  is identical, ie.  $s_i = w_i$ ,
- Knowledge in an interpreted system  $\mathcal{I} = (\mathcal{R}, \pi)$  with  $n$  agents excluding the environment, is defined through a Kripke structure  $(\mathbf{S}, \pi, K_1, K_2, \dots, K_n)$ , where
  - $\mathbf{S}$  is the set of all points in the interpreted system  $\mathcal{I}$  and
  - the admissibility relation  $K_i$  is specified by  $\approx_i$

## Knowledge base

is a system *gradually receiving information about its environment* that is supposed to *answer some queries*.

Let *the knowledge base KB* be one of the agents in a larger system, where at least the following agents are present:

- *Environment* is an agent representing the model of the external world.

- *Teller* is the agent telling the *KB* the facts about the external world.

*Environment's state* is expected to contain complete description (of the relevant features) of the external world.

*Local state of KB* describes information the *KB* has obtained about the external world up to now.

*Local state of Teller* contains all he knows about „the external world“ + „the knowledge up to now provided to *KB*“ ...



This informal description of ***KB*** is still rather vague – it offers many possibilities for modelling the global states.

**The simplest choice could be based on the following constraints:**

- The external world can be described using a set of primitive propositions  $\Phi$ .
- The external **world is *stable***, ie. the truth values of the primitive propositions about the external world do not change in time.
- The ***Teller*** has ***full information*** about the external world.
- All information ***stored in KB*** is ***valid***.
- There is ***no a priori knowledge*** about the external world or about the content of ***KB***.



For simplicity let us assume, that

- The **external world** can be described by an **evaluation  $\alpha$**  of primitive propositions from  $\Phi$  (and this evaluation  $\alpha$  remains fixed!).
- The **Teller** has access to the evaluation  $\alpha$  and to the sequence of facts, he has provided as input into ***KB*** so far.
- ***KB***'s **local state** contains the sequence  $A_1, \dots, A_n$  of formulas provided by the **Teller** as input (the formulas  $A_i$  could be either ***propositional or modal formulas***).
- **Global state** is denoted by  $(\alpha, \langle A_1, \dots, A_n \rangle, .)$



1.

***KB*** that stores **propositional formulas, only!**

ie. ***KB*** stores ***propositional formulas*** created from the set  $\Phi$  of primitive propositions.

- The ***queries*** posed to (subjected to) ***KB*** have the form of propositional formulas created from propositions  $\Phi$ .
- All formulas ***stored*** in ***KB*** are ***true*** under the evaluation  $\alpha$ .
- There are no ***a priori assumptions*** about the external world and about information provided by the ***Teller*** to ***KB***.

These assumptions represent the constraints that will be used to construct the corresp. Kripke str.

Let  $I^{kb}$  describe gradual addition of information into the ***KB*** in the form of a sequence  $r$  of the global states. Let us define

$(I^{kb}, r, m) \models K_{KB}\varphi$  iff  $\varphi$  holds in **all the time points** ***KB*** cannot distinguish from  $(r, m)$  (they represent, summary of what ***KB*** has been told up to now“).

## How the $KB$ should answer a query $B$ ?

Assuming that  $KB$  remembers **conjunction of all information provided up to now.**

### Choice a)

Suppose  $KB$  is asked at a certain moment  $(r,m)$  the query  $B$ , where  $B$  is a propositional formula. Our knowledge base has no access to the external world – that is why  $B$  cannot be interpreted as a query about the external world: *to be fully correct* one should interpret the query  $B$  as a question „What the  $KB$  knows about the external world, ie.  $K_{KB}(B)$ ?“.

The KB should answer this question as follows

YES	if $(I^{kb}, r, m) \models K_{KB} B$
NO	if $(I^{kb}, r, m) \models K_{KB} \neg B$
Do Not Know	else

## Choice b)

Suppose  $KB$  is in the local state

$\langle A_1, \dots, A_k \rangle$ , denote  $\kappa = A_1 \wedge \dots \wedge A_k$

and let the knowledge base know everything what is a consequence of  $\kappa$ .


In such a case the query  $B$  can get a positive answer in 2 cases:

YES iff  $\left\{ \begin{array}{l} B \text{ is a consequence of } \kappa \\ \text{or} \\ K_{KB} B \text{ is a consequence of } K_{KB} \kappa \end{array} \right.$

Analogous solution for the negative answer to the query  $B$ :

NO iff  $\left\{ \begin{array}{l} \neg B \text{ is a consequence of } \kappa \\ \text{or} \\ K_{KB} \neg B \text{ is a consequence of } K_{KB} \kappa \end{array} \right.$

DoNotKnow in all remaining case.



