

Situation Analytics and Model-based User Interface Development: A Synergetic Approach for Building Runtime-Adaptive Business Applications

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Abstract. Situation analytics can be used to recognize the changing behavior, emotional state, cognitive load and environmental context of a user during complex task processing. This article discusses the SitAdapt 2.0 architecture that combines a situation analytics platform with pattern- and model-based user interface construction tools in order to build runtime-adaptive interactive business applications with enhanced user experience and task-accomplishment characteristics. The article focuses on the software components and tools for observing and tracking the user, data types for modeling situations, recognizing situations, and modeling structural changes and actions for generating the dynamic adaptations. The situation recognition capabilities and adaptive functionality of the system are demonstrated for web-applications for long-distance travel booking and a beauty products web-portal.

Keywords: Situation Analytics, Adaptive User Interfaces, Model-based User Interface Development Environments (MBUID), HCI-patterns, Emotion Recognition, User Tracking, E-business Applications.

1 Introduction

Situation- and context-aware computing has an established tradition in the area of distributed mobile computing [1] and complex interactive systems [2]. The availability of easy-to-use soft- and hardware tools for gathering visual or bio-physical user data and for observing user interactions and tracking activities has created the desire to systematically exploit the collected data for engineering dynamically adaptive software systems. Application domains range from

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Reference: Ch. Märtin, F. Kampfer, Ch. Herdin, and L. B. Yameni, "Situation Analytics and Model-based User Interface Development: A Synergetic Approach for Building Runtime-Adaptive Business Applications," *Complex Systems Informatics and Modeling Quarterly*, CSIMQ, no. 20, pp. 1–19, 2019. Available: <https://doi.org/10.7250/csimq.2019-20.01>

Additional information. Author's ORCID iD: Ch. Märtin – <https://orcid.org/0000-0002-3646-1920>. PII S225599221900115X. Received: 21 March 2019. Accepted: 17 October 2019. Available online: 31 October 2019.

sport and fitness apps, medical applications, driver assistance systems to web shops and other business systems, e.g. support for digital marketing activities. The term situation analytics [3] was coined in order to define the requirements for a new branch of software engineering that deals with the construction of user-centered applications that are able to dynamically adapt to the situations of users, and to guide them to meeting their objectives and successfully finishing their tasks.

1.1 SitAdapt

The SitAdapt interpreter is a structured HCI-focused approach for building situation aware interactive software with a current focus on web applications. The SitAdapt interpreter is integrated into the PaMGIS model-based user interface development environment (MBUIDE) [4] and has access to its pattern- and model based tools and resources. It uses a situation analytics component for observing the interactions and emotions of users at work and for finding and generating the adaptive changes needed for supporting users during work sessions. The SitAdapt architecture provides a new and flexible approach for constructing high-quality interactive applications by recognizing and interpreting individual user situations in real-time. It enables rapid dynamic changes of the appearance and the behavior of interactive systems and raises the overall user experience level when working with such applications.

An observer component records and synchronizes eye-tracker-signals, recognized visual emotions, bio-physical wristband data, as well as user tracking and application meta-data. These data are interpreted by the situation analytics component. An adaptation component then decides whether a dynamic adaptation is necessary or not and controls the generation of an appropriate modification of the target software at runtime.

Using an MBUID environment [5] for constructing interactive applications generally offers many advantages before, during, and after target system construction. For instance, models at different abstraction levels can even be accessed after the target system was implemented or generated. To enable real-time adaptations we use an enhanced version of the PaMGIS development environment that was developed in accordance with the CAMELEON reference framework (CRF) [6].

1.2 PaMGIS

PaMGIS [4], [7] offers pattern and model repositories that can be used for the development of interactive applications. The resources available in the repositories, e.g. HCI-patterns, user interface templates, or glue code for linking the user interface to business objects play an important role during the dynamic adaptation process.

The framework also supports automated generation of model refinements and final user interface code. To specify, organize and apply patterns and models, several software tools were integrated into the framework. An interface for improving the resource base with usability evaluation results is also provided by the framework. Another main contribution of PaMGIS is the PPSL (PaMGIS Pattern Specification Language) [8], an extended superset of all major HCI-pattern modeling languages that can also be used to define the resources for pattern-based code generation and to embed patterns into the overall modeling context.

1.3 Focus of this Article

After we have demonstrated with a prototype, how the observation, decision-making, and adaptation components of a situation interpreter are collaborating [9], our recent research activities have architected the integration of the SitAdapt interpreter into the PaMGIS framework and specified the adaptation process [10], [11] in detail. This article is an extended version of [12]. The present article focuses on the operation of the components of the SitAdapt interpreter

in its current version SitAdapt 2.0 and the interplay between SitAdapt and the PaMGIS models and pattern-resources. It also discusses the administrator tools for defining new situation rules and adaptations and demonstrates, how situations are recognized and adaptations are triggered by situation rules. It is also shown that SitAdapt can be used for adding adaptive behavior to applications that were developed without the PaMGIS framework.

In addition to the work presented in [12] we have modified and extended the article in the following areas:

- The related work section is updated and deepened
- The SitAdapt adaptation process and the data types exploited for making adaptation decisions are discussed in greater detail
- The co-operation between situation rules and the context of use models is clarified
- A new E-business application example with focus on customer experience is introduced
- The conclusion and future work section is extended

The rest of this article is structured as follows: Section 2 gives an overview of the field of context- and situation-aware computing and discusses the related work. Section 3 examines the SitAdapt 2.0 implementation and its components and tools. Section 4 discusses the concepts for modeling adaptability within the environment and the interplay between the situation analytics component, the target applications, and the pattern- and model-based resources of the PaMGIS framework. Section 5 demonstrates the system at work, e.g. with scenarios from a long-distance travel booking web-application and a web-shop for beauty products. Section 6 concludes the article and gives an outlook to the planned future work.

2 Related Work

The CRF [6], [13], a de-facto standard architecture for the model-driven construction of interactive systems, contains a set of structural guidelines for adapting the target software in pre-defined ways, mainly for responding to the requirements of different platforms and for dynamically migrating applications from device to device.

However, in order to design interactive systems that are able to adapt dynamically to situational and contextual changes in a way completely tailored to the needs of the individual user, a new approach had to be engineered that has to support two major goals:

- Improved task accomplishment and quality of work. By observing the user on her way to reaching a goal or possibly failing to reach this goal, the system can compare the actual path taken by the user with the workflow proposed by the task model. If necessary, the system can offer help or dynamically restructure the user interface or the task workflow to support the successful completion of the task.
- Better user experience. By observing the current emotional and physical state of the user, the system can propose or generate modifications of the user interface or even the business layer in order to improve the individual user's sentiments and the overall user experience.

