

Learning with a Context-Aware Multiagent System

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Abstract—New technological developments have made it possible to interact with computer systems and applications anywhere and anytime. It is vital that these applications are able to adapt to the user, as a person, and to its current situation, whatever that is. Therefore, the premises for evolution towards a learning society and a knowledge economy are present. Hence, there is a stringent demand for new learner-centered frameworks that allow active participation of learners in knowledge creation within communities, organizations, territories and society, at large. This paper presents the multi-agent architecture of our context-aware system and the learning scenarios within multi-dimensional learning spaces that the system provides support for. This architecture is the outcome of our endeavor to develop ePH, a system for sharing public interest information and knowledge, which is accessible through always-on, context-aware services.

Keywords: *context-aware systems, multiagent systems, case-based reasoning, multi-dimensional learning spaces*

I. INTRODUCTION

Context-awareness refers to the ability of a class of systems to use contextual information to supply better services to the user, in a flexible and manageable way. Context can be seen as “any information that can be used to characterize the situation of an entity”, where an entity can lay within a large range of things: a person, a place, an object, etc., that is relevant to the interaction between a user and an application [1]. A context-aware system is able to extract, interpret and use contextual information and to adapt its functionality to the current context of use in order to provide the right services to particular people, place, time, event, etc. [2].

Technological progress has seeded the stimuli for evolution towards a learning society and a knowledge economy, in which there is a need to rethink education, training and learning to subscribe to a new learning environment paradigm that provides for lifelong and life-wide learning. In this environment, learners are not simply consumers of knowledge; they (socially) create knowledge for themselves, for their organizations and their communities. A 21st century learner is able to extract knowledge from everyday activities, at work and in the community, *through mainly informal, non-formal, intentional, incidental or accidental learning activities, and shares his/her learning with peers within relevant communities in multi-dimensional learning spaces* [3]. Therefore, there is a stringent demand for new learner-centered frameworks that allow active participation of learners in knowledge creation, within learning communities, learning organizations, learning territories (municipalities, regions) and society, in general.

This paper presents the multi-agent architecture of our context-aware system (called ePH) and the learning scenarios within multi-dimensional learning spaces that the system provides support for. This architecture is the outcome of our endeavor to develop ePH, which is a system for sharing public interest information and knowledge that is accessible through always-on, context-aware services [4, 5]. ePH is an acronym for “e-Prahova”, where Prahova is the name of our county, for which the system has been developed. The rest of this paper is structured as follows: the next section contains the related work with focus on some systems that have been utilized in real world experiments. Section III describes briefly our context-aware system and illustrates its use within learning scenarios. The ePH’s learning capabilities are demonstrated in Section IV. The multi-agent architecture of the system and a possible learner scenario are presented, respectively, in the next two sections. The last section briefly concludes the paper, and points out some future work ideas.

II. CONTEXT AWARE MULTI-AGENT SYSTEMS

A multi-agent system is composed of multiple interacting intelligent agents. Multi-agent systems can be used to solve problems, which are difficult or impossible for an individual agent. In [6] the following major characteristics of multiagent systems are identified: each agent has just incomplete information and it is restricted in its capabilities, system control is distributed, data is decentralized, and computation is asynchronous. There is evidence in the literature that context-aware systems are a very active area of research, from which context-aware multi-agent systems covers more than one third [7, 8]. Within this section, we focus on some relevant systems that have been used in real world experiments.

X.MAS is a generic multiagent architecture that is focused on information retrieval tasks that are aimed to retrieve, filter and reorganize information according to user’s interests [9]. It consists of the following categories of software agents: *Information agents*, tailored to extract and handle information while accessing information sources, *Filter agents*, which transform information according to user preferences, *Task agents*, able to help users to perform tasks typically in cooperation with other agents, *Interface agents*, in charge of interacting with the user, and *Middle agents*, for establishing communication among requesters and providers. The authors also present some examples of actual systems that have been built based on the proposed architecture – e.g. WIKI.MAS that classify Wikipedia contents according to a predefined set of classes belonging to the WordNet domains.

