

# A Context-Aware Multi-Agent System for Aml Environments

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- The Problem
- Objectives
- Related Work
- Solution
  - - Agent Behavior
  - - System Topology
  - - Context Representation
- Model
- A New Platform
- Conclusions
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## A Context-Aware Multi-Agent System for Aml Environments

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overview



## ■ Defining the Problem (1)

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· **Ambient Intelligence** – or Aml – is the vision of a future ubiquitous electronic environment that supports people in their daily tasks, in a proactive and context-aware, but "invisible" and non-intrusive manner [Ramos et al., 2008, Weiser, 1995,

Ducatel et al., 2001]

· **Context** is any information that can be used to characterize the situation of an entity [Dey, 2001]. **Context-awareness** is the property of an application that makes it adapt its behavior depending on context.

· Aml environments are characterized by a large number of interconnected heterogeneous devices with generally limited storage and performance.

· we can get insights on the features of Ambient Intelligence by means of **scenarios** and existing **Ambient Intelligence projects**.



## ■ Defining the Problem (2)

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### ■ - Agent Behavior

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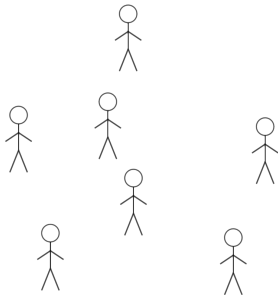
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We see Aml as a large number of People



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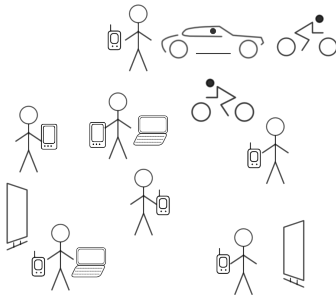
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We see Aml as a large number of People · Devices



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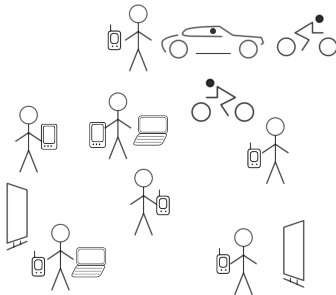
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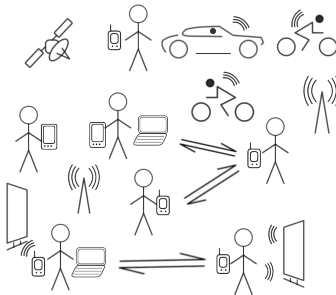
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We see Aml as a large number of People · Devices · Services  
· and intense Communication



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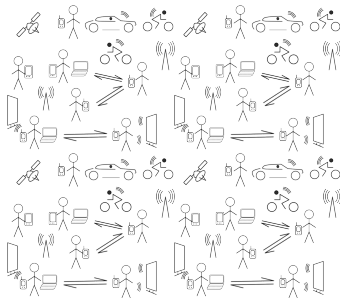
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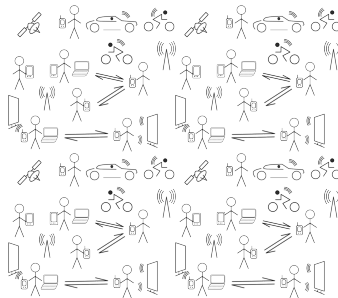
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We see an Aml system as organized on several layers:

- ▶ intelligent interfaces
- ▶ application
- ▶ interoperability
- ▶ network
- ▶ hardware



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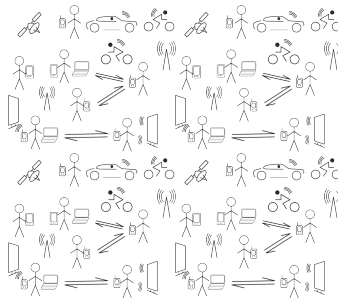
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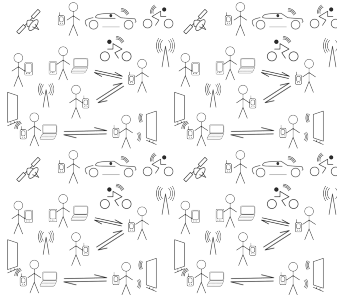
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## ■ Defining the Problem (3)

Aml challenges for the application layer:

- How to make Aml **reliable** and **dependable**?
- How to **manage** the large quantity of **information** generated by sensors and devices?
- How to provide the **relevant information** to the interested user?