2.1 Context- and Situation-Awareness

Central to this new approach is the concept of situation-awareness that is strongly related with context-aware computing. The concept of context-aware computing was first proposed for distributed mobile computing in [1]. In addition to software and communication challenges to be solved when dynamically migrating an application to various devices and locations within a distributed environment, the definition of context then also included environmental and social aspects (e.g. lighting and sound environment, persons in the room, roles of the persons, etc.).

Early definitions of the term situation-awareness appearing in psychology and the cognitive sciences were aimed at supporting human operators in complex situations, e.g. pilots during the

landing phase, by defining situation-dependent requirements for allowing a smooth and correct task accomplishment [2], [14].

With a rising level of machine intelligence the borderline between a human operator, who easily recognizes a situation, because the software system delivers helpful visualizations and data, or a technical system that recognizes the situation and acts on its own behalf, is flexible. Situation-awareness has to cover both concepts.

Context, however, is a complex and not easily tangible concept. In [15] it is shown that context can either be seen in a reifying way by defining the semantics of every relevant object surrounding the entities engaged in interactions. Or, context can play a deeper role in interactions and must be considered, when users are forming meanings over time by also interpreting pragmatic contextual information contained in utterances of all types. For incorporating the latter view on context into automated recognition systems, deep knowledge of the domain and common-sense reasoning are required.

To capture the individual requirements of a situation, Chang [3] has suggested that a situation specification must cover the user's operational environment E , the user's social behavior B , by interpreting his or her actions, and a hidden context M that includes the users' mental states and emotions. A situation Sit at a given time t can thus be defined as $Sit = \langle M, B, E \rangle_t$. A user's intention for using a specific software service for reaching a goal can then be formulated as a temporal sequence $\langle Sit_1, Sit_2, \dots, Sit_n \rangle$, where Sit_1 is the situation that triggers the usage of a service or the execution of an activity and Sit_n is the goal-satisfying situation. For recognizing and evaluating situations adaptive runtime environments have to provide the cognitive and analytic capabilities to interpret the multitude of available signals and meta-data and to infer a goal-oriented set of adaptations.

In [16] the Situ framework, that was designed as a probabilistic situation analytics environment, is used for supporting the recommendation of tasks necessary for executing activities like cooking or washing in the daily life of patients in the early states of Alzheimer's disease in smart home environments. The Situ framework was constructed around the situation model introduced in [3]. In this application Situ is combined with a reinforcement learning component that allows the application to recommend patients the correct action sequences for successful task accomplishment in situations of cognitive uncertainty.

SitAdapt was also inspired by [3]. Our aim is to design a high-quality and practicable software engineering environment for building situation-aware target systems. Therefore, we follow a combined approach by linking the PaMGIS MBUID-framework and its domain and user interface models with a user-centric situation-aware adaptation component. For integrating the necessary reasoning capabilities, we introduce situation rules that have access to both, the observed raw situations and the modeling resources of the MBUID.

2.2 Observing the User

For implementing the emotion recognition functionality SitAdapt captures both visual and biometric data signals. In its current version user monitoring within several e-business scenarios (e.g. travel booking, online banking, finding and ordering beauty products in a web-shop) is implemented in an advanced usability lab environment. The user is observed already before starting to interact with the application, during interaction, and until after the session is closed.

In [17] we discuss the interplay of the various recognition methods used in the SitAdapt system. Our work was influenced by several current research approaches for visual and bio-physical emotion recognition, e.g. [18], [19], [20]. We have also studied the practical aspects of integrating runtime analytics, e.g. [21], and the consequences for sharing such information and privacy issues, e.g. [22].

An interesting related approach for tracking non-verbal visual utterances like smiling, nodding, and head shaking for assessing the users' social behavior is provided by the MACH social skills training environment [23].

A study for recognizing negative emotions with a high-level of accuracy by only exploiting mouse movement and cursor speed data is presented in [24]. Such methods can help to build more unobtrusive affective systems. As SitAdapt also records mouse interaction data, a study for analyzing correlations between visually recognized emotions and mouse behavior is currently set up at our lab.

A central tool in our environment for obtaining precise behavioral user-data is the eye-tracker. In [25] the different categories of eye-movement data are introduced. For most purposes eye fixations are exploited, because of their stability and duration. As typical measures the number of fixations to a certain area of interest (AOI), first fixation to the AOI, fixation duration, and accumulated fixation duration, that can be visualized by a heat map, are most widely used. The authors use eye-tracking data for deciding which product of a certain category, e.g. digital cameras, is the most interesting for the user. In a prototype that was evaluated by a user-study they combined eye-tracking with a genetic algorithm in order to adapt a product recommendation system to the real preferences of the users.

The evaluation of observed user emotions and eye-movements while interacting with the target system and executing different tasks can lead to a precise recognition of users' intentions and their current mental states. To exploit this information, e.g. for individualized adaptations of commercial applications in order to change customer behavior, not only UX related aspects are affected, but also ethical questions are posed.

The recent evolution of individualized and very private personal services and sensing technologies, thus also requires a general discussion and integration of ethical aspects and a sensitivity towards the affected social values. Therefore our future designs and implementations will be accompanied by appropriate design methods [26], [27] for detecting and avoiding unwanted ethical conflicts. These approaches are used to integrate moral aspects and human values into innovative design processes and to analyze the direct and indirect effects of the emerging services and technologies on the stakeholders.

In order to arrive at a better understanding of user reactions to automatically generated adaptations, e.g. when are they welcomed, when are they taken as manipulations, when aren't they recognized at all by the target applications' users, we will include these aspects into the mentioned lab study, both for a travel-booking application and a beauty products web-shop.

2.3 Adaptive User Interface Approaches

Some recent related approaches for adaptive user interfaces [28], [29] either focus on adaptation or migration to other devices and platforms, or also cover user-related context-adaptations.

In [30] a new approach for a website user interface adaptation architecture based on emotion interpretation is presented and evaluated in a study. The Perso2U architecture, like SitAdapt, uses various user observation tools. Two detection tools, Microsoft emotion API and Noldus FaceReader, are used to measure the emotional states when the same website contents are presented in different versions with a variable focus on usability and aesthetics. The emotional state values are aggregated to allow for a robust categorization of positive, negative, and neutral emotional states. The study showed that the level of similarity with respect to the emotional states recognized by both tools is good enough to use them as base tools for an aggregated approach to decision making based on emotion detection. In contrast to SitAdapt 2.0, however, Perso2U does not include a flexible implementation for using it as a generic runtime-adaptation platform.

