A Context-aware and Adaptive Learning Schedule framework for supporting learners' daily routines

Jane Yau, Mike Joy
Department of Computer Science, University of Warwick, UK
{j.y-k.yau, m.s.joy}@warwick.ac.uk

Abstract

A learning context describes the current situation of a learner related to a learning activity, and continually changes in a mobile learning environment. As a result, context-awareness in mobile learning has become an essential part when designing more adaptive mobile learning systems. In this paper, we introduce our novel Context-aware and Adaptive Learning Schedule framework which makes use of a learning schedule to support the students' daily routines, adapts the activities to the student's learning styles and then selects the appropriate activity for the learner based on their current learning context.

Keywords: Context-aware, Adaptive Learning, Learning Schedule, Learning Styles, Mobile Learning

1. Introduction

Mobile learning has become widespread, and students nowadays are able to learn anywhere and at any time, enabled by mobile technologies and wireless internet connections. Goodyear [1] suggested that "*there may be good reasons for allowing and perhaps encouraging learners to create their own 'learn places', configuring the physical resources available to them in ways they find most comfortable, efficient, supportive, congenial and convivial*". Sharples [2] noted that learners should be able to choose the times and locations of their learning, and Syvänen *et al.* [3] stated that learning activities should not be bound to only one specific environment (e.g. classroom), nor should the activities be pre-structured. Mobile learning can be distinguished "*by rapid and continual changes of context, as the learner moves between locations and encounters localised resources, services and co-learners*" [4], and these different situations of a person related to a learning activity are described by different learning contexts [5].

Corlett *et al.* [6] noted that the built-in software in mobile computing devices are not designed particularly to support students' learning activities such as attending lectures, reading course content, revising and meeting course deadlines. Subsequently, they developed a student learning organizer which included the standard pocket PC applications and they incorporated specific tools for students to access course material, view their timetables, communicate via email and instant messaging and organize ideas and notes; however this tool is not context-aware.

Context-aware mobile learning has become increasingly important because of the dynamic and continually changing learning settings in the learners' mobile learning environment giving rise to many different learning contexts. The task of a context-aware mobile learning application is to sense the mobile environment and react to the changing context during a student's learning process [4]. Context is a key in the design of more adaptive mobile learning systems [7] and context-awareness must be integrated within the systems in order for them to be truly effective [8]. User distraction in the mobile learning environment can be minimized as a result [9] and the user's explicit input can also be reduced [10]. Different information needs are required by mobile users/learners, and therefore these needs must be addressed in different ways [11].

In this paper, we introduce our novel Context-aware and Adaptive Learning Schedule (CALS) framework, consisting of the following three main components –

- A Learning Schedule for supporting the learners' daily routines (including both learning-related and learning-unrelated events).
- A Learning Styles adaptation module for adapting the learning activities according to the students' learning styles.
- A Context adaptation module performs two tasks – it first identifies the learning context which the learner is currently situated in, and then recommends appropriate learning activities for them based on the learning context.

The remainder of this paper is organized as follows. In Section 2, context-awareness and adaptation in mobile learning is examined and related research is introduced. In Section 3, our CALS framework is explored in detail. In Section 4, we discuss our design, implementation and evaluation plans. Finally, conclusions and future work is given in Section 5.

2. Related Work

There has been an increased variety of different locations where students' learning can take place other than in educational institutions and at home; this includes on public transport (i.e. buses and trains etc), in restaurants or pubs [12], as well as outdoor places such as parks. The conditions within these different locations could affect differently a learner's choice of educational task or learning activity, and also his/her ability to accomplish a task successfully. It was noted by Bull *et al.* [13] that the learner's interactions with their learning device should be structured appropriately in their current location, considering their concentration level and the likelihood of interruption in that location, and the available time for study.

There are two types of context-aware retrieval applications, known as interactive and proactive. Interactive applications directly issue requests to the users to input contextual information, whereas proactive applications can automatically retrieve the contextual information via sensors such as a GPS location sensor [11]. Bull *et al.*'s application [13] is an example of an interactive application, such that attributes (location, concentration level, likelihood of interruption and available time) are inputted by the users.

An example of a proactive application is Martin *et al.*'s [14] which selects and proposes the most appropriate activities to be completed at each time to learners. It takes into account the user's personal features, preferences or previous actions, user's context, including spare time and location. It also takes into account that users may use different physical devices (PCs, laptops, mobile phones and PDAs) and the activities are adapted to the different devices. There is an option which, if appropriate, according to the learner's context, will alert the users about the availability of an activity, and interrupt them. The system also allows collaborative activities between users to be performed.