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## ■ Defining the Problem (3)

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Aml challenges for the application layer:

- How to make Aml **reliable** and **dependable**?
- How to **manage** the large quantity of **information** generated by sensors and devices?
- How to provide the **relevant information** to the interested user?

Elements of a solution:

- ▶ software agents
- ▶ context-awareness
- ▶ elements of self-organization



## ■ The Problem

## ■ Objectives of the thesis

### ■ Related Work

**Our goal:** build a context-aware multi-agent system for application layer of an Ambient Intelligence system.

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**Our goal:** build a context-aware multi-agent system for application layer of an Ambient Intelligence system.

Main objectives of the thesis:

- ▶ propose a **model** of the multi-agent system;
- ▶ conceive **scenarios** that emphasize the requirements of real-scale Ambient Intelligence systems;
- ▶ design and implement a **simulation testbed** to serve for experiments with Aml applications;
- ▶ **validation** of the model by implementation and testing.





## · Multi-agent systems for Ambient Intelligence:

- ▶ centered on the user, using centralized components and application-specific reasoning:

- **iDorm** [Hagras et al., 2004] – learning user behavior
- **EasyMeeting** [Chen et al., 2004] – managing devices in a smart room
- **MyCampus** [Sadeh et al., 2005] – management of personal information
- **ASK-IT** [Spanoudakis and Moraitis, 2006] – assistance of elderly people
- **DALICA** [Costantini et al., 2008] – dissemination of information on cultural assets
- **ALZ-MAS, Fusion** [Corchado et al., 2008, Tapia et al., 2010] – remote healthcare for Alzheimer patients

- ▶ focused on system distribution

- **SpatialAgent** [Satoh, 2004] – use of mobile agents
- **LAICA project** [Cabri et al., 2005] – distributed processing of context information
- **AmbieAgents** [Lech and Wienhofen, 2005] – agents for the management of context
- **CAMPUS framework** [El Fallah Seghrouchni et al., 2008] – scalable, layered architecture for context sensing and ambient services

- ▶ Non-agent-based systems:

- **CASAS, MUSE** [Crandall and Cook, 2009, Lyons et al., 2010] – smart home projects
- **Archipel, ALADDIN, PERSONA** – care for elderly/disabled people [Bauchet et al., 2009, Perakis et al., 2009, Soler et al., 2010]

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## · Context processing and representation

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- ▶ centralized infrastructures, oriented toward physical context [Hong and Landay, 2001, Harter et al., 2002, Lech and Wienhofen, 2005,

Henricksen and Indulska, 2006, Baldauf et al., 2007, Feng et al., 2004]

- ▶ representations based on tuples, rules, or ontologies

[Perttunen et al., 2009, Strang and Linnhoff-Popien, 2004]

- ▶ context seen as **a set of associations**

[Henricksen and Indulska, 2006, Bettini et al., 2010]



## · Context processing and representation

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- most context processing systems see the processing of context as being one-way – the applications do not insert context information into the system



- **Our solution:** a general-purpose multi-agent system in which context-awareness is integrated so that agents naturally manage and share context information.

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## ■ Aspects of the Solution

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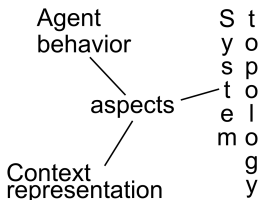
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- **Our solution:** a general-purpose multi-agent system in which context-awareness is integrated so that agents naturally manage and share context information.

- Three aspects of the solution:



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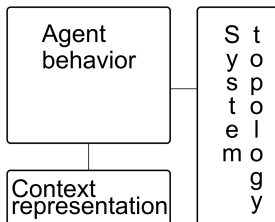
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## ■ Aspects of the Solution

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· **Question:** in an Ambient Intelligent system involving many users and devices, how to deliver the interesting information to the interested users?

· Requirements:

- ▶ decentralized system
- ▶ adaptability to the capabilities of the device
- ▶ context-awareness
- ▶ reliability





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· Question: in an Ambient Intelligent system involving many users and devices, how to deliver the interesting information to the interested users?

· Requirements:

- ▶ decentralized system
- ▶ adaptability to the capabilities of the device
- ▶ context-awareness
- ▶ reliability

· Original solution:

- ▶ local behavior: send interesting pieces of information to neighbor agents that are potentially interested in that information.