Reference [10] proposes a Context-aware Service Platform (a prototype system) that utilizes Semantic Web technologies to analyze the ambient contexts and contrive service plans. They have integrated ontology with rule-based reasoning to automatically infer high-level contexts and deduce a goal of context-aware services. An AI planner decomposes complex services and establishes the execution plan, while agents perform the tasks to accomplish the service.

LOQOMOTION is a mobile agent-based architecture for distributed processing of continuous location-dependent queries that are issued by mobile users, which allows the retrieval of objects' locations and other interesting data. LOQOMOTION is able to process queries that depend on the location of any moving object, as opposed to other approaches that, for example, only focus on queries about static objects that are in the vicinity of a certain static or moving object, objects moving within a fixed region, etc. [11]. LOQOMOTION is based on a layered hierarchy of mobile agents that move autonomously over the network with the goal of tracking efficiently the relevant moving objects, correlating partial results, and, finally, presenting and continually updating the answer to the user's query [12].

Cyberguide is one of the first systems to provide for mobile context-aware tour guide. Knowledge of the user's current location, as well as a history of past locations, are used together to provide the kind of services that are expected from a real tour guide [13]. Reference [14] presents a model and a multi-agent architecture that has been designed to solve problems in web domains through the integration of information gathering and planning techniques. A particular implementation (MAPWEB-ETOURISM) has been applied to a specific domain, e-tourism, to solve travel problems.

The AmbieSense system has a multi-agent architecture for context-aware information services for mobile users that consists of wireless context tags, content provision platforms and mobile users [15]. The goal of the AmbieSense project is to develop a platform that satisfies the information needs of travelers and mobile users by providing ambient and personalized information in a context-aware manner.

III. THE ePH SYSTEM

ePH stores regional information and knowledge in ePH-DLib, a user-centered core digital library. Its content is available through always-on context-aware services. Users can get it or augment it no matter where they are: at home or office by using a computer, on road with a specific GPS-based device in the car (called gipix, developed in-house), or off-line/off-road via mobile phone. The users can act as members of a social network or individually. The digital library contains public interest information (drugstores, hospitals, general stores, gas stations, weather, entertainment spots, restaurants, travel and accommodation, routes etc.), historical, touristic, and cultural information and knowledge, users' personal "war stories" (tracks, touristic tours, impressions, photos, short videos and so on), and their additions, comments or updates to the content. This content is available to the ePH's users in a context-based way. For example, for a traveler being in a given area, the system may suggest several locations to go to (and

actions to execute to reach them): a restaurant to dine at, a museum or memorial house to visit etc. Moreover, if a user is interested in something in particular, like haunted castles, and s/he is located near such a place, and s/he can reach it within a reasonable time frame (having time to get back before dark), the system could show the tasks to be executed to guide her to reach that place [16]. The system has the ability to help also in a scenario that takes place in a remote region, in which the fuel is going down rapidly - ePH shows on the car's GPS-based device where the nearest gas station is.

Moreover, one important capability of the system is its support for learning in *multi-dimensional learning spaces* [3]. The basic learning scenarios involve the possibility to access whatever is relevant to education within a given almost circular area (having a certain radius) or along a particular segment of a track (having a particular length), both in the real and virtual world. The system can support users to fulfill their specific learning goals in a context-aware fashion, by recommending what is worth to be visited (from a learning viewpoint) within the specified area and by displaying the tasks to be executed to guide the user to get to that place.

ePH's architecture incorporates the Communications Server, the Location Server, the CBR Reasoner, the Knowledge Base, the Context Middleware, and the Multi-Agent Action Subsystems [5]. The *Communications Server* provides the support for the always-on kind of service, regardless of the place where the user is when s/he needs that service. The *Location Server* makes available the right service according to the location. The main tasks of the *CBR Reasoner* are as follows: identification of the current problem situation, retrieval of a past case that is similar to the one in progress, suggestion of a solution to this problem that uses that similar case, evaluation of this solution, and update of the system by learning from the current experience. The *Knowledge Base* incorporates general domain-dependent knowledge and specific knowledge (that is embodied by cases), which are used together to find the solution to a specific user problem (that defines the ePH's architecture as being *knowledge-intensive*).