Adapt-UI [31], like SitAdapt, offers runtime-adaptation of the user interface. The system focuses on context-of-use adaptations when migrating to other devices and platforms, but also manages some user-related aspects. The system exploits models of the user interface, the context, and the possible adaptations. It therefore uses three different modeling languages IFML, ContextML, and AdaptML. Like in SitAdapt 2.0, context-changes trigger adaptation rules. Such

rules can hide and show pre-modeled UI elements, change navigation paths in pre-modeled ways, and react to simple user-related aspects that can be provided by a face detection library.

With its underlying concept of situation-awareness SitAdapt 2.0 has a much broader view on possible adaptations and focuses more on user experience aspects and the individual requirements of the user for task accomplishment. SitAdapt rules can affect the models and UI artifacts of the target application, but also react to new situations by directly communicating with the business content of the application and by exploiting user interface patterns for runtime UI generation.

In [32] an architecture for an authoring tool A-UI/UX-A is presented that allows to build runtime-adaptive user interfaces that react to context changes and monitored user requirements. By comparing the adaptational features of earlier adaptive user interface environments, the authors explore new directions for possible runtime-adaptations. In addition to platform and environment aspects, the system, like SitAdapt, uses rules and exploits individual user characteristics that change over time. In a scenario-based study the authors observed that user feedback, social sharing and recommendation buttons can be exploited for finding new adaptation rules.

3 SitAdapt Implementation and Operation

The SitAdapt 2.0 Interpreter is an integrated software system for enabling situation-aware real-time adaptations for web and mobile applications. A recording component stores and synchronizes the various input signals as well as application meta-data in real-time (Figure 1). These data are interpreted by the situation analytics component that is responsible for deciding whether a dynamic adaptation is necessary or not and controls the generation of an appropriate modification of the target software at runtime.

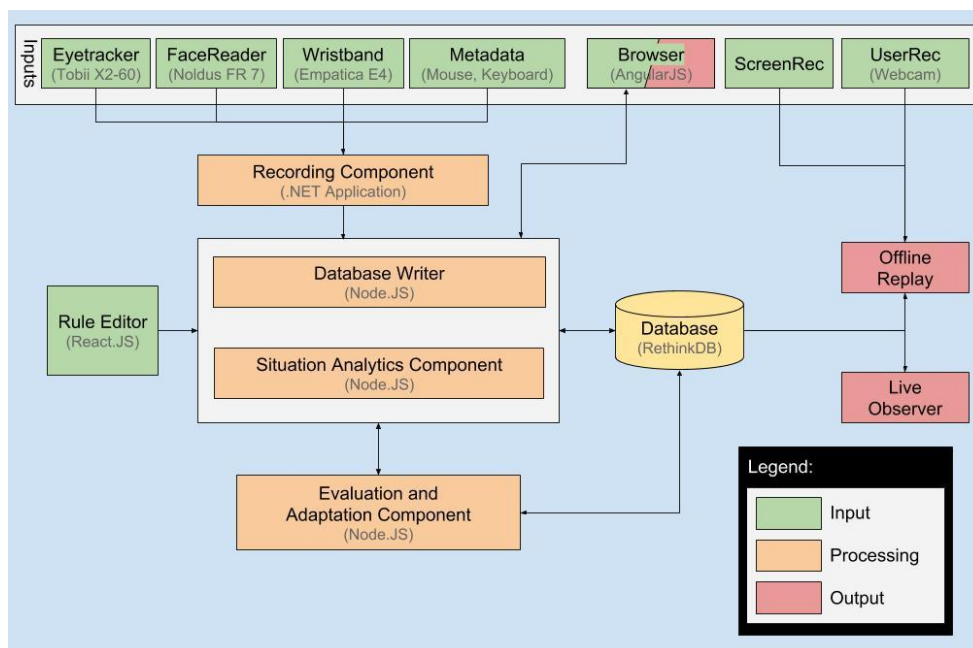


Figure 1. Structure and components of the SitAdapt Interpreter in its current implementation SitAdapt 2.0

When we designed the architecture and discussed the functional requirements for SitAdapt 2.0 we had in mind that the field of affective computing is currently evolving rapidly both from the soft- and hardware point of view. We therefore opted for building a completely new observer and analytics platform that can easily integrate future recording devices and synchronize the interfaces of previously unrelated input systems. We decided to use a rule-based approach for interpreting the various input data and for triggering real-time adaptations, because of the easy

way of accessing the collected situation analytics data and the resources of the coupled PaMGIS system. Future implementations could include a learning component that improves the quality of adaptations by altering and optimizing situation rules based on the assessment of the observed user reactions and level of task accomplishment.

In order to benefit from earlier results in the field of MBUID systems, we planned to integrate the SitAdapt interpreter into the PaMGIS (Pattern-Based Modeling and Generation of Interactive Systems) development framework from the beginning since we created our first prototype [9]. With the integration now fully operational this allows for at least three different use cases for the resulting development environment:

1. The SitAdapt 2.0 Interpreter can be used as a situation-rule-based stand-alone system for adapting all sorts of web applications at runtime. In this case the situation rules trigger adaptations via a direct interface to the application. The application has to provide the necessary resources or settings for modifying the user interface or the accessed content.
2. With the SitAdapt 2.0 Interpreter integrated into the PaMGIS framework, adaptations due to context and situational changes can be modeled at design time. The user interface or even the accessed business objects will be adapted at runtime, if a pre-modeled situation or context change arises. The resources for adaptation are kept in the pattern and model repositories of the PaMGIS system.
3. The integrated framework can also be used for enhancing web applications with support for modeling and adaptation, e.g. user interface and task models can be added to an existing app without a priori models. The new models can link an app to model and code fragments that are used for implementing possible adaptations. When a predefined situation occurs, situation rules trigger the generation of the adaptations typically in one or more additional windows or by generating separate interaction objects or actions.

In the following sections the components of the SitAdapt 2.0 system are discussed in detail.

3.1 Data Interfaces

Data interfaces are established between the different devices (eye-tracker, wristband, facial expression recognition, metadata from the application) and the recording component. Our prototypical adaptive applications were built with Angular JS and are executed in the browser. The communication between the application and the PaMGIS models, if available, is controlled by the situation analytics and the adaptation components.