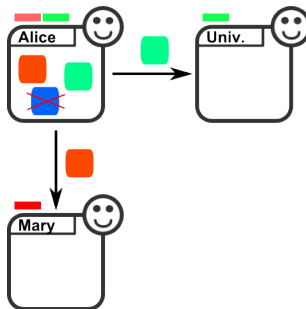
· **measures of context** with which relevance is computed:

- ▶ pressure – directly affects relevance;
- ▶ specialty – similarity with agent's specialty improves relevance;
- ▶ persistence – old information is discarded;
- ▶ locality – information originating farther is less relevant.

· also use positive and negative feedback loops, "forgetting", learning

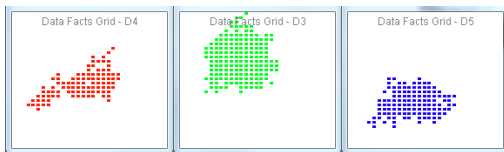
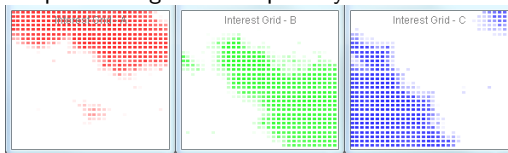
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## Results from experiments with the AmlCiTy:Mi project:

pre-existing areas of specialty:



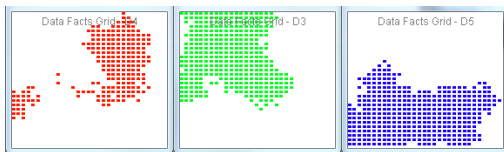
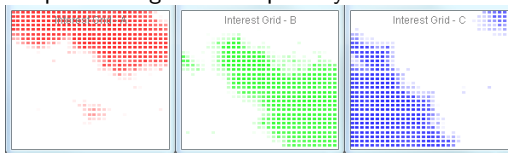
distribution of data

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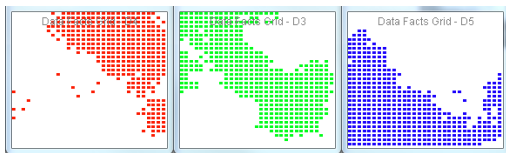
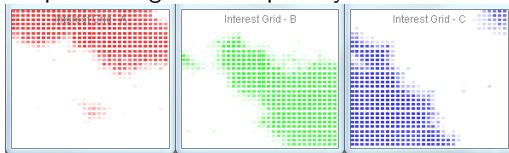
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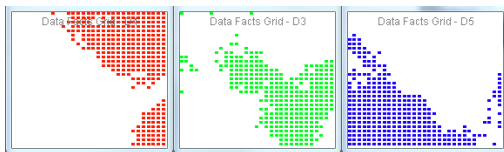
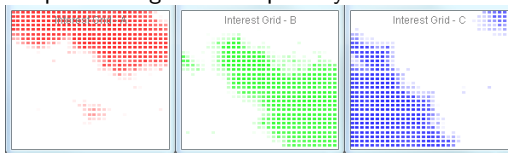
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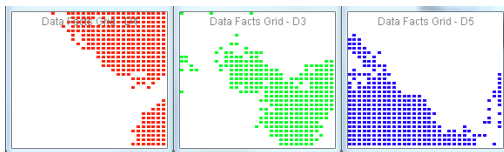
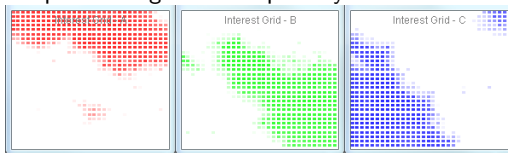
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## Results from experiments with the **AmlCiTy:Mi** project:

pre-existing areas of specialty:



distribution of data

**But:** must improve topology and context representation.



· **Question:** what should be the neighborhood relations in a multi-agent system for Ambient Intelligence?

· Elements of the solution:

▶ the CLAIM agent-oriented programming language

[Suna and El Fallah Seghrouchni, 2004]

▶ aspects of context: space, computational resources, time, social relations, user activity

▶ decentralization of the system

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· **Original solution:**

▶ mapping of the hierarchies of agents to the hierarchical structure of context.

▶ topology induced by context: If two agents share context then they are neighbors.

