

# DISTANCE LEARNING BY INTELLIGENT TUTORING SYSTEM

## *Agent-based architecture for user-centred adaptivity*

Antonio Fernández-Caballero and José Manuel Gascueña

*Computer Science Reseach Institute of Albacete, University of Castilla-La Mancha, Albacete, Spain*

*Email: caballer@info-ab.uclm.es*

Federico Botella and Enrique Lazcorreta

*Operations Research Centre, University Miguel Hernandez of Elche, Elche, Spain*

*Email: federico@umh.es, enrique@umh.es*

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**Abstract:** Agent technology has been suggested by experts to be a promising approach to fully extend Intelligent Tutoring Systems (ITS). By using intelligent agents in an ITS architecture it is possible to obtain an individual tutoring system adaptive to the needs and characteristics of every student. The general architecture of the ITS proposed is formed by the three components that characterize an ITS – the Student Model, the Domain Model, and the Education Model. In the Student Model the knowledge that the system has about the student (profile and interaction with the system) is represented. In the Domain Model the knowledge about the contents to be taught is stored. Precisely, in this model four autonomous agents – the Preferences Agent, the Accounting Agent, the Exercises Agent and the Tests Agent - have been defined. Lastly, the Education Model provides the functionality that the teacher needs. Across this module, the teacher changes his preferences, gives reinforcement to the students, obtains statistics and consults the matter.

## 1 INTRODUCTION

Agent technology has been suggested by experts to be a promising approach to fully extend Intelligent Tutoring Systems (ITS). By using intelligent agents in an ITS architecture it is possible to obtain an individual tutoring system adapted to the needs and characteristics of every student (Frigo, Pozzebon & Bittencourt, 2004). In this article, an agent-based Intelligent Tutoring System architecture for user-centred adaptivity in e-learning/e-teaching of any matter is introduced. A detailed description of the agents which monitor the progress of the students and propose new tasks is also provided. The ITS proposed is not tied to any course in particular, being the only requisite that the course has to be divided into theory, exercises and tests.

Many learning/teaching computer-based environments framed in the form of ITS use agent technology. For example, Cheikes has developed GIA (Generic Instructional Architecture), an agent-based software infrastructure devoted to support rapid development of ITS applications (Cheikes, 1995). Tang carried out the implementation of a

multi-agent intelligent tutoring system for the learning of computer programming (Tang & Wu, 2000). Capuano has described ABITS, a highly reusable Intelligent Tutoring Framework suitable to several knowledge domains (Capuano, Marsella & Salerno, 2000). A multi-agent system named MASPLANG developed for the adaptation of the so-called teaching support units has been introduced (Peña, Marzo & de la Rosa, 2002). Hospers et al. have presented an agent-based ITS for nurse education (Hospers et al., 2003). And there are many more approaches in distance learning (e.g., Bello & Bringsjord, 2003; Mota, Oliveira & Mouta, 2004; Kinshuk et al., 2001; de Antonio et al., 2003; Dorça, Lopes & Fernández, 2003; Pesty & Webber, 2004; Baldoni, Baroglio & Patti, 2004).

An ITS usually also incorporates pedagogical agents (animated characters) to do learning more attractive and effective. For example, there is Adele for medical education (Shaw et al., 1999), and AutoTutor for the students to learn the fundamentals of computer hardware, the operating system, and the Internet (Person & Graesser, 2000). SONIA is the animated agent incorporated in MASPLANG. The

architecture that we introduce in this article does not incorporate at present any animated agent.

The layout of the paper is as follows. In section 2 a definition of ITS is provided as its most common features are introduced. In section 3 we define what an agent is. In section 4 the aims of our agent-based ITS are explained. From section 5 on, the ITS architecture is introduced. Lastly, some conclusions are provided.

## 2 DEFINITION OF AN ITS

ITS are programs that possess a wide knowledge on a certain matter, and their intention is to transmit this knowledge to the students by means of an interactive individualized process, trying to emulate the form in which a tutor or human teacher would guide the student in his learning process (Millán, Agosta & Pérez, 1999).

