## **Advanced Human Machine Interactions**

## Introduction to multi-agent systems and autonomous agents

### **Alexandre Pauchet**

INSA Rouen – Département ASI BO.B.RC.18, alexandre.pauchet@insa-rouen.fr

## Introduction



The field of Multi-Agent Systems (MAS) appeared in the 80's, thanks to the fusion of several disciplines

It is not (only)

- a language
- standards
- an architecture
- a method...

...but a group of features and characteristics allowing the development of systems with some properties (distributed, adaptive, flexible, 'smart', ...)

In an effort to follow modern IT evolution...

## Systems and communication

• Évolution de l'informatique vers le « Pervasive Computing » (informatique diffuse)





Large scale systems that must adapt to dynamic environments, interacting with humans on a regular basis.

## **Artificial Intelligence**

### **Statistical approach**

- Formal neural nets
- Multi-layer perceptron

### Symbolic approach

- Turing test, ELIZA
- Lisp, Prolog, ...
- Expert systems (Mycin, ...)

Rise of **distributed** AI and **collective intelligence** to solve more and more **complex** problems, subject to **uncertainties** and **incomplete knowledge** 

## What is an agent? (according to Sycara)

An **agent** is "a software system whose main features are its situated nature, autonomy, adaptativeness and sociability."

- Situated nature : sensory input => actions modifying the environment
- Autonomy : controls its actions and its internal state
- Adaptability : allows agents to
  - React in a flexible way
  - Take initiatives towards a goal
  - Learn
- **Sociability** : interaction with other agents

## MAS definition (according to Ferber)

### A MAS is made up of:

- an **environment** *E*
- a **set of situated objects** *O* (*a position into E is associated with them*)
- **a set of agents** A (A included into O ; they are active compared to other passive objects of O)
- a set of relations *R* uniting objects
- a set of operations *Op* allowing agents *A* to perceive and manipulate objects in *O*
- operators representing the application of those operations and the world reaction to the resulting modification attempts (called the universe laws)

## Computer science, AI and MAS

### A few definitions

- A software agent is computer system capable of acting autonomously to achieve its own goal
- A *multi-agent system* is made up of software agents **interacting** in a physical or virtual **environment**
- An *heterogeneous MAS* (or a *mixed community*) is a system made up of software agents interacting with human agents.

### **Application fields**

- Distributed solving of problems
- Modelling, individual-centered simulation
- Distributed software applications
- Human-Machine interaction and communication within mixed communities

### Multi-agent application examples

## **Graphical simulation**

### Example: MASSIVE system

- Large scale simulation
- Autonomous decision making
- Local/limited perceptions or actions
- Interactions thanks to message sequences
- Behaviour modelling
- Heterogeneity of agents
- No overall control, but *emergence* of global behaviour during realistic simulations

## Peer-to-peer networks



- *Aim*: giving access to resources located on the network nodes
- *Working principle*: distributed indexing or discovery algorithms, and/or repository necessitating a collaborative activity of agents/nodes
- Multi-agent feature: protocols implemented by interaction rules, open systems, autonomous agents (sometimes heterogeneous)

## Swarm robotics

### Robocup



### Robocup rescue



- *Aim*: coordinate a mobile robots fleet
- *Working principle*: local decision-making contributing to an overall goal achievement
- *Multi-agent feature*: locally noised and limited perception, located environment, distributed planning

Fields of development for a multi-agent application

## Vowels breakdown

A MAS is made up of [Demazeau, 95]

- Agents (2)
- Environements (1)
- Interactions (3)
- Organizations (4)

## AEIO 1/4: Environment

### **Physical environment**

- Modelling of the **world states** and their dynamics
- Definition of **action** and **perception** primitives
- Especially present in embedded systems (mobile robotics, intelligent ambiance)

### **Situated environments**

- Determine an agent position along with perception and action constraints
- Mostly used in simulation

## AEIO 2.1/4: Agent architectures Reactive agents

- Simple architecture implementing a behaviour responding to events (*stimuli*)
- No environment representation
- Indirect communications (*via* the environment)
- No events or behaviours history
- Intelligence is embedded into the MAS organisation and appears by *emergence*



### **Difficulties: MAS + settings**

## **Reactive control cycle**

Data:

- Rules "condition => action"
- Set of percepts

while (true) {
 percepts := see();
 state := interpret(percepts);
 rule := match(state,rules);
 execute(rule[action]);
}