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## A first validation through the **Ao Dai prototype** – Agent-Oriented Design for Ambient Intelligence:

- ▶ Scenario: a user arrives for the first time on the floor of an Aml enabled building; the Aml system must guide the user and provide help in finding computational resources;
- ▶ agents are assigned to different elements of context – places, devices, services, users;
- ▶ hierarchical relations between the agents reflect the hierarchical structure of context.

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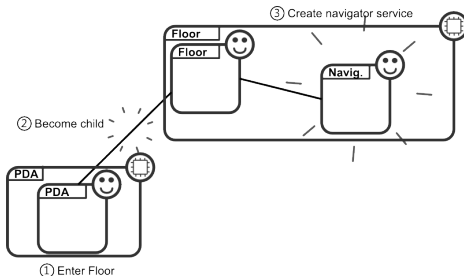
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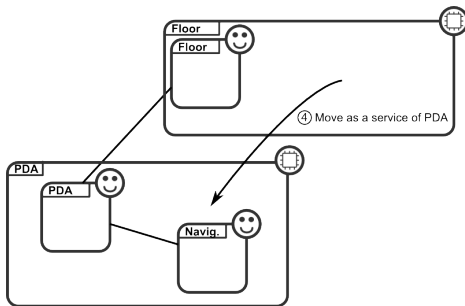
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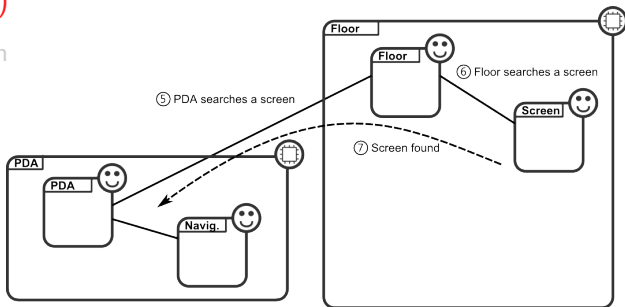
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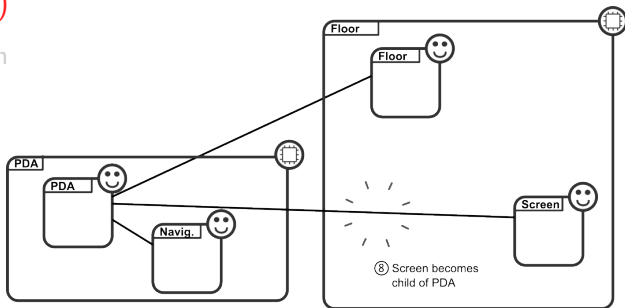
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### ■ System Topology (2)



## · Extension for more types of context:

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- ▶ spatial
- ▶ computational
- ▶ social
- ▶ activity

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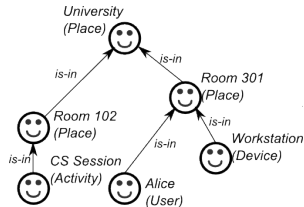
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## · Extension for more types of context:

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- ▶ spatial ← relation *is-in*
- ▶ computational
- ▶ social
- ▶ activity



## ■ System Topology (3)

## ■ - Context Representation

## ■ Model

## ■ A New Platform

## ■ Conclusions

## ■ Future Work

## ■ Publications

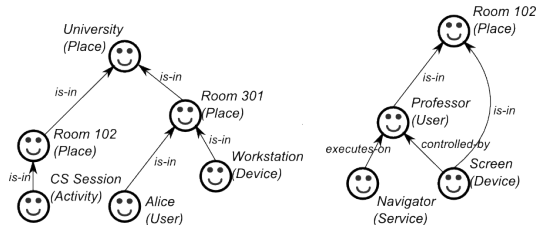




## · Extension for more types of context:

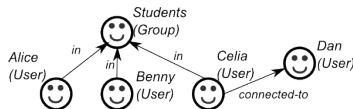
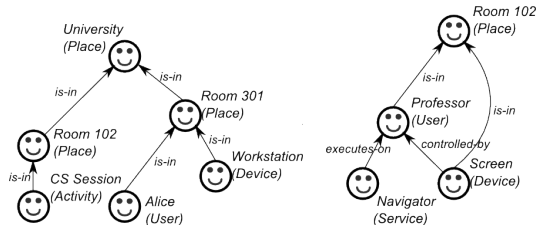
A Context-Aware Multi-Agent  
System for Aml Environments

- ▶ spatial ← relation *is-in*
- ▶ computational ← relations *controlled-by*, *executes-on*
- ▶ social
- ▶ activity