Thus, ITS for sure are systems of knowledge communication. They can be defined that way because the principal emphasis in the development of these systems is to provide them with access to the representation of the knowledge that the system tries to communicate to the student.

In an ITS the emphasis is put in the knowledge (what) to being communicated to the student and not in the mechanism (how) of communication used to present the knowledge to the student.

Generally speaking, ITS are characterized for incorporating three models corresponding to three knowledge levels (see figure 1). Firstly, there is a Domain Model where the Knowledge of the Domain is gathered, that is to say the knowledge of what has to be taught. A Student Model represents the Knowledge of the Student, that is to say all things the student knows on the domain. Finally, there is a Pedagogical Model where the Knowledge of the Instructional strategies is described; that is to say, how to teach the Domain Knowledge.

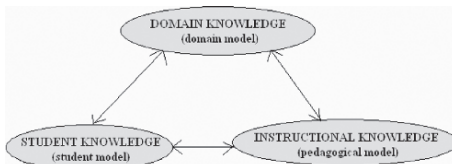


Figure 1: Components of an ITS.

## 3 DEFINITION OF AN AGENT

There is no universally accepted definition for the term agent, but there are a wide range of perspectives in function of the application domain, the author, and so on.

Franklin and Graesser state: “An autonomous agent is a system situated within and a part of an environment that senses that environment and acts on it, over time, in pursuit of its own agenda and so as to effect what it senses in the future.” (Franklin & Graesser, 1996).

Any agent, in accordance with this definition, satisfies the four properties as indicated next:

- *autonomy*: agents operate without the direct intervention of humans or others, and have some kind of control over their actions and internal state;
- *social ability*: agents interact with other agents (and possibly humans) via some kind of agent-communication language; agents collaborate for the sake of performing tasks;
- *reactivity*: agents perceive their environment, (which may be the physical world, a user via a graphical user interface, a collection of other agents, the Internet, or perhaps all of these combined), and respond in a timely fashion to changes that occur in it; in order to respond effectively to changes, agents have to know at each instant their surrounding “world”;
- *pro-activeness*: agents do not simply act in response to their environment, they are able to exhibit goal-directed behaviour by taking the initiative.

## 4 OBJECTIVES OF THE AGENT-BASED ITS

The ITS proposed in this paper creates an infrastructure for distance learning/teaching of a matter. In accordance with our experience, and in order to obtain good results, we propose to decompose the matter to be taught into theory, exercises and test questionnaires (see figure 2). The alumni study each topic of the matter reading theory first, then making exercises and finally answering to a test. The system will provide help the students whenever it will be felt necessary.

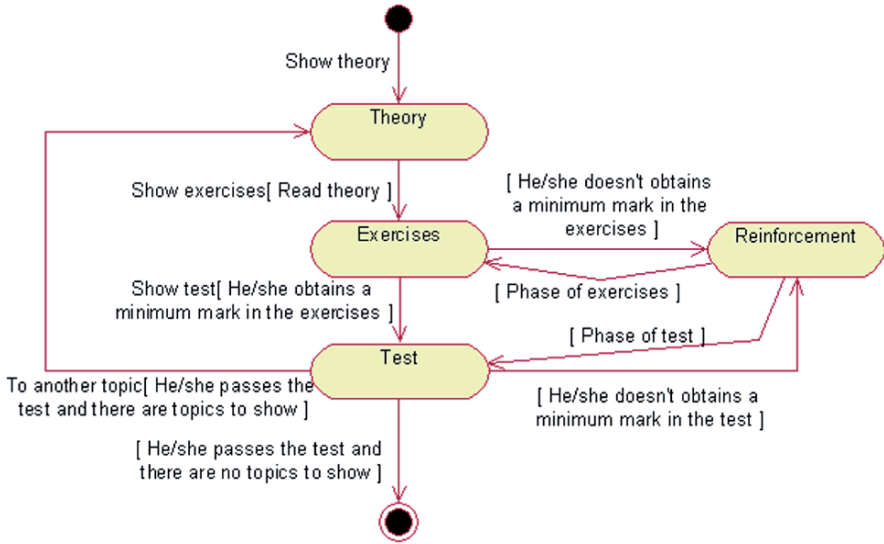


Figure 2: Decomposition of the matter.