The *Context Middleware* provides a generic context management infrastructure that gathers and maintains contextual information, freeing the agents and the applications of this chore. Throughout this work we have considered the context definition from [15]: *context is a set of suitable environmental states and settings that concern a user, which are relevant for a situation-sensitive application during the process of adapting the services and the information that is offered to the user*. Once the current context changes, the new context activates the *Multi-Agent Sub-system*, which contains various agents that deal with the context, the CBR process, the task facilitation and decomposition, and the application-specific undertakings [16]. These agents will be described in more detail in Section V. As the digital library, ePH-DLib, can be used both on- and off-line with ePH, it is not seen as strongly connected within this architecture.

The current stage of the project is as follows: the geospatial engine unde.ro provides the basic ePH functionality [4], the car device is in current use, and the vital cores of both the CS and the LS are functional as well. Some experimental results are

also available [16, 17]. Currently, we are working on the CBR reasoner, the knowledge base and the context middleware.

IV. LEARNING WITH EPH

Nowadays, learning is an active process that is blended into our daily life. Placing the learner at the center, in this context, does not mean that s/he is the center of attention of well-meaning teachers and instructors, but the center of production of knowledge that occurs in various contexts within multidimensional learning spaces. To enable this kind of learning, the revision of the old educational frameworks is required (moving from *contents* to *context*). Thus, the *learner is now at the center of a multidimensional learning space through an active participation in learning communities (personal and professional), learning organizations, learning territories (municipalities, regions) and society* [3]. The major reason for such a revision remains the massive shift from an industrial society to a knowledge economy and learning society.

As shown briefly in the section that describes our system, ePH has a significant potential to support learning in multidimensional learning spaces. There are two relevant learning scenarios, each of them involving the opportunity to access whatever is relevant to one person’s educational interest within a given (real or virtual) area. First one is confined inside a almost circular area, while the second takes place along a particular segment of a track. The system can support users to fulfill their specific learning goals in a context-aware fashion, by making recommendations on what is worth to be seen within the specified area, from a learning point of view, and by showing the tasks to be executed to guide the user to reach those specific Points of Interest (POIs).

The context, as a concept, is intimately related with reasoning and cognition in humans. For context-aware systems, the context works as a tool to select the correct action, in an action-oriented view of intelligence [18]. There are many works that report on development of context models to be used in problem solving. Thus, the context has been used to improve the quality and efficiency of case-based reasoning within diagnostic domain. The authors had focused on the entwined relationship between the agent doing the reasoning and the characteristics of the problem to be solved [19]. In [20] the focus is on how the agents understand situations relying on the information they can perceive.

In this work we use a multidimensional context model that subscribes to a meronomy that articulates various works from the literature [15, 21, 22, 23, 24] and it is enriched to fulfill ePH’s specific functionality. Thus, the context can be *personal* (user’s interests, state of mind, expertise, limitations – time interval, location area etc., preferences, and so on), *task* (user’s activities, goals, operating mode – static or dynamic, and so on), *device* (mobile phone, gipix, PDA, laptop etc.), *social* (user’s friends, family, colleagues, acquaintances etc.), *spatio-temporal* (time, user’s location and movement), *environmental* (things, persons, services, weather etc. from user’s surroundings), *strategic* (something important for a planned effect) and *historical* (for keeping trace of the past experience). [16]. These all relate to where the user is, when s/he is using the service, what s/he is using the service for, who s/he is with,

what s/he likes etc. However considerations such as how young the user is, or whether it is raining can be equally important.

The problem can be defined as “take a point from the multidimensional context space and map it to a learning point cloud within the space of the intertwined subject circles” (Fig. 1a). Various things of interest from a historical point of view are situated on the historical axis (H): monuments, theme museums (World War Two, French Revolution etc.), buildings (castles, house of parliament etc.), locations (e. g. Austerlitz field) and so on. Geographically relevant information that can be found on the geographical axis (G) is as follows: locations, caves, waterfalls, volcanoes, rivers, deltas, seas, oceans, mountains, natural reservations etc. On the Natural Sciences (NS) axis one can find elements of the flora and fauna (e.g. a botanic garden or a natural reservation), geological formations, astronomy phenomena and so forth. The culture axis (C) includes museums, memorial houses, monuments, cultural events, traditional fairs, workshops and expositions, significant constructions and so on. As many learning points can be associated with more than one axis, the users’ interest is generally focused on a *learning point cloud* (Fig. 1b).