SitAdapt uses two different data types for the generation and adaptation of the user interface received from the different input devices (Figure 1). *Atomic* data types and *temporal* data types. Temporal data management makes it possible, to document and analyze changes in the recorded data by time-stamping these data. This allows to reconstruct, which value was valid at which time. For instance, blood pressure or eye positions. With the aid of the SitAdapt rule editor (Figure 2), these temporal data can be used to create rules, that have an effect on the adaptation of the user interface.

Atomic data types are static data types like age or the wearing of glasses by a user. These data can be incorporated directly into the context of use user model (Figure 4) or for combination with temporal data in the rule editor.

3.2 Recording Component

The recording component synchronizes the different input records with a timestamp. The component also records the eye- and gaze-tracking signal of the user and observes his or her emotional video facial expression with the Noldus FaceReader software as a combination of the six basic emotions (happy, sad, scared, disgusted, surprised, and angry). Other recorded data about the user are, e.g. age-range and gender. The stress-level and other bio-physical data are

recorded by reading the data from a wristband or other signal-emitting devices in real-time. In addition, mouse movements are protocolled. Tables 1 to 4 lists all the values that are recorded by the SitAdapt System.

Table 1. Data input from the eyetracking system

Attribute	Possible Values	Description
LeftPupilDiameter	between ca. 2.0 and 8.0	Describes the dilation of the subject's left pupil in mm.
RightPupilDiameter	between ca. 2.0 and 8.0	Describes the dilation of the subject's right pupil in mm.
LeftEyeX	between 0.0 and 1.0	Indicates the normalized x-coordinate of the subject's left eye.
LeftEyeY	between 0.0 and 1.0	Indicates the normalized y-coordinate of the subject's left eye.
RightEyeX	between 0.0 and 1.0	Indicates the normalized x-coordinate of the subject's right eye.
RightEyeY	between 0.0 and 1.0	Indicates the normalized y-coordinate of the subject's right eye.

Table 2. Input data from emotion tracking

Attribute	Possible Values	Description
Angry	between 0.0 and 1.0	Indicates to what degree the user appears angry.
Disgusted	between 0.0 and 1.0	Indicates to what degree the user appears disgusted.
Happy	between 0.0 and 1.0	Indicates to what degree the user appears happy.
Neutral	between 0.0 and 1.0	Indicates to what degree the user appears neutral.
Sad	between 0.0 and 1.0	Indicates to what degree the user appears sad.
Scared	between 0.0 and 1.0	Indicates to what degree the user appears scared.
Surprised	between 0.0 and 1.0	Indicates to what degree the user appears surprised.
Contempt	between 0.0 and 1.0	Indicates to what degree the user appears full of contempt. Contempt is defined as the feeling that a person or a thing is beneath consideration, worthless, or deserving scorn.
Valence	between -1.0 and 1.0	Describes how positive/negative an emotion is. -1 means very negative.
Arousal	between 0.0 and 1.0	Describes how strong the emotion is. A person that is yelling in anger, for instance, has a higher arousal than a person who is only pulling their eyebrows together.
Quality	between 0.0 and 1.0	Roughly describes the quality of the observation
Age	Age range („from-to“)	Describes a numeric interval for the estimated age of the user.
Beard	„None“, „Some“, „Full“	Describes the extent of the subject's lower facial hair.
Moustache	„None“, „Some“, „Full“	Describes the extent of the subject's upper facial hair.
Glasses	„Yes“, „No“	Describes whether or not the user is wearing glasses.
Ethnicity	„Caucasian“, „Eastern Asian“, „South Asian“, „African“, „Other“	Describes the ethnicity of the subject based on visual appearance.
Gaze Direction Identity	„Left“, „Right“, „Forward“	Describes in which direction the subject is looking.
Identity	„unknown person“, „no identification“	Identifies the user based on the current Noldus Face-Reader session's profiles.
Left Eye	„Open“, „Closed“	Describes the state of the user's left eye.
Right Eye	„Open“, „Closed“	Describes the state of the user's right eye.
Mouth	„Open“, „Closed“	Describes the state of the user's mouth.
Left Eyebrow	„Raised“, „Lowered“, „Neutral“	Describes the state of the user's left eyebrow.
Right Eyebrow	„Raised“, „Lowered“, „Neutral“	Describes the state of the user's right eyebrow.

Table 3. Input data from the wristband

Attribute	Possible Values	Description
x	between -128 and 127	Acceleration value for the x axis
y	between -128 and 127	Acceleration value for the y axis
z	between -128 and 127	Acceleration value for the z axis
bvp	between -1000 and 1000	Blood Volume Pulse "derived from the light absorbance of the arterial blood.
gsr	between 0 and 6	Galvanic Skin Response, a measure of the skin's electrical conductivity, "expressed in microsiemens"
tmp	between 15 and 40	Temperature in degrees Celsius.
ibi	between 0.4 and 1.9	Interbeat Interval, "the distance from the previous detected heartbeat in seconds."
hr	between 30 and 160	Heartrate in beats per minute
bat	either 0.01 or 0.1	Battery level (note this value appears to be bugged)

Table 4. Metadata from the application

Attribute	Possible Values	Description
MouseX	between 0 and [screenwidth]	The X position of the mouse in relation to the monitor for a mouseMove event.
MouseY	between 0 and [screenheight]	The Y position of the mouse in relation to the monitor for a mouseMove event.
MousePageX	between 0 and infinite	The X position of the mouse in relation to the page for a mouseMove event. This is effectively MouseX + the horizontal scroll distance.
MousePageY	between 0 and infinite	The Y position of the mouse in relation to the page for a mouseMove event. This is effectively MouseY + the vertical scroll distance.
MouseclickX	between 0 and [screenwidth]	The X position of the mouse in relation to the monitor for a mouseClick event.
MouseclickY	between 0 and [screenheight]	The Y position of the mouse in relation to the monitor for a mouseClick event.
MouseclickPagX	between 0 and infinite	The X position of the mouse in relation to the page for a mouseClick event. This is effectively MouseclickX + the horizontal scroll distance.
MouseclickPageY	between 0 and infinite	The Y position of the mouse in relation to the page for a mouseClick event. This is effectively MouseclickY + the vertical scroll distance.
ClickedElement	e.g. "flight_book"	The ID of an html element (for instance, a button) that was clicked on.
URL	e.g. "http://localhost:3003/app/#!/views/flightbook"	The address of the current page.