The first goal of the ITS proposed is that the alumni learn more and better, that is to say, the system has to be able to structure learning matter in such a way to facilitate learning as much as possible.

One the most desirable characteristic to take into account in learning is the rhythm the student is able to learn. Thus, the ITS has to adapt the rhythm in which it introduces the concepts to the learning rhythm of each student (for instance, to show more or less exercises, to show more or less tests, etc.). Another aspect widely considered in learning theory is reinforcement by rewarding a correct answer and penalizing the errors (by means of messages, sounds, etc.).

The second goal in our environment is to enhance teaching in the same way as learning. One of the main problems a professor faces when teaching is that he does not know the skills of his alumni. Our proposal leads to conclusions that “teach how to teach”. Within this objective there is the need to make the matter more comprehensive for the overall alumni, but always keeping in mind the requisites given to the subject.

## 5 ARCHITECTURE OF THE ITS

The general architecture of our ITS (see figure 3) is formed by the three components that characterize an ITS, as explained before – the Student Model, the

Domain Model, and the Education Model. In the Domain Model four agents have been added to provide the system of a user-centred adaptivity capacity.

In the Student Model the knowledge the system has about the student (profile and interaction with the system) is represented. The model is composed of three knowledge databases (KDBs). (1) The Personal Information KDB stores the necessary personal information of the student to control his access to the system. (2) The Profiles KDB stores the level as well as the presentation styles of the students. The students are assigned different levels depending on their learning rhythm. (3) The Learning KDB stores parameters such as the exercises and tests proposed so far to the students, the time spent on answering the questionnaires, the pages of theory visited and the scrolls performed on those pages, or the reinforcement material prepared by the Pedagogic Module.

In the Domain Model the knowledge about the contents to be taught is stored. This model consists of four KDBs: (1) the Theory KDB incorporates the pages of theory that have been prepared for teaching the matter, (2) the Tests Questionnaire KDB stores the battery of test questions related to the matter, (3) the Exercises KDB stores the battery of exercises on the matter, and, (4) the Reinforcement KDB contains the information used by the Pedagogic Module to prepare the material to be shown when a student needs to be reinforced.

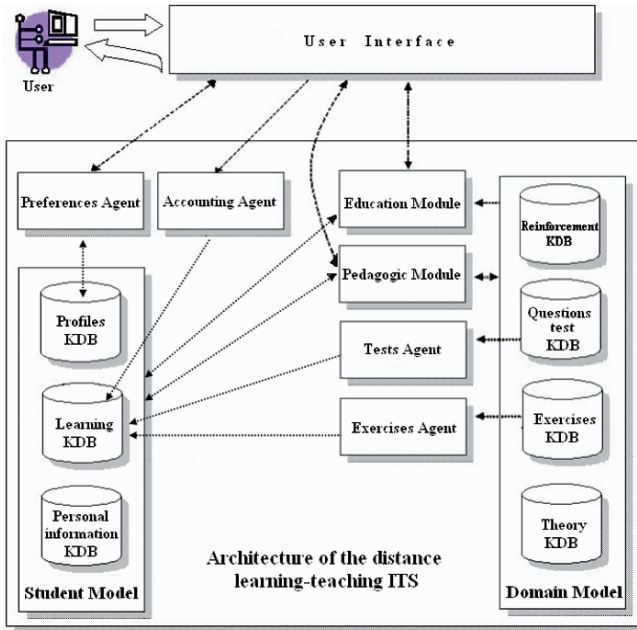


Figure 3: Architecture of the agent-based ITS system.