### Example: Subsomption architecture [Brooks, 96]



- Each layer interprets its inputs and creates a response
- Possibility to delete inputs and inhibit outputs

## AEIO 2.2/4: Agent architectures Cognitive agents

- Agents = intelligent entities, able to solve problems by themselves
- Intentionality: agents have goals and explicit plans allowing them to reach their goals
- MAS tries to organise the cooperation of traditional expert systems, through communications
- Intelligence is within the agents
   Difficulties: agent architecture + communications
- AHMI: Human cognitive agent interaction

## **Cognitive agents**

- Action choice is subject to **deliberation**
- Explicit representation of the environment, the agents' goals and their abilities
- An history can be used to take decision, learn or plan a sequence of actions



## Deliberative control system

Data

- Set of states
- Set of percepts
- Set of actions

```
states := initialise_state();
while (true) {
    percepts := see();
    states := update_states(percepts)
    action := deliberate(states);
    execute(action);
}
```

## AEIO 3/4: Interactions

### **Indirect interaction**

- Mainly for reactive agents
- Communication between agents by actions/perceptions on the environment
- Example: pheromone deposits

### **Direct interaction**

- Mainly for cognitive agents
- Sending/reception of structured messages
- Sequencing into interaction **protocols**
- Interaction is sometimes considered as an action

## AEIO 4/4: Organisations

### Top-down approach

- Formal definition, **explicit** of an organisation
- **Prescriptive** or **restrictive** use for agents
- MAS readapts *via* re-organisation

### Bottom-up approach

- Implicit organisation resulting from local agents' behaviour
- **Emergence** of some organisation
- MAS readapts *via* auto-organisation

## Auto-organisation

# a N 1 2 3

Ant colony

https://en.wikipedia.org/wiki/Ant\_colony\_optimization\_algorithms

### Peer-to-peer network regulation [Grizard, 06]



## To sum up, at agent level

A software agent has several features

- It is autonomous
- It has its own decision ability (pro-activity)
- It interacts with other agents
- It can take action on and perceive its environment

## To sum up, at MAS level

A multi-agent system

- is an open system
- that works in a decentralised manner
- is a compromise between control/regulation and emergence

Its properties allow to develop **flexible large scale** systems

A responsive architecture: Eco Problem Solving (EPS)

#### Problem solving (1/5) Formalisation

### Definition

A problem is defined by :

- an initial state,
- a goal (final state),
- a set of operators allowing to pass from one state to another.

 $\implies$  To solve a problem : give a sequence of operators allowing to pass from the initial state to the final one.

#### Representation

The states of the problem are represented by an oriented graph whose vertices are states.

There is an edge between nodes u and v iff there is an operator that turns u into v.

#### Problem solving (2/5) Examples of addressed problems

#### Exemples

- Proving theorems, solving equations
- Cube world, tower of Hanoi
- Eight queens puzzle
- River crossing puzzle (wolf, goat and cabbage problem, Seven Bridges of Koenigsberg)
- Timetables
- Path search in a maze
- Magic squares, sudoku, crosswords
- Travelling salesman problem

#### Remarque

Most of "real" problems can be identified as one of the above formalisation.

#### Problem solving (3/5) Exact solving

#### Principle

- Calculation of all possible paths going from the initial state to the final one.
- Exponential computational complexity
  - $\Rightarrow$  Combinatorial explosion (memory and/or time).

#### Example : chess

- State space : all authorized configurations of the board
- Initial state : initial configuration of chess
- Final state : all configurations of the board implying checkmate
- Rules such as : "if(white pawn is in square(i,2), and square(i,3) is empty, and square(i,4) is empty) then move white pawn from square(i,2) to square(i,4)"

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#### Problem solving (4/5) Heuristic methods

### Principle

Localized search view and stop after a certain amount of time.