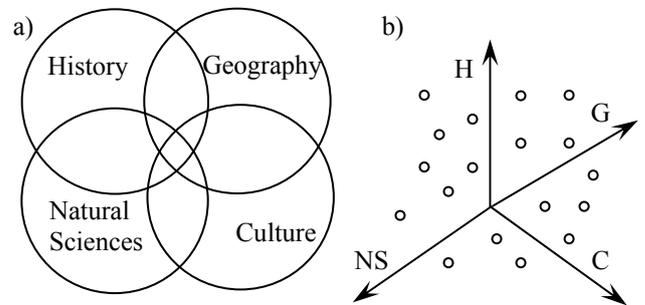


Figure 1. a) The intertwined subject circles b) The learning point cloud

Our solution to this problem is to use case-based reasoning and multi-agent actions subsystems within a knowledge-intensive architecture, as it can be seen in the next section.

V. EPH MULTIAGENT ARCHITECTURE

In this section, the multiagent architecture of ePH is presented in more detail (Fig. 3). We have called this architecture “FACE” to emphasize our aspirations to provide a knowledge-intensive reasoning process that is inspired by the way in which humans solve problems. A more detailed description of FACE can be found in [16].

Users may benefit from using ePH either on request or event-triggered by a change in the current context. The users can act individually or within a ePH-based social network, both situations being covered by *context widgets* that are able to acquire particular context information and to make it available to the context-aware applications [15]. Once a new context is identified, the CBR Reasoner tries to retrieve a known case and to classify the new situation relying on this case, if possible. After the successful classification of the current situation is performed, the new case will be stored in the case-base as a tuple that includes the contextual information that describes the situation, the problem that corresponds to this situation, and the constructed solution (the retrieved information and knowledge

and the tasks to be executed when appropriate). The CBR Reasoner of ePH integrates the classical CBR cycle (Retrieve, Reuse, Revise, Retain) [23] with other reasoning paradigms (rule-based systems, model-based reasoning, deep models – like causal reasoning etc.), as well as with other methods of generating knowledge (data-, text- or knowledge-mining) [16]. The knowledge base incorporates general domain knowledge and case-specific knowledge

Beside general domain knowledge, the knowledge base contains the context model (briefly presented in the previous section), and the cases (the *initial cases* - pre-classified situations that have been acquired prior to first execution, the *point cases* - which are generated to incorporate a new occurrent situation, and the *prototypical cases* - generalized cases, that contain aggregation of knowledge from previous point cases). Moreover, we need to keep within the knowledge base the user stereotypes and their specific triggers, to support the construction of *user models* [25].

Context templates are used to generate context patterns, and valid context instances are context instantiations that comply with the patterns laid out by the templates. When a new context instance occurs, the Context Agent gets it via the Context Middleware, translates it based on the specific ontology and sends it to the CBR Agent, which tries to identify the current situation (by using the ontology for reasoning about concepts). If this new situation cannot be classified above a given similarity threshold, then a new case is created by the New case Creator Agent. Further, the Task Decomposer is notified about this particular situation. The notification contains the situation, the corresponding contextual information, the task description and the associated goal. The Task Decomposer Agent separates the task into the required sub-tasks and recruits the correct application agents for solving those tasks. There is a large variety of such agents: device agent, GIS agent, reasoning agents, knowledge mining agent, information retrieval agent etc. We describe some of these agents below.

The Device Agent has three functionalities. The first one is to configure the device's applications and to present the prepared information. Secondly, it tries to obtain the user identification and all the possible data about the user's current context. The third functionality is to communicate with the system by using any appropriate means of communication. The device agent has different implementations for different types of devices (e.g. cars, mobile phones, PDAs, notebooks or desktop PCs). It contains more information about the device's specific hardware capabilities, and it can obtain additional information about available software tools.