The Pedagogic Module provides the necessary mechanisms to efficiently present the matter to the student. This module is in charge of carrying out three tasks: (1) to provide the learning guidelines for the student (including any necessary reinforcement provided by the system), (2) to update statistics in the Domain Model of the exercises and tests presented, (3) to store into the Learning KDB important data such as the material prepared to reinforce the student who needs it, the responses given by the student to the exercises and tests proposed, as well as the scores that the student has gotten and the time that he has spent in reaching the aims.

The Preferences Agent supervises the user preferred style of presentation (type and size of letter, colors, margins, and so on). When the user changes his style of presentation the Preferences Agent creates a personalized sheet of styles for the user and updates the user's interface in accordance with his new pleasures. The information that this agent gathers is stored in the Profiles KDB. The Accounting Agent observes the student interaction with the interface when the pupil accesses a page of theory. When the student changes to another page of theory, the Accounting Agent stores in the Learning KDB some valuable information (the name of the visited page, the time that the student has spent on it

and the scrolls performed on it). The Exercises Agent takes charge of choosing the exercises that will be proposed to the student in the topic that he is currently studying. This agent stores the chosen exercises in the Learning KDB as well. In the same way, the Tests Agent is in charge of choosing the test questions that will compose a test questionnaire proposed to the student in the topic that he is studying at this moment. The test questions selected are also stored in the Learning KDB. The Exercises Agent and the Tests Agent do the selection when the student finishes the first visit to the first page of theory of every topic. We may highlight that the Exercises Agent and the Tests Agent are proactive because they carry out their tasks in parallel with the activity that the student performs. Indeed, the student is reading theory without realizing the work of both agents.

Lastly, the Education Model provides the functionality that the teacher of the system needs. Across this module the teacher changes his preferences, gives reinforcement to the students, obtains statistics and consults the matter. This model is in fact devoted to help the teacher to change the contents of the matter on the basis of the information obtained from the Student Model and the Domain Model.

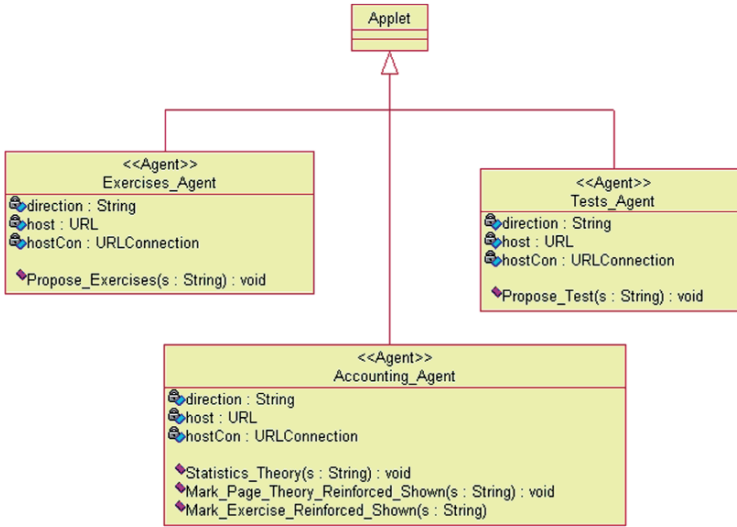


Figure 4: Agent class diagram.

## 6 DESIGN OF THE AGENTS

As it may be observed in figure 4, agents have been implemented as applets.

### 6.1 Preferences Agent

The Preferences Agent supervises the style of presentation that the user likes. The Preference Agent perceives the interaction of the student with the user interface and acts when he changes his tastes. The preference agent is continually running to know the student’s preferences at any time.

The process that follows when the user decides to change his visual preferences is shown in figure 5 as an activity diagram for activity “Change preferences”. When the student decides to “Change preferences”, the Preferences Agent shows him a form with the preferences that he has selected up to this moment. This way the user can perform the changes when he considers that are appropriate.

After having completed the form, the new selected preferences are updated and an example page is shown to the student with all the features of the new selected style of presentation. If the student does not like the page, he may continue changing his preferences.