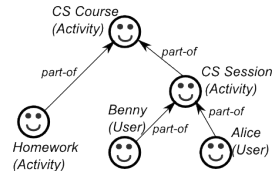
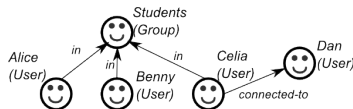
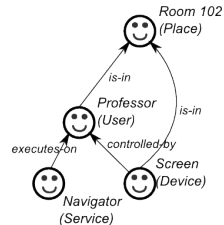
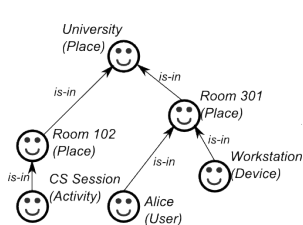
## · Extension for more types of context:

- ▶ spatial ← relation *is-in*
- ▶ computational ← relations *controlled-by*, *executes-on*
- ▶ social ← relations *in*, *connected-to*
- ▶ activity



## · Extension for more types of context:

- ▶ spatial ← relation *is-in*
- ▶ computational ← relations *controlled-by*, *executes-on*
- ▶ social ← relations *in*, *connected-to*
- ▶ activity ← relation *part-of*



## ■ The Problem

## ■ Objectives

## ■ Related Work

## ■ Solution

## ■ - Agent Behavior

## ■ - System Topology

# ■ Context Representation (1)

## ■ Model

## ■ A New Platform

## ■ Conclusions

## ■ Future Work

## ■ Publications

· **Question:** how to represent context information in a general and flexible manner, without the need of centralized components?

· Requirements for the representation:

- ▶ open
- ▶ flexible
- ▶ general
- ▶ exchangeable
- ▶ distributed



· Question: how to represent context information in a general and flexible manner, without the need of centralized components?

· Requirements for the representation:

- ▶ open
- ▶ flexible
- ▶ general
- ▶ exchangeable
- ▶ distributed

· **Original solution:**

- ▶ represent context information using graphs;
- ▶ use context patterns – graphs with generic elements – to represent situations;
- ▶ use matching to detect the current situation of the agent.

■ The Problem

■ Objectives

■ Related Work

■ Solution

■ - Agent Behavior

■ - System Topology

■ **Context Representation (1)**

■ Model

■ A New Platform

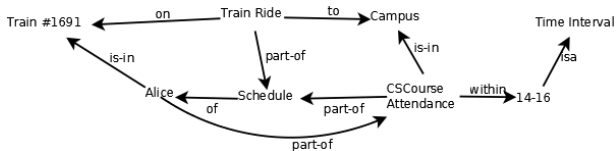
■ Conclusions

■ Future Work

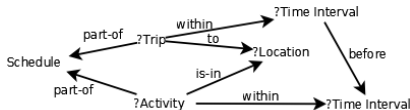
■ Publications



- Example: Alice is on a train on her way to her CS Course. Her agent is interested in when she get to the course.



Context Graph

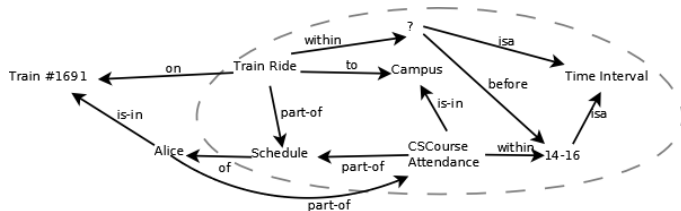


Context pattern: a graph that contains nodes label with a question mark "?".

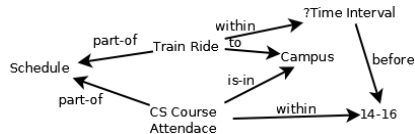
\*Read "*? Time interval*" as "*?  $\xrightarrow{isa}$  Time Interval*"



· result of the **pattern matching**:



Context Graph + Matched Subgraph + Unmatched part



Pattern matched part + Unmatched part

· we have conceived a matching algorithm that is based on growing of matches, considering both graph structure and the labels of nodes and edges.