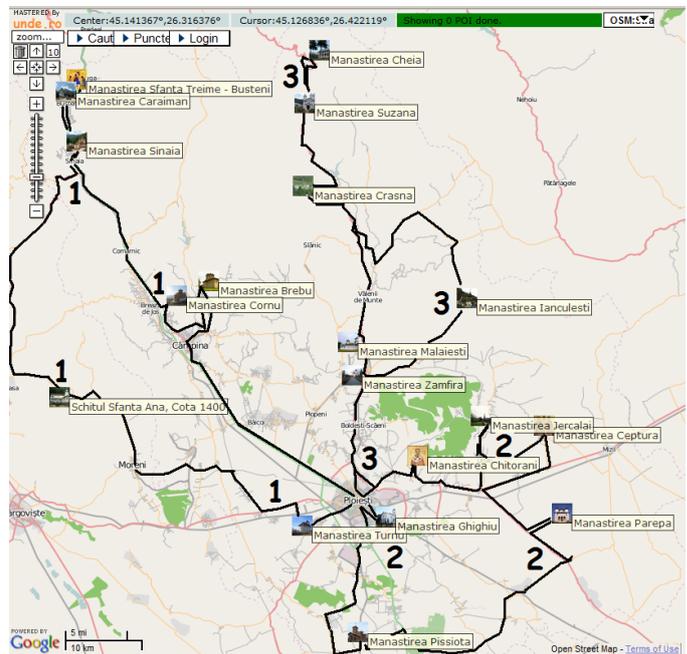
The GIS Agent encapsulates spatial analysis and query. It can respond to outside requests, and carries out specific spatial analysis and queries that have different data requests. Spatial data is accessed through one or more GIS servers, to which it may interface. This enables the distribution and manipulation of maps, models, tools and specific points of interest within the ePH framework, in a way that fits well to users' needs. The GIS Server allows the developers to author cost-effective maps, points of interest and geo-processing tasks.

The Information Retrieval agent is responsible for extracting data from different information repositories (Internet

web sites, digital libraries, other trusted sources etc.). Each information agent is associated with one information source, the extraction of data being done using specialized wrappers, which can also transform the relevant information into a structured form, if necessary.

VI. EPH USER SCENARIO

Further on we present the way in which a user who is interested in learning experiences can benefit from interaction with ePH. The idea behind this kind of support has been to help a person who is at a given time in a certain location to experience as most as possible as a learner, in a personalized and effective way, both in the real and virtual world. Let us consider a scenario, in which Tudor, an ePH user, is interested in learning about the specificity of the Byzantine architecture of the monasteries in our county. Tudor may be planning his learning trip prior to the journey itself or he might adjust his excursion dynamically, as he gets close to some POIs that are relevant to him. The static scenario is illustrated in Fig. 2, where one can also see the related prototypical case.



```
Case: Prahova 12
...
Context.task: 3 day car trip
Context.operating_mode: static
Context.device: laptop
Context.location: 44.9412,26.0213
Context.movement: no
Context.time: 2010.03.20
...
Context.interests: Byzantine monasteries
Context.preferences: take away food
Context.interval: next 3 days, 9am-7pm
Context.limitations: max 500km
Context.weather: good
Context.friends:yes
```