- $\Rightarrow$  Approximation of solution
- $\Rightarrow$  Admissible quality solution, obtained in minimal time

#### Exemples

- Simulated annealing,
- Tabu search
- Evolutionary algorithms (or genetic algorithms)
- Multi-Agent systems (eco-problem solving)

#### Problem solving (5/5) Problem solving and Human-Machine Interactions

### Principle

Problem solving

- Dynamic
  - human intervention,
  - open or evolving environment
- with human interaction
  - cooperation,
  - collaboration,
  - competition

### Exemple

- Timetable bargaining
- Games

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#### Eco-problem solving (1/5) Principles

- Used in problem solving
- Based on a set of reactive agents sharing the same behaviour, called eco-agents
- As for any MAS, decentralised solving, and emergence of a large-scale behaviour
- Also interesting for dynamic problem solving
- Goal : reach a stable state (the problem's solution)

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#### Eco-problem solving (2/5) Eco-agents

- Their behaviour can be compared to a sequence of perception/action instructions
- Localised environment perception : network of dependencies made up of neighbour agents
- Each agent has a goal : satisfaction
- An agent is dissatisfied when *obstructed* by other agents
- If an agent is obstructed, it can *attack* another one
- An attacked agent is dissatisfied and can flee

#### Representation with finite-state automata

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### Eco-problem solving (3/5) Eco-agents architecture

#### 4 internal states

- S Satisfaction (final state)
- SS Seeking satisfaction (initial state)
- SE Seeking escape
  - E Escape state
- Perceptions
  - $A/\overline{A}$  attacked/not attacked by an other agent  $G/\overline{G}$  obstructed/not obstructed by an other agent

### Actions

- FS Do satisfaction (action achieving its goal)
- AT Attack an agent
- **FF** Flee

#### Eco-solving problem (4/5) Eco-agents behaviour automaton



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#### Eco-problem solving (5/5) Solving eco-problems

- An eco-problem is defined as
  - A set of agents, featuring a *goal* and a *behaviour* (automaton + basic actions depending upon application)
  - An initial configuration, agents set into their initial state
  - An ending criterion (most of the time : all agents are satisfied)
- Solving a problem through eco-problem solving
  - Identify the different types of eco-agents
  - Identify the satisfaction conditions of each eco-agent
  - Associate a structure describing eco-agents
  - Specify methods doEscape, doSatisfaction and Attack(X)
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#### Example : cube world Problem description



From an initial state (a set of cubes on the table), find a sequence of actions to execute in order to reach a final state (a specific configuration of the cubes)

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#### Example : cubes world Solving through eco-problem solving

- 2 types of eco-agents : the table and the cubes
- Final state : cube A would be satisfied if on the table, cube B if on top of cube A, cube C if on top of cube B {A.on(Table), B.on(A), C.on(B)}
- To a cube, fleeing consists in being put on the table

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#### Example : cubes world Table eco-agent

Attributes

```
Methods
Method satisfied?():boolean {
    return(True)
}
```

. . .

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#### Example : cubes world Cube eco-agent

```
Attributes
 over: Cube
 under: EcoAgent (Cube or Table)
 goal: EcoAgent (Cube or Table)
Methods
 Method doSatisfaction() {
   this.goal.over := this
   this.under.over := null
   this.under := goal
  }
 Method doEscape(p: EcoAgent) {
   this.under.over := null
   this.under := p
  }
```

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#### Example : cubes world Cube eco-agent

```
. . .
 Method satisfied?(): boolean {
   if this.under = this.goal then return(True)
   else return(False)
 }
 Method findPlaceToFlee() {
   return(Table)
 }
 Method obstructorsFlee() {
   if this.over <> null then // return the obstructors list
     return(this.over)
   else
     return(null) // else nothing
 }
```

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#### Example : cubes world Cube eco-agent

```
Method obstructorsSatisfaction() {
   EcoAgent r := null
   if this.over <> null then
      r := this.over
   else if this.goal.over <> null then
      r := this.goal.over
   return(r)
}
```

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#### Interaction with eco-agents

#### Heterogeneous MAS

- Reactive MAS, easily configurable
- Mixed community : human / artificial agents
- Indirect interactions
- Seeking stable state, human disturbance

- Eco-problem solving through heterogeneous MAS
  - Features identical to a heterogeneous MAS made up of eco-agents and humans
  - Agents and humans cooperate to solve a problem

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#### References

#### Links

- Link to lesson by C. Bertelle
- Link A. Drogoul

#### Books and articles

- J. Ferber, "Les Systèmes Multi-Agents : vers une intelligence collective", InterEditions, 1995
- K.P. Sycara, "The many faces of agents", AI Magazine, 19(2), pp. 11-12, 1998

Cognitive architecture examples

### Problem to solve: cube world States description with predicates

• Robotic hand status

HANDEMPTY, HOLDING(X)

• State of a cube

Above: CLEAR(x)