3.3 Database Writer

The database writer stores the data from the recording component and from the browser in the database, where the raw situations and situation profiles are managed, and also controls communication with the rule editor (see Figure 2).

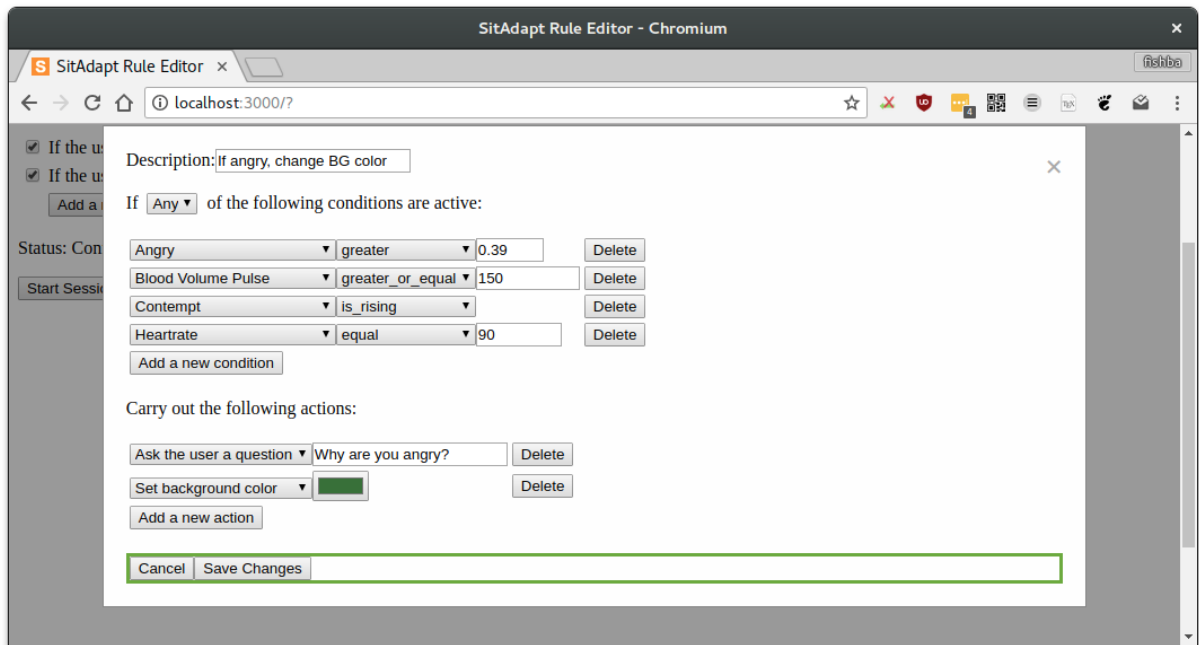


Figure 2. SitAdapt 2.0 Rule Editor

3.4 Rule Editor

The rule editor allows the definition and modification of situation rules, e.g. for specifying the different user states (e.g. if an angry state is observed, it will only become relevant, if the state lasts more than five seconds and the grade of the emotion surpasses a certain activation level) and the resulting actions. The rule editor is very flexible and can use all input data types and values and their temporal changes for formulating rule conditions.

Figure 2 shows the creation of a simple situation rule with four conditions and two simple actions. Figure 3 shows, how existing situation rules are activated at design time. At runtime they are fired by the situation analytics component for adapting the user interface, if the conditions of one or more rules apply. In this example none of the PaMGIS models is affected and only a dialog with the user or a modified presentation attribute is created. However, situation rules can also activate HCI-patterns in the pattern repository. These patterns come with different levels of abstractions. They may contain concrete templates for generating interaction objects or modifying low-level user interface attributes. A more abstract HCI-pattern can be exploited by the PaMGIS framework at runtime to generate user interface adaptations from predefined UI-, task-, or domain-model fragments directly referenced by the HCI-pattern.

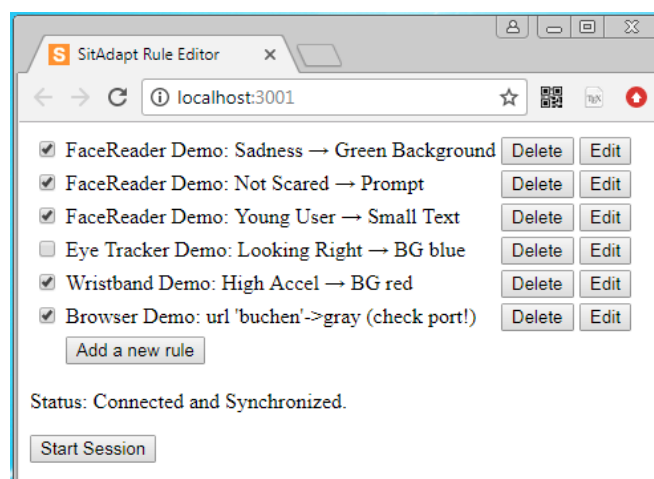


Figure 3. Preselected situation rules that are active at application runtime

3.5 Situation Analytics Component

The situation analytics component analyzes and assesses situations by exploiting the observed data. Situation rules are fired by the situation analytics component when the rule conditions are satisfied. Situation rules interact with the situation profiles stored in the SitAdapt database. The rule actions either directly trigger simple adaptations or interact with the PaMGIS resources as described above.

3.6 Evaluation and Decision Component

The evaluation and decision component uses the data that are provided by the situation analytics component to decide whether an adaptation of the user interface is currently meaningful and necessary. For this purpose the component evaluates one or more applicable situation rules and has to solve possible conflicts between the rules. Whether an adaptation is meaningful depends on the predefined purpose of the situation-aware target application. Goals to meet can range from successful marketing activities in e-business, e.g. having the user buying an item from the e-shop or letting her or him browse through the latest special offers, to improved user experience levels, or to meeting user desires defined by the hidden mental states of the user.

Such goals can be detected, if one or more situations in the situation profile trigger an application dependent or domain independent situation rule. Situation rules are related to patterns. They define behavioral and context-related situational patterns. If the decision component decides that a complex adaptation is necessary, it has to provide the artifacts from the PaMGIS pattern and model repositories to allow for the modification of the target application by the adaptation component. The situation rules provide the links and control information for accessing and composing HCI-patterns and model fragments, necessary for constructing the modifications.

3.7 Adaptation Component

The adaptation component finally generates the necessary modifications of the interactive target application. The process for modeling adaptations is discussed in Section 4.