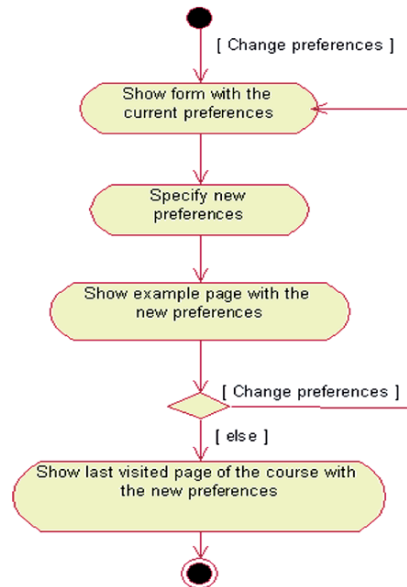


Figure 5: Activity diagram for “Change preferences.”

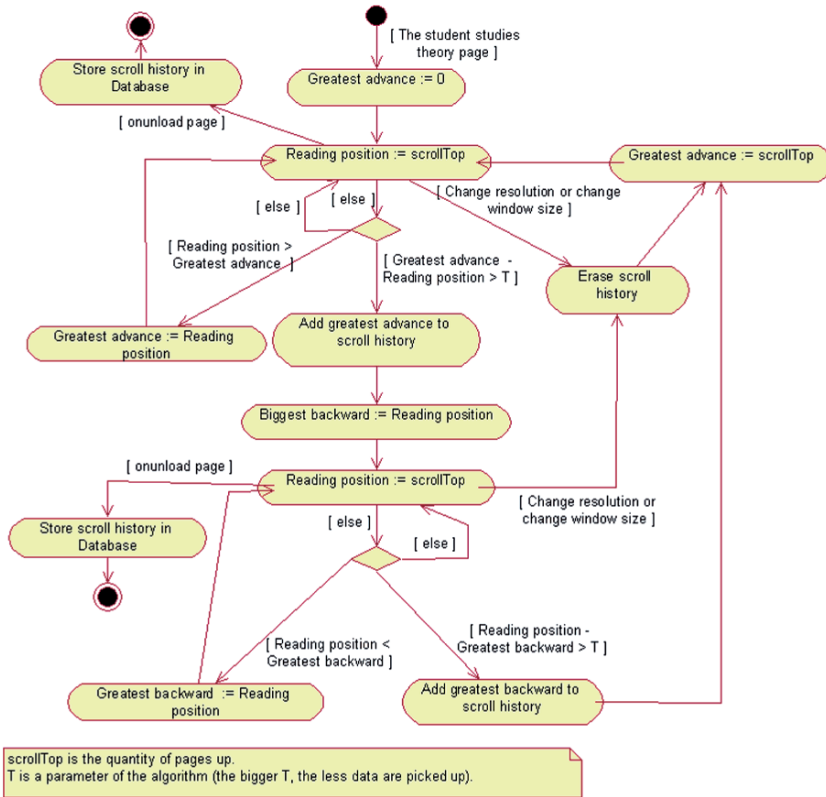


Figure 6: Activity diagram for “Detection of scroll.”

## 6.2 Accounting Agent

The Accounting Agent perceives the interaction between the student and the user interface and acts (gets information) when the student changes to another page of the ITS, scrolls up and/or down a page, performs an exercise or a test, and so on.

Let us focus on the Accounting Agent when watching the interaction of the student with the interface in theory pages. Here, more concretely, the agent is in charge of watching the scroll that the student performs on a page of theory as well as the time that he has remained in that page. When the student leaves studying a page of theory, the Accounting Agent stores all parameters gathered during this time (scroll and time of permanence) in the database.

In figure 6 the algorithm to detect the scroll that the student performs when he visits a page of theory is shown. Once the student has entered a theory

page, he may advance in his reading or go back in the page. Whilst the student is advancing through the page, the value of “Greatest advance” is being updated. Now, when he steps back the value of “Greatest backward” is updated. Notice how all steps are stored in the database as “Scroll History”.