- The Problem
- Objectives
- Related Work
- Solution
- - Agent Behavior
- - System Topology

## ■ Context Representation (3)

- Model
- A New Platform
- Conclusions
- Future Work
- Publications



- ▶ the container graph – complete graph;

$$\text{ContainerGraph} = (\text{Containers}, \text{Connections})$$

$$\text{Connections} = \{\forall(C_i, C_j) \mid C_i, C_j \in \text{Containers}\}$$

- ▶ agent locations – assignment of agents to containers

$$\text{AgentLocations} \subset \text{Agents} \times \text{Containers} \times \{\text{resides-on}\}$$

- ▶ agent relations – context-based neighborhood relations (for context-awareness outside the agent

$$\text{AgentGraph} = (\text{Agents}, \text{Relations})$$

$$\text{AgentRelations} = \{(A_i, A_j, \text{Relation})\}, \text{Relation} \in \{\text{is-in}, \text{part-of}, \text{etc.}\}.$$

- ▶ individual agents:

$$A(\text{Name}, \text{CG}_A, \text{Patterns}, \mathcal{R}, I, \text{Goallist}) \in \text{Agents}$$

## The Problem

## Objectives

## Related Work

## Solution

## - Agent Behavior

## - System Topology

## - Context Representation

## A MAS-Based Model (1)

## A New Platform

## Conclusions

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## Publications





· An agent  $A(Name, CG_A, Patterns, \mathcal{R}, I, Goallist)$  is defined by:

- ▶  $Name$  – its name;
- ▶  $CG_A$  – its context graph – context information characterizing the current situation of the agent;
- ▶  $Patterns$  – a set of patterns – represent situations that the agents can recognize (for context-awareness inside the agent);
- ▶  $\mathcal{R}$  the relations with other agents (incoming or outgoing);
- ▶  $I = \{(Agent, s, factor)\}$  – tuples indicating the estimated amount of interest that other agents have for a pattern;
- ▶  $Goallist$  – the list of pieces of information (subgraphs of  $CG_A$ ) to disseminate (inform goals) to other agents; a measure of importance is assigned to each goal;

## ■ The Problem

## ■ Objectives

## ■ Related Work

## ■ Solution

## ■ - Agent Behavior

## ■ - System Topology

## ■ - Context Representation

## ■ A MAS-Based Model (2)

## ■ A New Platform

## ■ Conclusions

## ■ Future Work

## ■ Publications

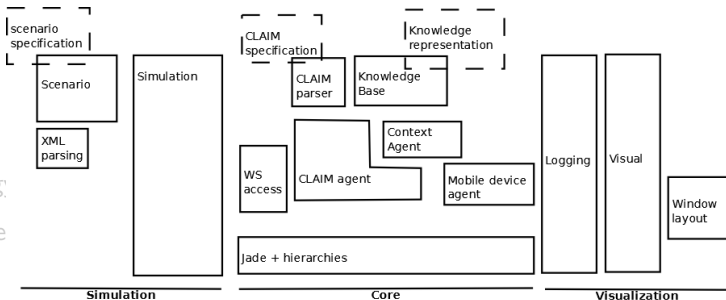




## · The Ao Dai platform

A Context-Aware Multi-Agent  
System for Aml Environments

- ▶ conceptual successor of the Ao Dai prototype
- ▶ underpinned by JADE Agent Development Framework



## ■ A New Platform for Aml (1)

- Conclusions
- Future Work
- Publications



- ▶ uses S-CLAIM – AOP language with simplified semantics and cleaner syntax

## ■ The Problem

## ■ Objectives

## ■ Related Work

## ■ Solution

### ■ - Agent Behavior

### ■ - System Topology

### ■ - Context Representation

## ■ Model

## ■ A New Platform for Aml (2)

## ■ Conclusions

## ■ Future Work

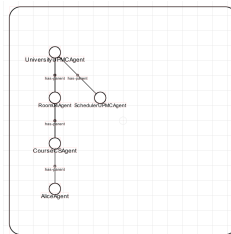
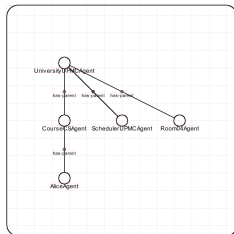
## ■ Publications

### CourseAgent.adf2 agent definition file

```
1. (agent Course ?courseName ?parent
2.   (behavior
3.     ...
4.     (reactive registerUser
5.       (receive assistsUser ?agentName ?userName)
6.       (addK (struct knowledge
7.         userAgent ?userName ?agentName))
8.     )
9.   )
10.)
```



- ▶ tools for the visualization of the agent structure



- ▶ repeatable simulation based on XML-files, describing agent deployment and simulation events