Below: ONTABLE(x), ON(x,y)



#### Example:

HANDEMPTY, CLEAR(A), ON(A,B), ON(B,C), ONTABLE(C)

### **Cube world operations**

pickup(x)

PRE & DEL: ONTABLE(x), CLEAR(x), HANDEMPTY ADD: HOLDING(x)

putdown(x)

PRE & DEL: HOLDING(x)

ADD: ONTABLE(x), CLEAR(x), HANDEMPTY

stack(x,y)

PRE & DEL: HOLDING(x), CLEAR(y)

ADD: HANDEMPTY, ON(x,y), CLEAR(x)

unstack(x,y)

PRE & DEL: HANDEMPTY, ON(x,y), CLEAR(x)

ADD: HOLDING(x), CLEAR(y)

### Initial and final states



#### Possible sequence:

unstack(C,A), putdown(C), pickup(B), stack(B,C), pickup(A), stack(A,B)

#### State graph



#### Planning

### Planning

# Determine a sequence of actions to perform in order to reach a certain goal



# Planning algorithm



# Forward linkage

Principle: begin from the initial state and explore the states produced by applying successive operations

- Complete approach that ends if the world models are finite
- Depth-first or breadth-first search
- Complexity proportional to the number of state models

# Example



- Forward linkage
- Selection of the oldest state with the less successors
- 1)  $\{10\} \Rightarrow \{11, 21\}$
- CLEAR(B) & ON(C,A) & CLEAR(C) & ONTABLE(A) & ONTABLE(B) & HANDEMPTY
- Candidates : pickup(B), unstack(C,A)
- 2)  $\{10, 11\} \Rightarrow \{12, 21\}$ 
  - ON(C,A) & CLEAR(C) & HOLDING(B) & ONTABLE(A)
- Candidates : putdown(B), stack(B,C)
- 3) {10, 11, 12} (failure)  $\Rightarrow$  {21}
- 4)  $\{10, 21\} \Rightarrow \{7, 23\}$

# **Backward linkage**

Principle: begin from the goal to find the initial state

The STRIPS planner generates intermediate solutions with 2 operators

- Decomposition: if the solution under consideration is composed, propose solutions in the appropriate order
- **Regression**: if the solution considered is elementary, choose an action that leads to it

#### Example

- CLEAR(A) & ON(A,B) & ON(B,C) & ONTABLE(C) & HANDEMPTY
  - *Candidates* : stack(A,B)
- ON(B,C) & CLEAR(B) & HOLDING(A) & ONTABLE(C)
  - Candidates : pickup(A), unstack(A,B)
- CLEAR(A) & ON(B,C) & CLEAR(B) & ONTABLE(A) & ONTABLE(C) & HANDEMPTY
  - Candidates : stack(B,C), putdown(A)
- CLEAR(A) & CLEAR(C) & HOLDING(B) & ONTABLE(A) & ONTABLE(C)
  - Candidates : pickup(B), unstack(B,A), unstack(B,C)

Example of cognitive agents architecture allowing planning: BDI model

### **BDI model**

Based on a cognitive model of intentionality [Georgeff, 83] [Bratman, 90]

A BDI model is made up of

- A set of Beliefs upon itself and the world (modalities or predicates)
- A set of potentially conflictual **Desires**
- A set of consistent and not conflictual Intentions
- Reasoning mechanisms to update beliefs, chose desires and generate intentions

### **BDI model implementations**

- Definition of an architecture based upon this model of reasoning (e.g.: PRS [Georgeff, 87])
- Formalisation in modal logic (e.g.: [Rao & Georgeff, 93])
- Agent programming languages (e.g.: Jason)

#### Procedural Reasoning System [Georgeff, 87]



### BDI formal model [Rao & Georgeff, 93]

Preamble

- An agent perceives the current situation as a world state
- A world state is made up of *true*, *false* or *unknown* facts represented by predicates (e.g.: onTable(cube\_A), not\_clear(cube\_B), ...)
- The representation of the world can be made in the hypothesis of a closed world or an open world

### BDI formal model [Rao & Georgeff, 93]

#### **BDI model formulas**

- A state formula s is
  - A proposition (a world state)
  - A conjunction or negation of state formulas (s1 AND s2, NOT s3)
  - BEL(s), DESIRE(s), INTEND(s)
- A path formula *p* is
  - A state formula
  - A conjunction or negation of path formulas
  - F p, G p, ... timed operators (p will be true at least once, p will always be true, ...)