Together these architectural components provided by the SitAdapt Interpreter are necessary for enabling the PaMGIS framework to support automated adaptive user interfaces.

4 Modeling Adaptations

The SitAdapt interpreter is integrated into the PaMGIS-framework (Figure 4), a pattern- and model-based MBUID environment that uses the ontological domain- and context models as proposed by the CAMELEON reference framework (CRF) [6].

The SitAdapt interpreter has full access to all sub-models of PaMGIS and directly interacts with the user interface model. It supports (semi-)automated dynamic adaptation before and during runtime [33]. Within CRF-conforming systems the abstract user interface model (AUI) is generated from the information contained in the domain model of the application that includes a task model and a concept model and defines abstract user interface objects that are still independent of the context of use.

The AUI model can then be transformed into a concrete user interface model (CUI) that already exploits the context model and the dialog model, which is responsible for the dynamic user interface behavior. The next step generates the final user interface model (FUI) by parsing the CUI model.

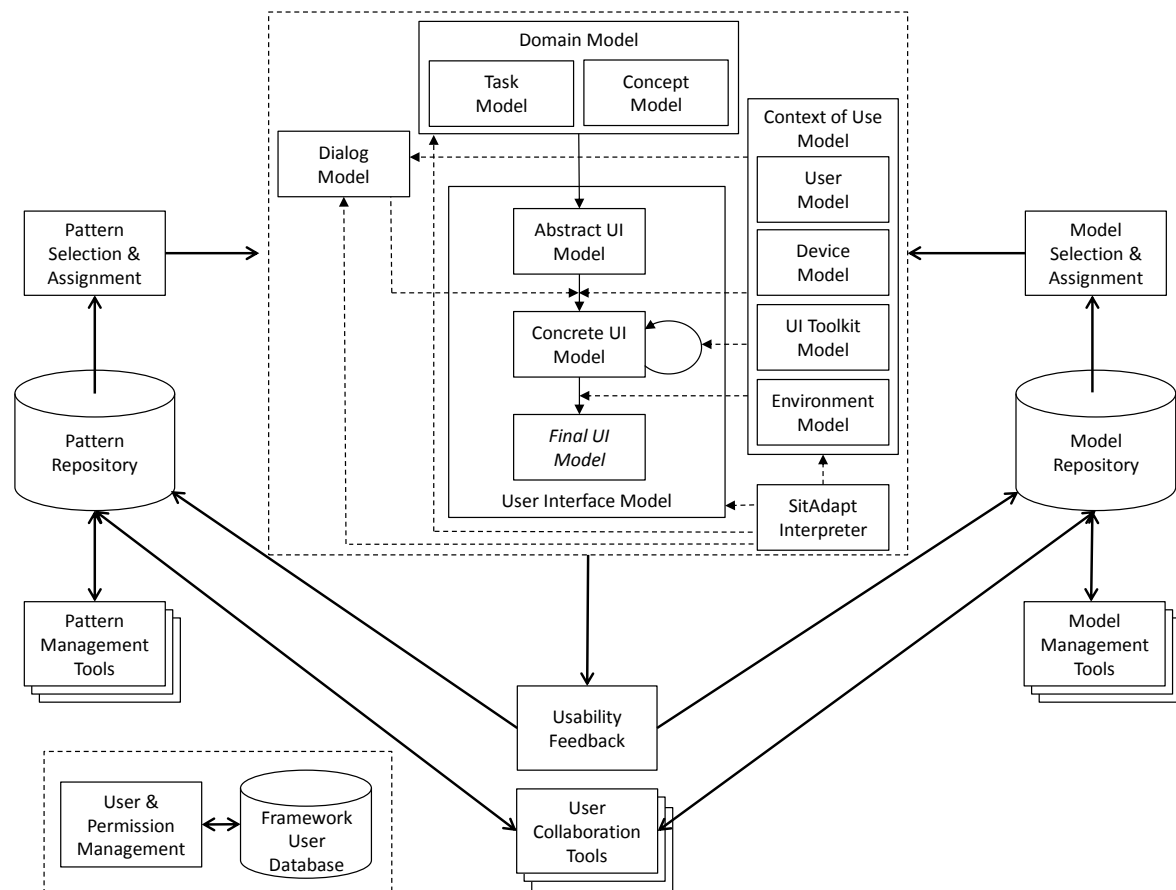


Figure 4. PaMGIS MBUID framework with SitAdapt Interpreter and communication flow for CRF-model interaction [10]. The situation analytics component resides in the SitAdapt Interpreter. Adaptations triggered by the situation analytics component may involve the pattern and model resources of the PaMGIS framework.

If an adaptation requires predictable structural changes of the user interface or different task workflows, an adaptation variant can be modeled by providing alternative models for all affected modeling levels. The technical details of the adaptation process are discussed in [10].

For implementing the situation-aware adaptation process, the task, dialog and context of use models are the most relevant of the PaMGIS sub-models. The user model holds both static information about the user and dynamic data describing the emotional state as well as the biometric state. It is structured as follows [10]:

```

<UserCharacteristics>
  <UserIdentData>
  <UserAbilities>
    <USRUA_Agerange>
    <USRUA_Visual>
    <USRUA_Acoustic>
    <USRUA_Motor>
    <USRUA_Mental>
  <UserExperiences>
    <USRUE_Domain>
    <USRUE_Handling>
  <UserDistraction>
  <UserLegalCapacity>
  <UserEmotionalState>
  <UserPsychologicalState>

```

Not all of these attributes need to be filled with concrete data values. The dynamic values concerning emotional state and biometric state are taken from the situation profile that resides in the SitAdapt database, whenever an adaptation decision has to be made. Note, that the situation profile that is generated by the SitAdapt Interpreter contains the whole sequence of emotional and biometric user states from session start until session termination. The temporal granularity of the recorded raw situations is variable. An example of a situation profile with a granularity of one second for a ticket booking application is the following:

```

<SituationProfile>
  <TargetApplication>
  <User>
  ...
  <Situation_booking>
    <SituationTime> 29 s
    ...
    <Eye_Tracking> eye_t(29 s)
    ...
  </Situation_booking>
  <Situation_booking>
    <SituationTime> 30 s
    <FUI_link> Wizard_Part_1
    <AUI_link> model_AUI_1
    <CUI_link> model_CUI_1
    <Dialog_link> order_ticket
    <Task_link> order_ticket
    <Concept_link> concept_1
    <Eye_Tracking> eye_t(30 s)
    <EmotionalState> neutral
  <UserPsychologicalState> tired
  <BiometricState>
    <Pulse> normal
    <StressLevel> orange
  </Situation_booking>
  ...
</SituationProfile>

```

Along with the recorded data, the situations are also linked with the PaMGIS models of the currently used interactive components. The links can be modified whenever an adaptation occurs. Via the FUI_link information about the currently used interaction object as well as the mouse and keyboard input data is immediately available.