#### scenario.xml

1. `<scen:timeline>`
2.   `<scen:event time="2000" >`
3.     `<scen:CLAIMMessage>`
4.       `<scen:to>SchedulerUPMCAgent</scen:to>`
5.       `<scen:protocol>newSchedule</scen:protocol>`
6.       `<scen:content>( struct message newSchedule`  
                           `( struct knowledge scheduledTo`  
                           `CSCourse Room04 ) )</scen:content>`
7.     `</scen:CLAIMMessage> </scen:event>`
8.   `</scen:timeline>`



## The Problem

## Objectives

## Related Work

## Solution

### - Agent Behavior

### - System Topology

### - Context Representation

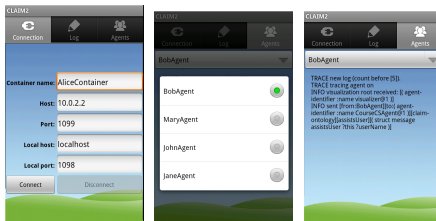
## Model

## A New Platform for Aml (4)

## Conclusions

## Future Work

## Publications



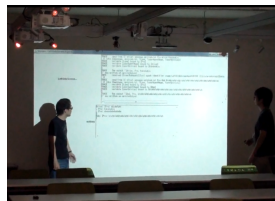
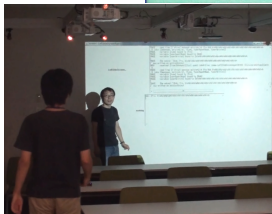
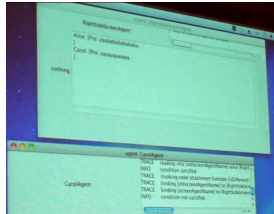
• support for deployment on mobile devices

• support for web services. Example call:

```
(send ?testAgent  
  (struct message echoService helloWorld)  
  http://localhost:8080/wsigs/ws/  
)
```



- The Problem
- Objectives
- Related Work
- Solution
  - - Agent Behavior
  - - System Topology
  - - Context Representation
- Model



## ■ A New Platform for Aml (5)

- Conclusions
- Future Work
- Publications

- integration with the SmartRoom at Honiden Lab, in Tokyo – featuring control of lights and screens, and detection and localization of people
- interoperation by means of web services
- successful simulation of a basic scenario



## Contributions (1):

### The Problem

### Objectives

### Related Work

### Solution

### - Agent Behavior

### - System Topology

### - Context Representation

### Model

### A New Platform

## Conclusions

### Future Work

### Publications

- ▶ we have proposed an agent behavior for the local sharing of information with global, coherent, results
- ▶ we have proposed context measures for the control of the spreading of information through a large multi-agent system: pressure, specialty, and persistence;
- ▶ we have designed and implemented a simulation testbed for multi-agent systems formed of a large number of agents, featuring tools for repeatable simulation and system visualization and evaluation – the AmlciTy:Mi project;
- ▶ we have conceived agent types and relations for a context-oriented system topology, based on mapping context structure to agent hierarchy;
- ▶ we have validated the context-oriented topology through a first experiment – the Ao Dai prototype – an agent-based Aml system for the assistance of a user in navigation and locating computational resources;





## Contributions (2):

### The Problem

### Objectives

### Related Work

### Solution

### - Agent Behavior

### - System Topology

### - Context Representation

### Model

### A New Platform

## Conclusions

### Future Work

### Publications

- ▶ we have proposed a formalism based on context graphs and patterns for the representation of context information and for the recognition of the agent's situation;
- ▶ we have conceived an algorithm for matching context patterns against context graphs, also allowing partial matches;
- ▶ we have proposed a model that unifies context-awareness inside the agent (context graph + context patterns) with context-awareness outside the agent (context-based topology);
- ▶ we have simplified and improved the semantics and syntax of the CLAIM AOP language, having as result the language S-CLAIM;
- ▶ we have designed and implemented the Ao Dai multi-agent platform for Aml applications that uses S-CLAIM and graph-based knowledge bases for agents, and also features tools for repeatable simulation and for the visualization of the system's evolution.