Figure 2. One possible learning scenario and the related prototypical case

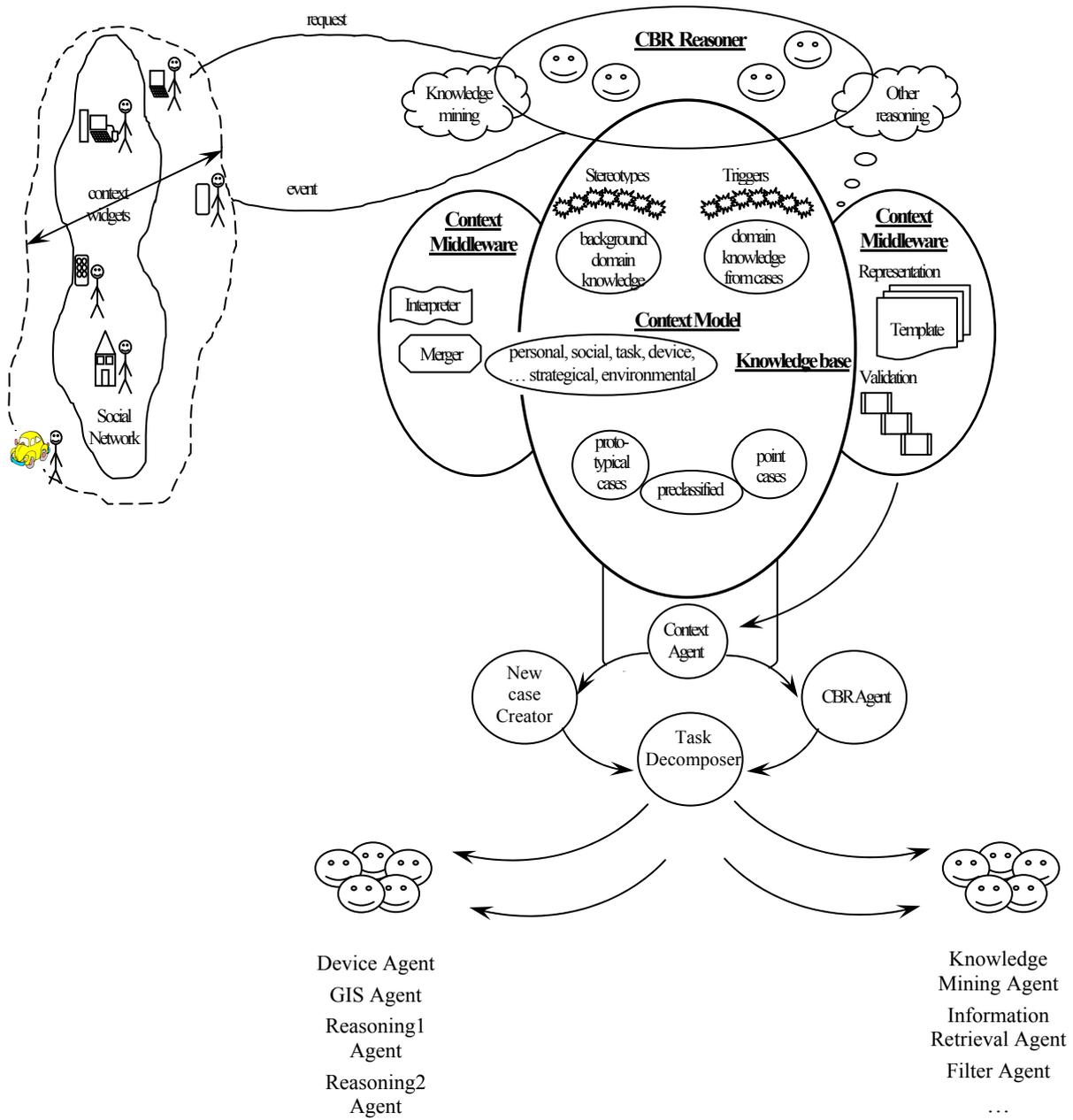


Figure 3. The ePH's multi-agent architecture

VII. CONCLUSIONS AND FUTURE WORK

New technological developments have made it possible to interact with computer systems and applications anywhere and any time. It is vital that these applications are able to adapt to the user, as a person, and to its current situation, whatever that is. Therefore, the premises for evolution towards a learning society and a knowledge economy are present. However, to have these goals accomplished requires the pervasive presence of, and ubiquitous access to, knowledge technologies that support construction of a new paradigm for learning environments and for social construction of knowledge. This new environment links together individuals, communities, organizations etc., both real and virtual, which are involved in impressing learning experiences. Learning that occur in these experiences is contextual, active, social and reflective.

In this paper we have presented in a few words ePH, a system that provides for sharing public interest information and knowledge that can be accessed via always-on, context-aware services, focusing on its multi-agent architecture. We have also advocated its use in learning scenarios within multi-dimensional learning spaces.

We need to investigate further how our agents may comply with the formal definition of an autonomous agent, which clearly distinguishes a software agent from just any program that had been proposed in [25]. Future work needs to be done for better understanding of the relationship between problem solving and learning, and their integration into an autonomic framework, which provides for the system's ability to inspect its own behavior and to learn how to change its structure, in order to improve its future performance (then the FACE will get all the parts it misses to be completely independent :).

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