Cheverst *et al.* [15] developed a system for tourists to visit the town, which takes into account environmental context such as opening times of the city's attractions and the current time of day, which will be relevant for creating a tailored tour and to navigate a visitor around the city. The visitor's personal context information is also stored and used for adapting the visiting materials; this includes the visitor's current location, personal profile (interests, preferred reading language, set of attractions already visited) and learning style (whether active/passive role).

3. The CALS Framework

Our proposed system draws upon three theoretical foundations – the contexts of mobile learning and computing, the Dunn and Dunn [16] and the Felder and Silverman learning styles models [21]. We have established that the underlying elements within the mobile learning contexts can be mapped directly onto the Dunn and Dunn learning styles model and that these contexts fundamentally have a theoretical learning styles model underpinning it [17]. Our goal is to develop a learning application to be used on a mobile handheld device, which adapts the learning activities to the learners according to their learning styles and is also capable of detecting the users' current learning context, and recommends appropriate activities for them based on these two criteria.

Figure 1 shows the pedagogical architecture of our framework, which includes three databases - the learner profile (including their learning styles), the learner scheduled events and the learning activities. There are two adaptation modules – learning styles adaptation and context adaptation.

We have chosen to adopt the proactive approach because of its increased context-aware capability. We will retrieve the contextual information from the scheduled events database (such as the time available for learning and the type of location), and two sensors, namely GPS for location detection and a microphone for noise detection.

We include the learners' preferred learning styles because learners have different psychological attributes which relate to their learning experiences and these considerations should be taken into account [18]. We have identified the Felder and Silverman model as one which is appropriate for use within our system because this model describes the learner in more detail and is based on tendencies

implying that learners can sometimes act differently if they have a high preference for certain behaviour [19]. Other authors such as Park [20] have also adopted the use of the Felder and Silverman model for the adaptation of learners' learning styles in their learning systems.

Figure 1 – Pedagogical architecture of CALS
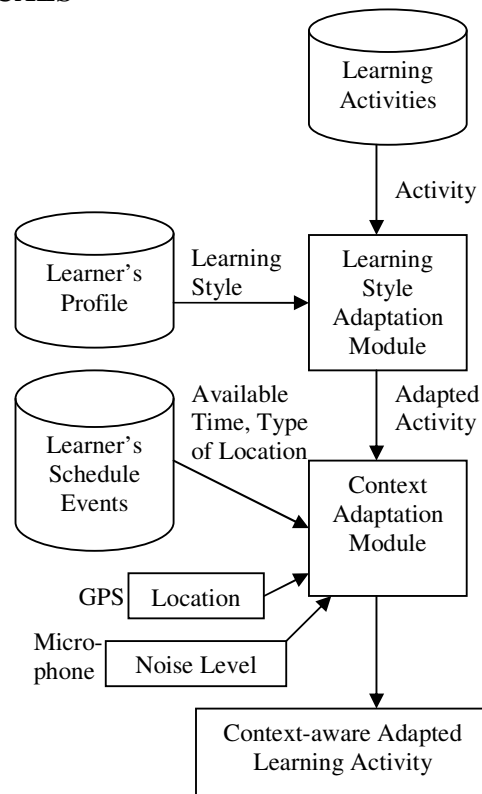
The remainder of this section is organized as follows. First, we give a sample scenario to illustrate how our adaptation process functions. Then we explore each of the components of our architecture, namely, learner profile database, learner scheduled events database, learning activities database, learning styles adaptation module and context adaptation module.

3.1 Sample scenario

Four users are considered in our sample scenario to illustrate our adaptation process: John – an active learner, Peter – a reflective learner, Sarah – a visual learner and Amy – a verbal learner. The activities will be

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adapted to the different learning styles, where appropriate. Some of the activities defined in our system are as follows –

A. Formal assessments
B. Un-assessed exercises
C. Pre-lecture notes
D. Learning from examples
E. Review activity
F. Discussion about work

It is an hour prior to their lecture. John is commuting on a quiet train for an hour; Peter is commuting on a noisy bus also for an hour; Sarah is in the library whilst Amy is in the computer lab. They all would like to undertake some learning activities based on their current learning situation. B has been selected for John as it is considered quiet enough for John to concentrate on the quiet train; C has been selected for Peter; and A has been selected for Sarah and Amy. In addition, a visual version of A has been selected for Sarah whereas a verbal version has been selected for Amy.

After the lecture, John goes to study in a quiet restaurant whereas Peter goes to a noisy café – each has 30 minutes to study. As John is an active learner, D is selected for him; on the contrary, E is selected for Peter as he is a reflective learner.