If **KB** contains only propositional formulas about the external world and no facts about **KB** itself, then the answers to propositional queries are the same for both choices a) and b):

### **KB theorem 1.**

Let us assume that KB contains propositional formulas only, ie.

$$r_{KB}(m) = \langle A_1, \dots, A_k \rangle, \quad \kappa = A_1 \wedge \dots \wedge A_k$$

and  $B$  is a propositional formula.

In this case the following are **equivalent**

(i)  $(I^{kb}, r, m) \models K_{KB} B$

(ii)  $\kappa \rightarrow B$  is a propositional tautology

(iii)  $M_n^{rst} \models K_{KB} \kappa \rightarrow K_{KB} B$

2.

## What happens if the query is not limited to **propositional formulas** ?

Let us consider a query  $B \equiv (p \rightarrow K_{KB}p)$

"Is it the case, that if  $p$  holds then  $KB$  knows it?"

How the answer for the query  $B$  should be obtained? Here, it seems reasonable to apply the choice a) used earlier which suggests the answer to  $B$  as follows:

YES	if $(I^{kb}, r, m) \models K_{KB}B$
NO	if $(I^{kb}, r, m) \models K_{KB}\neg B$
Do Not Know	else

What do we know about validity of  $K_{KB}(p \rightarrow K_{KB}p)$ ? (1)

According to **Mod\_T8 a**, **Mod\_T8b** we know that  $K_{KB}(p \rightarrow K_{KB}p)$  is equivalent to the formula  $K_{KB}p \vee K_{KB}\neg p$  (2)

Now, we are ready to answer the query  $B = (p \rightarrow_{K_{KB}} p)$  by considering the equivalent transcriptions

1.  $K_{KB} (p \rightarrow_{K_{KB}} p) = K_{KB} p \vee K_{KB} \neg p$  (see Mod\_T8)
2.  $K_{KB} \neg(p \rightarrow_{K_{KB}} p) = K_{KB} (p \ \& \ \neg K_{KB} p)$

We have proven earlier in **Mod\_T7** that the formula  $K_{KB} (p \ \& \ \neg K_{KB} p)$  is contradictory (and thus it cannot be proven)!  
Consequently, the query  $B$  can never result in the answer NO!

To answer the query  $B = (p \rightarrow_{K_{KB}} p)$  let us consider the equivalent transcription  $K_{KB} (p \rightarrow_{K_{KB}} p) = K_{KB} p \vee K_{KB} \neg p$ . Thus the answer is

YES                      if  $p$  or  $\neg p$  is a consequence of  $KB$  content  
Do Not Know        else.

## 2. Database with nonpropositional input


3.

Does it make sense to provide *KB* with input described by non-propositional formulas ?

Let us assume, that *KB* has current information represented by a sequence of formulas  $\langle F_1, \dots, F_i \rangle$  and the next provided information is  $F_{i+1} = (p \rightarrow K_{KB} p)$  saying „if *p* is valid, *KB* knows it“.

This information can be useful, if *KB* can verify what it knows and what it does not know. If there holds  $\langle F_1, \dots, F_i \rangle \vdash \neg K_{KB} p$ , then *KB* can deduce from the input  $F_{i+1}$  that *p* does not hold.

This shows that thanks to the non-propositional input the *KB* can gain (derive) **new information about the external world** using **introspection**.



If KB obtains non-propositional input, its knowledge can **no more be represented as a *conjunction of the input sequence*** (as in the propositional case).

Let us explain this using an *example situation*, when the provided input represents a claim, that

- has been true at the moment of input,
- does not remain true in any later time point.

Under such conditions it is impossible to describe knowledge in the form of *conjunction of provided input*. *Why?*

We will show an example in which the considered conjunction results in a contradiction (from which anything can be derived) !



*Example:* Assume  $KB$  obtains as input a fact, that

- is true in the current moment,
- but it does not remain valid in any possible future state.

Let the primitive proposition  $p$  about the external world be valid, but the  $KB$  does not know  $p$  yet (until the tact  $j$  no such information has been provided). In such a situation there must hold

$$p \ \& \ \neg \ K_{KB}p \quad (3)$$

This can be provided by the *Teller* in the tact  $j+1$ . But even given this information (3), we cannot claim that  $KB$  knows (3), ie. the formula  $K_{KB}(p \ \& \ \neg \ K_{KB}p)$  holds in the next time point. **Why? This is impossible** since this formula contradicts **S5** ie.  $(K_n + Ax3 + Ax4 + Ax5)$ .