Before starting a target application, a UI configuration file is generated that contains a ContextOfUse tag field for each modeled task. It has sub-tags that may serve as context variables holding information relevant for controlling the UI configuration and later, at runtime, the adaptation process.

For instance, one of the sub-tags may contain information that a task “ticket sale” is only authorized for users from age 16. When the situation analytics component at runtime discovers that the current user is less than 16 years old, a hint is given in the final user interface (FUI) model that she or he is not authorized to buy a ticket.

5 SitAdapt at Work

Designed alongside SitAdapt 2.0, we developed a prototypical travel-booking web application to highlight and evaluate some of the system's capabilities. As a second domain for evaluating the measuring and decision making qualities of the SitAdapt 2.0 architecture, we selected a commercial web-shop for beauty products, where we executed a user study for measuring customer experience and detecting new user personas.

5.1 Travel-Booking Web Application

The application features elements typical for e-commerce applications, including the ability to enter query parameters, viewing and selecting query results, viewing product details, registering as a new user, logging in, modifying a selected product, and viewing a summary of all entered data before making a purchase.

Having the ability to collect information about a user's physical, physiological and emotional properties allows application designers to offer products and product enrichment opportunities ("extras") that center on the user's immediate and/or long-term needs, benefitting producers and consumers. In the field of air travel, for instance, knowledge of a user's demographic and his or her current disposition can influence the kinds of seat and airline upgrade opportunities offered to the user.

In our first example (Figure 5), the system can recognize fear, anger, or a higher pulse rate, while a user is in the process of choosing a flight. In response, it offers an effective remedy to combat the customer's fear of flying and/or other negative flight-associated emotions.

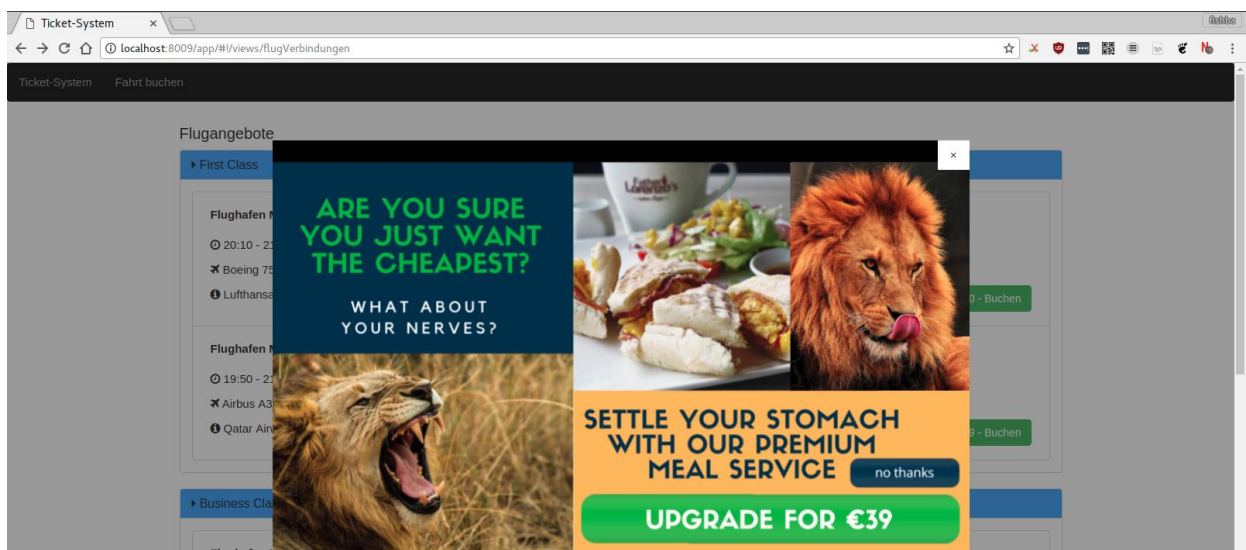


Figure 5. Offering an additional meal service

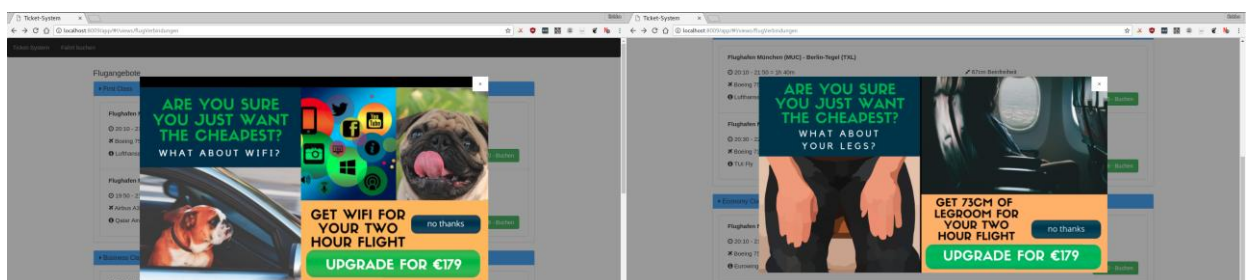


Figure 6. (a) Offering Wi-Fi upgrade for young passengers. (b) Offering more legroom for senior citizens.

In the second example (Figure 6a, b), the system uses a demographic-focused approach to determine positive flight-related desires and presents an option to fulfill these desires to the user. A user between the ages of 15 and 40 may be presented with an option to purchase Wi-Fi access, while for users with an age over 50 a seat upgrade opportunity may be presented to increase their level of comfort throughout the flight.

Additional sensor information can be used to make predictions about the likelihood of users taking advantage of these product enrichment opportunities. Eye tracking and browser-based mouse-tracking data can offer information about customers' financial flexibility as they consider

or reconsider their budgetary restrictions when looking at the different opportunities. Such data can be exploited by specific situation rules.

The SitAdapt interpreter’s capabilities used by the prototypical applications are not limited to targeted advertising. Application developers can also use our system to change color schemes to appeal to the user’s current mood, change layouts to suit demographic-based technological prowess, change styles to suit possible accessibility needs, record specific diagnostic information and offer help (or ask for specific feedback) when a user becomes frustrated with a certain feature.