The main lines of **future work** for this research relate to:

## ■ The Problem

## ■ Objectives

## ■ Related Work

## ■ Solution

## ■ - Agent Behavior

## ■ - System Topology

## ■ - Context Representation

## ■ Model

## ■ A New Platform

## ■ Conclusions

## ■ **Future Work**

## ■ Publications

- ▶ extension of the AmlciTy:Mi project for the research of multi-agent systems formed of a large number of agents, with the inclusion of heterogeneous agents, moving agents, new measures for context, and new methods of evaluation;
- ▶ further development of the Ao Dai platform for Aml applications, including addition of algorithmic functionality libraries, new knowledge representations, and goal-oriented behavior;
- ▶ further testing and evaluation of the developed concepts, and detection of applications for which they are most appropriate;
- ▶ implementation of new scenarios and of real-life Aml applications using the developed platform and concepts.



Olaru, A., Gratie, C., and Florea, A. M. (2010). Emergent properties for data distribution in a cognitive MAS. *Computer Science and Information Systems*, 7(3):643-660

Olaru, A., Gratie, C., and Florea, A. M. (2010). Context-aware emergent behaviour in a MAS for information exchange. *Scalable Computing: Practice and Experience*, 11(1):33-42

Olaru, A. and Florea, A. M. (2010). A graph based approach to context matching. *Scalable Computing: Practice and Experience*, 11(4):393-399

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## ■ Publications (1)



## ISI Proceedings (1)

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## ■ Publications (2)



- The Problem
- Objectives
- Related Work
- Solution
- - Agent Behavior
- - System Topology
- - Context Representation
- Model
- A New Platform
- Conclusions
- Future Work

Olaru, A., El Fallah Seghrouchni, A., and Florea, A. M. (2010). Ambient intelligence: From scenario analysis towards a bottom-up design. In Proceedings of IDC'2010, the 4th International Symposium on Intelligent Distributed Computing

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Olaru, A., El Fallah Seghrouchni, A., and Florea, A. M. (2011). Graphs and patterns for context-awareness. In Proceedings of International Symposium on Ambient Intelligence

El Fallah Seghrouchni, A., Olaru, A., Nguyen, T. T. N., and Salomone, D. (2011). Ao Dai: Agent oriented design for ambient intelligence. In Proceedings of PRIMA 2010, the 13th International Conference on Principles and Practice of Multi-Agent Systems, number 7057 in Lecture Notes in Artificial Intelligence, pages 259-265. Springer (in print) (ISI Proceedings).

## ■ Publications (3)



Proceedings of peer-reviewed intentional conferences:

Olaru, A. and Florea, A. M. (2009). Emergence in cognitive multi-agent systems. Proceedings of CSCS17, the 17th International Conference on Control Systems and Computer Science, MASTS Workshop

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Olaru, A., Gratie, C., and Florea, A. M. (2009). Measures of context-awareness for self-organizing systems. In Proceedings of EUMAS 2009, 7th European Workshop on Multi-Agent Systems

El Fallah Seghrouchni, A., Olaru, A., Nguyen, T. T. N., and Salomone, D. (2010). Ao Dai: Agent oriented design for ambient intelligence. In Proceedings of PRIMA 2010, the 13th International Conference on Principles and Practice of Multi-Agent Systems

Olaru, A. and Florea, A. M. (2010). A graph based approach to context matching. In Proceedings of SYNASC 2010, 12th International Symposium on Symbolic and Numeric Algorithms for Scientific Computing

## ■ Publications (4)



## Thanks to:

- AmlciTy project: developed together with Cristian Gratie (UPB), under the supervision of Professor Adina Magda Florea.

- Ao Dai prototype: developed together with Thi Thuy Nga Nguyen (IFI Hanoi, LIP6) and Diego Salomone Bruno (Puc Rio, LIP6), under the supervision of Professor Amal El Fallah Seghrouchni.

- Ao Dai platform: developed together with Thi Thuy Nga Nguyen (IFI Hanoi, LIP6) and Marius-Tudor Benea (UPB, LIP6), with the help of Cédric Herpson (LIP6), under the supervision of Professor Amal El Fallah Seghrouchni; tested with the help of Susumu Toriumi (Honiden Lab), under the supervision of Kenji Tei (Honiden Lab)



■ The Problem

■ Objectives

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Thank You!

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■ - Agent Behavior

■ - System Topology

Any Questions?

■ - Context Representation

■ Model

■ A New Platform

■ Conclusions

■ Future Work

■ Publications







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■ The Problem

■ Objectives

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■ Solution

Thank You!

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■ - Agent Behavior

■ - System Topology

Any Questions?

■ - Context Representation

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