But even in this case, the  $KB$  should gain some knowledge, namely  $K_{KB}p$  should hold after the  $KB$  has been told  $p \ \& \ \neg \ K_{KB}p$


$$p \ \& \ \neg \ K_{KB} p \quad (3)$$

We have learned already through the analysis of the formula (3) that *obtaining* information  $\varphi$  does not have to result in a situation when the  $KB$  knows it (there holds  $K_{KB} \varphi$ ).

Intuitively, the  $KB$  should gain some knowledge after it has been told (3) : *it should know, that  $p$  is true! Consequently input of (3) should result in  $K_{KB} p$ .*

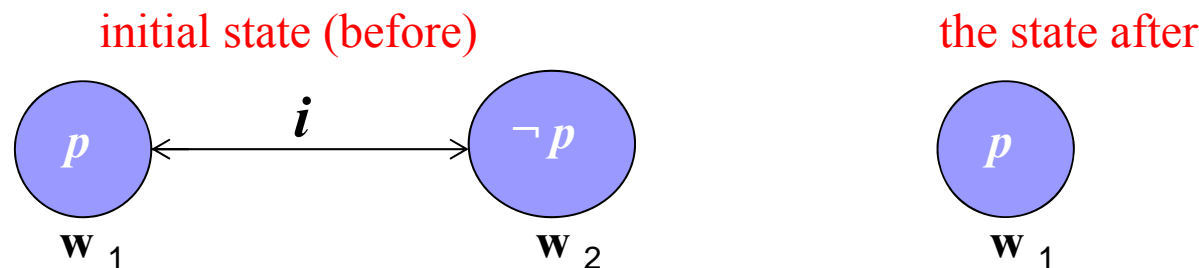
How to make this intuition true? *The knowledge base cannot treat modal formulas in the same way as the propositional formulas!*

A new approach has to be designed. The viable solution is based on **modal logics!**

# Common knowledge

Does a **public announcement** result in common knowledge ever ?

- Suppose you tell to Mr.  $i$  : „*You do not know it, but I have to tell you that you have some bug on your back.*“
- Let us abbreviate the claim „*You have some bug on your back .*“ by  $p$  and let  $\gamma$  for the formula  $\neg K_i p \ \& \ p$



In the initial state it is obvious, that  $K_i \gamma$  does not hold in the state  $w_1$ . Consequently, it cannot be the case that  $C \gamma$  holds initially! On the other hand  $C \gamma$  holds in the state „after“.



# Common knowledge in ASMP

(asynchronous message passing systems)

Asynchronous sending of messages

- Let us denote  $\alpha$  a fact that describes agent's 1 knowledge in time 0: „*Agent 2 did not obtain any message from me, yet.*“ It must be the case that  $K_1 \alpha$  holds in the time 0.
- Agent 1 sends a message „*Hello.*“ to the agent 2.
- This act of **sending a message results in a loss of certain knowledge**, namely  $K_1 \alpha$  cannot be true any more !

It can be shown that there is a close connection between common knowledge and synchronization of agent's activities!



# Communication and common knowledge

**Let us consider 2 generals, who communicate by sending letters through human messengers:** When can they be sure that both their armies can attack jointly (in coordinated way)?

Common knowledge is closely related to **communication means used in the system**. It can be proven, that in an asynchronous system no new knowledge or common knowledge can be gained through **sending messages**:

**Theorem:** For any structure  $S$  and any formula  $\psi$  there holds that during in any time development of this system (described by a run  $r$ ) and at any instant  $m$  :

$$(S, r, m) \models C_G \psi \text{ if and only if } (S, r, 0) \models C_G \psi$$

# Recommended resources

- Modal logic

Ronald Fagin, Joseph Y. Halpern, Yoram Moses, Moshe Y. Vardi:  
*Reasoning About Knowledge*, MIT Pres 1995, 2003

- Temporal logic

Michael Fisher: *Introduction into Formal Methods Using Temporal Logic*,  
John Wiley & Sons, 2011

- Modal and temporal logics

Chapter 8 in the volume *Umělá inteligence(6)*, Academia 2012

FIRST PhD Autumn School on Modal Logic, November 10-11 2009,  
materials from the courses *Temporal Logics for Specification and  
Verification* (V. Goranko), *Computational Modal Logic* (C. Areces, P.  
Blackburn), <http://hylocore.ruc.dk/m4m6school.html>