5.2 Customer Experience Evaluation in a Beauty Products Web-Shop

In a recent user study with 9 female test persons we tested the usability, user experience and emotional behavior for different scenarios when interacting with a real-world cosmetics industry web-portal [34]. These tests served as the basis for finding typical domain-dependent situations and formulating situation rules.



Figure 7. Emotional reaction when reading the textual description after finding the right product [34]

In order to illustrate the potential of situation-aware adaptation we present some real-world situation examples and possible adaptive reactions. In the first example (Figure 7) a test person is searching for a specific winter skin cream. Upon reading the detailed description of the product *Winter Silk Crème*, the user’s emotional state significantly changes to *happy*. A situation rule could now exploit this knowledge to give additional information about other winter products.

In the next example (Figure 8 and Figure 9), the system has gathered a priori knowledge about the varying fixation behavior of test persons, who are either recurring customers of the business or who are here for the first time, by distinguishing between the lab-created heat maps. The fixation behavior can be exploited to categorize anonymous users. The customer experience during the pre-purchase phase can be improved. When the system assumes a returning customer, the focus will be put on showing some related aesthetic images or backgrounds, while in the other case more descriptive information will be given during the rest of the session.



Figure 8. Heatmap for customers of the business [34]. Fixation focuses on subjective information.

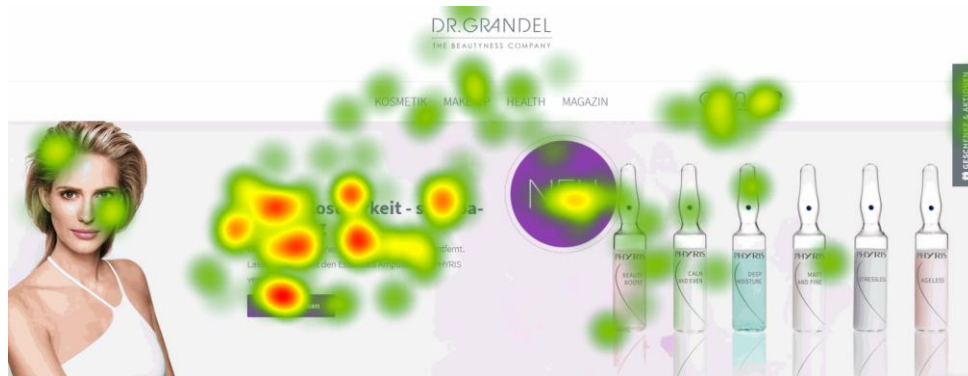


Figure 9. Heatmap for first time users of the website [34]. Fixation focuses on content information.

Another application area for using situation analytics in the e-business field is the evaluation and fine-tuning of pre-defined customer personas, which are used for pre-runtime adaptations and configurations of an application. Focusing on personas for a priori adaptation of the cosmetics portal can, e.g. affect the visual appearance, the product content structure, the level of the product description language, the appearance of special advertisements, or the gaming and social media orientation of the website. Are test persons behaving like their respective personas or are there significant deviations from the expected behavior? This can be evaluated by comparing the situation profiles that come up during persona-adapted user tests with the typical situation profiles specified during the persona definition process.

On the other hand SitAdapt 2.0 can also classify unknown customers or first time visitors into one of the given persona categories by analyzing the situations appearing during the session and by analyzing the users' behavior after situation-rule triggered adaptations.

In a final example we specify a situation rule that can also be used in the beauty products webshop environment. Here, SitAdapt recognizes the user's interest in a certain product. After three minutes a text is displayed that notifies the user that in case of the purchase of product (Id) within a certain time-span, a voucher is granted for the user's next purchase. A link to the voucher-processing task in the task model is activated:

```
<SituationRule> OfferingVoucher
  FOR N <Situationi> IN 180s
  <Eye_Tracking> Field Product Product(Id)
  <Gaze_Tracking> Contains Field Product
  Product(Id) (>5)
  <Pulse> (85-100)
  <PulseRate> rising
  <Emotion> excited
  <StressLevel> orange
  <Action> SHOW AT 180s VoucherText1FUI
  <Action> WAIT VoucherText1FUIInput
  <Action> LINK VoucherText1FUIInput
  TaskModel VoucherProcessingTask
```

All of these user observations and behavior evaluations as well as the adaptations of the interactive software are currently still carried out in our situation analytics lab environment. The rapid evolution of visual and biophysical user tracking and monitoring technology for use in (mobile) standard platforms and environments will enable situation-aware individual adaptations for the end user in the near future.

6 Conclusion

In this article we have presented the SitAdapt 2.0 system that supports situation-aware dynamic adaptations of the user interface at design and runtime. The system is currently being evaluated for several business applications in a use- and situation-analytics-lab environment.

The evaluation process includes user studies for both the travel-booking application and the beauty products portal and will assess the quality of the real-time adaptations during a session, their impact on task accomplishment, on usability, as well as on the way users perceive and rate such adaptations with respect to user experience, privacy, and possible manipulative effects.

We use the results for different purposes:

- Defining and testing situational patterns and possible user interface adaptations
- Testing ideas for digital marketing activities in the later stages of the customer journey
- Identifying domain-dependent and domain-independent user personas
- Analyzing recorded user and meta-data to mine correlations between visual, bio-physical and mouse- and keyboard tracking data in order to support anonymous or at least less intrusive support for emotion-based adaptations in the future.

In order to also record and assess the cognitive load, the attention level, and stress-related parameters we have recently added g.Tec EEG measurement hard- and software to our lab equipment and integrated it into the SitAdapt architecture. We are currently carrying out a large study within the customer experience domain, where we are interested in comparing and aggregating the results obtained with visual emotion recognition software with the data gathered with the brain-computer interface equipment.

We expect a rapid evolution of visual and sensor-based emotion recognition technology and its hard- and software integration into all device types from desktop computers to smart phones and other personal devices. If the recorded data can be securely kept privately on the devices, the benefits generated from individualized adaptations will be experienced by the users without compromising their privacy.

Better user experience and task accomplishment, fine-tuned with privacy-keeping ethical and value-based design strategies can thus also drive the success of business models built around situation-aware software technology.

Acknowledgements

We would like to thank our reviewers for the valuable comments and hints for possible future research directions and the Dr. Grandel GmbH for letting us use their real-world E-Business platform for experimental purposes.

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