## 6.3 Exercises Agent

The Exercises Agent is in charge of choosing the exercises that will be proposed to the student in the topic that he is currently studying. The Exercises Agent is autonomous as it controls its proper actions in some degree. The agent, by its own means (proactive), selects the set of exercises to be proposed in the subject studied by the student and adds to each exercise the links to the theory pages that explain the concepts (or topics) related to the exercise. When solicited, it sends the page containing the exercises to be proposed.

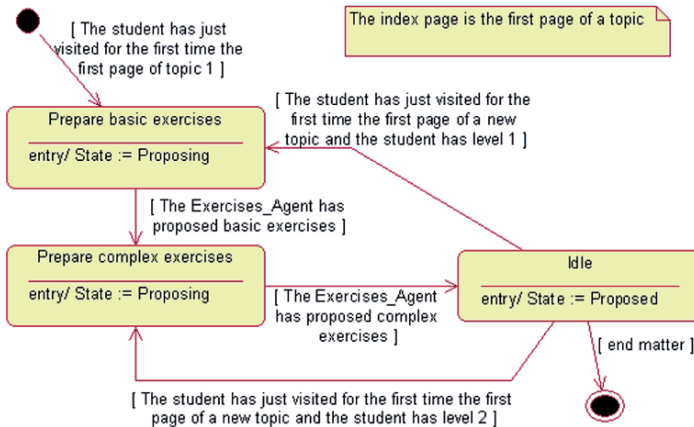


Figure 7: Exercises Agent state diagram

As it may be observed in figure 7, the Exercises Agent state diagram, when the student has just visited for the first time the first page of a topic, the Exercises Agent shows the selection of exercises that will be proposed to the student for the topic. If the student is a level-1 student (low level student), the agent selects the more basic exercises (state “Elaborate basic exercises”) and later on the more complex exercises (state “Elaborate complex exercises”). Now, if the student is a level-2 student (high level student), the agent is only allowed to select the complex exercises. Once the agent has selected the exercises it will remain inactive (in an “Idle” state) while the student does not go on to the following topic.

### 6.4 Tests Agent

Similarly, the Tests Agent is in charge of choosing the test questionnaires that will compose the test that will be proposed to the student in the topic that he is studying. The Tests Agent is also waiting until it is asked for tests questionnaires pages. The agent by its own means (pro-active) goes on designing a set of tests for the subject the student is engaged in.

As you may observe in figure 8 – the Tests Agent state diagram -, the Tests Agent performs the selection of test questionnaires at the same time that the Exercises Agent performs the selection of exercises. Once it has selected the test questionnaires, the agent will remain inactive (“Idle” state), while the student does not go on to the next topic.

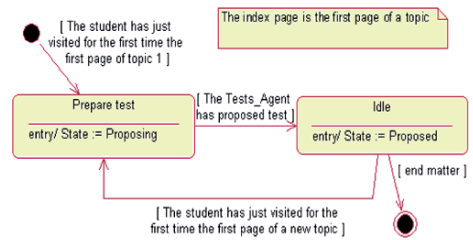


Figure 8: Tests Agent state diagram.

## 7 CONCLUSIONS

In this paper we have proposed an architecture that considers the high diversity of users’ skills and preferences: a user-centred and adaptive interaction multi-agent system. Our model proposed has been applied to e-learning/e-teaching by taking advantage of the current state of the art of ITS. A way to insert user adaptivity into an ITS is by using agent technology. This is due to the characteristics that intelligent agents possess – autonomy, social ability, reactivity and pro-activity. In this article, we have introduced an agent-based ITS architecture that enables a better learning to the students and a better teaching to the professors.

In this sense, in our distance learning system we have introduced a Student Model, a Domain Model, and an Education Model. In this latter model four

agents – the Preferences Agent, the Accounting Agent, the Exercises Agent and the Tests Agent - have been proposed. To conclude, the multi-agent system described in the paper gets data obtained from the profiles to adequate the contents shown to the concrete student that accesses the distance learning ITS. On the other hand, the multi-agent system obtains measures that permit to get recommendations to enhance the course. This way, jointly e-learning and e-teaching are greatly enhanced.

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