### BDI formal model [Rao & Georgeff, 93]

- **BDI** predicates examples
- BEL(onTable(cube\_A))
- BEL(NOT onTable(cube\_A))
- INTEND(onTable(cube\_B))
- BEL(does(take(?X)) AND onTable(?X)  $\rightarrow$  NOT onTable(?X))
- INTEND(clear(cube\_B))

# How it works



#### While (stop condition)

- 1. Get new perceptions
- 2.Update beliefs
- 3.Update the desire
  stack depending on
  "activatable" plans
- 4. Update the intention stack
- 5. Run the first intention of the intention stack

# Plans library

- Plan library encodes a set of "activatable" subplans depending on beliefs
- A desire will be satisfied thanks to a set of intentions encoded by sub-plans

#### Planning is pre-wired !

Example: sub-plan « Paint a picture »

Pre: BEL(picture-not-painted)

Post: DES(painted-picture)

Plan: INTEND(take-brush) AND INTEND(soakbrush) ...

# Multi-agent programming language

BDI programming language example: Jason <u>http://jason.sourceforge.net/Jason/Jason.html</u>

- Developed in Java by R. Bordini and J. F. Hubner
- Inspired by AgentSpeak formalism

**Basic concepts** 

- Goals: !goal
- Internal actions: *.action(...)*
- States addition (+) and substraction (-) operators
- Reaction plan to an event: *event <- actions*

### Simple example of Jason code

// Agent tom in project greeting.mas2j
!start.

+!start : true <- .send(bob,tell,hello).

+hello[source(A)]

<- .print("I receive an hello from ",A); .send(A,tell,hello). Communication between agents (humans or software agents)

# Communicating is taking action!

- Speech act theory (Austin, Searle), computational formalisation (Searle, Vanderveken)
  - Locutionary dimension
    - production of signs, creation of the communication action
  - Illocutionary dimension
    - intention expressed by the speaker
  - Perlocutionary dimension
    - effect on the speaker
- Dialogue acts (Bunt) distinguish between:
  - Form of the statement (e.g. : « Does it rain ? »)
  - Communicative function
  - Semantic content

BDI mental states can formalise those dimensions

### Examples

 Statement « Does it rain ? » associates communicative function « closed question » and proposal « it rains ». They add statement « Does it rain ? » to the linguistic context and add to the listener's beliefs that the speaker wants to know if proposal « it rains » is true.

Act	Example	Meaning
!	! <sub>x</sub> p	Agent <i>x</i> confirms <i>p</i> .
?	? <sub>×</sub> p	Agent <i>x</i> asked question <i>p</i> .
!?	!? <sub>x</sub> p	Agent <i>x</i> confirms its ignorance about <i>p</i> .
\$	\$ <sub>x</sub>	Agent $x$ has nothing to say anymore (dialogue ends).

#### **FIPA-ACL** messages

#### Agent Communication Language



#### **FIPA** protocol

#### FIPA Request Interaction Protocol


## **FIPA-ACL** examples

<i, inform(k,p)>

 $FP : B_ip \ \neg B_i(B_kp \ U_kp)$ 

RE : B<sub>k</sub>p

Ex : Agent i informs agent j that (it is true that) it is raining today.

(inform

:sender (agent-identifier :name i)

```
:receiver (set (agent-identifier :name j))
```

:content

"weather (today, raining)"

:language Prolog)

<i,query-if(j,X)>

 $\mathsf{FP}: \neg \mathsf{B}_{i}\mathsf{X}_{\wedge} \neg \mathsf{B}_{i}\neg\mathsf{X}_{\wedge} \neg \mathsf{U}_{i}\mathsf{X}_{\wedge} \neg \mathsf{U}_{i}\neg\mathsf{X}$ 

 $\mathsf{RE}:\mathsf{Done}(<\!j,\!inform(i,X)\!>_,<\!j,\!inform(i,\neg X)\!>)$ 

## To go further

## **Main conferences**

- AAMAS (Autonomous Agents and Multi-Agent Systems)
- IAT (Intelligent Agent Technology)
- JFSMA (French-speaking days about Multi-Agents Systems)

## Lessons

- J.P. Sansonnet (http://perso.limsi.fr/jps/)
- R. Courdier (http://personnel.univ-reunion.fr/courdier)