3.2 Learner profile database

Personal information about the learner is recorded in this database, including a unique identifier for the learner, surname, forename, address, email address, gender, date of birth, degree and modules undertaking, and their preferred learning styles according to the Felder and Silverman model [21]. Therefore each of the learner's preferences under the following categories will be recorded – (1) Active/Reflective, (2) Sensing/Intuitive, (3) Visual/Verbal, and (4) Sequential/Global.

The use of a learner profile is especially important in a mobile learning environment because different types of users may require

the devices for different reasons and may require different capabilities of the devices [18]. For example, a music student may require audio capabilities whereas an art student will require drawing capabilities from the device. Jones and Brown [11] also noted that certain user activities can be adapted to the learners which specifically affect some aspects of the learner profile.

3.3 Learner scheduled events database

The learner must supply to the system his/her scheduled events that he/she will be participating in at a specific time; these can either be learning related or unrelated. A unique identifier for the event is recorded, a name for quick reference, the event start and finish time, the category (whether learning related or unrelated), the event location, subject and type (whether seminar, lecture, tutorial and so on).

3.4 Learning activities database

All learning activities are stored in this database. Different types of learning activities are stored including compulsory activities (such as assessments), non-compulsory activities (such as exercises) and revision activities (such as review). Each activity has the following attribute – a unique identifier, title, subject, description, activity objective, priority of activity to be undertaken (high, medium and low), duration of time needed for completion, and Status of activity (unfinished or finished) - if the activity is not finished, then the remaining duration of the activity is recorded.

3.5 Learning styles adaptation module

Where possible, each of the learning activities will have a version which will cater for learners with the eight different learning preferences based on the Felder and Silverman model. This module takes the learner's learning style from the learner's profile database as input and outputs the

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appropriate learning activities for the learner, which is then inputted into the context adaptation module.

3.6 Context adaptation module

This module first identifies the current context that the learner is situated in, based on a number of variables which indicate the individual contextual factors as follows - the actual physical address of the location (for example, University) retrieved from GPS; whereas type of location (computer lab, library, café, home etc.), category of location (public, private, in transport) and time available are retrieved from the learner's scheduled events; finally the noise level will be detected from the built-in microphone on the learner's device. Note that it is the type of location which is important, rather than the actual location because the importance arises from the way this kind of location affects the individual learner [13]. A check can also be performed to see if the information from the database corresponds with the location sensor (i.e. a check on whether the learner is really keeping his/her schedule). This information can be used to alert the user to download lecture notes if he/she missed a lecture, for example.

We will assign individual and exclusive context patterns [22] for each of the combination of the values of the variables, such that -

Context pattern = {actual location, type of location, category of location, time available, noise level}

For example, Context pattern number 1 is assigned for a situation where the learner is at the university's computer lab, has 30 minutes, and is quiet.

When the context has been identified and a context pattern is inferred, this information is combined with the filtered learning activities according to the learner's preferred learning styles, and context-aware learning activities are output.

Four categories of context-aware applications were described by Schilit *et al.* [23], namely proximate selection, automatic contextual reconfiguration, contextual information and commands, and context-triggered actions. Context-triggered actions specify how context-aware systems should adapt using IF-THEN rules, which are previously specified. Actions are then invoked automatically when a contextual element or a mixture of contextual elements are fulfilled. We have selected the context-triggered approach for use within our system. This approach has also been adopted by Martin *et al.* [14].

There are other types of sensors which could also be used to detect other environmental attributes such as light levels and temperature. However, we have restricted our framework to the location and microphone sensors as we believe that these two will have the most substantial influence on the learning process.

4. Future Work

Our future work is described in this section.

4.1 Systems Design and Development

A prototype Java-based web application will be developed from this model and we have chosen the Fujitsu-Siemens LOOX n560 pocket PC device in which to build/run/test our system because it uses the Microsoft Windows Mobile 5.0 premium edition and the .NET compact framework 1.0 SP2 which allows .NET programs to be used and has a new generation of platform application programming interfaces (APIs) which allows rich multimedia support. Furthermore, GPS and a microphone are built-in to the device.

4.2 Systems Evaluation

The effectiveness of our system will be evaluated using a series of simulations which are required to be done in context, since the context-aware systems are used in context [24]; the simulations will provide us with quantitative results. A small number of human users will be employed to work with the system and to provide us with qualitative results.

5. Conclusions

In this paper, we have introduced our novel Context-aware and Adaptive Learning Schedule framework and we are currently designing and developing the system prototype which will be implemented and evaluated.

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