A platform-independent robot control architecture for multiple therapeutic scenarios

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Abstract. While social robots are developed to provide assistance to users through social interactions, their behaviors are dominantly pre-programmed and remote-controlled. Despite the numerous robot control architectures being developed, very few offer reutilization opportunities in various therapeutic contexts. To bridge this gap, we propose a robot control architecture to be applied in different scenarios taking into account requirements from both therapeutic and robotic perspectives. As robot behaviors are kept at an abstract level and afterward mapped with the robot's morphology, the proposed architecture accommodates its applicability to a variety of social robot platforms.

1 INTRODUCTION

Social robots are developed to provide assistance to users through social interaction with appropriate behaviors, and expected to exhibit natural-appearing social manners and to enhance the quality of life for broad populations of users [29]. Robots with a high degree of autonomy are particularly desirable in Robot-Assisted Therapy (RAT) [31]. Currently, robots' behaviors are dominantly pre-programmed and remote-controlled (Wizard-of-Oz technique) [5, 9, 15, 24]. In an attempt to address the shortcomings of these techniques, numerous architectures have been developed to aid social robots in autonomous decision making, e.g. [3, 7, 13, 19, 34, 36]. Among these architectures, the behavior-based approach [1] is dominated while the robot behaviors should go further into adaptive behaviors to create a more efficient interaction e.g. natural language interaction, learning to generate more appropriate and personalized behaviors [14, 31]. Additionally, most of the efforts nevertheless employ ad-hoc solutions for particular therapies and robot platforms, and thus cannot be applied to any other therapeutic situations. To fill this gap, this paper proposes a platform-independent robot control architecture applicable in multiple scenarios based on requirements from therapeutic and robotic perspectives. We do not aim to improve the technical or therapeutic performance of the robot behavior, but to enable the robot control architecture to be easily applicable for different scenarios and robot platforms.

2 STATE OF THE ART

Researchers have developed a number of architectures to aid social robots in autonomous decision making for various therapeutic

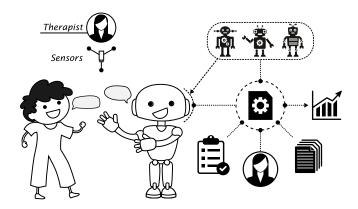


Figure 1. Elements related to a platform-independent robot control architecture for multiple therapeutic scenarios: interaction protocol and goal, therapist, different scenarios, data for analysis, and different robot platforms.

applications with different roles e.g. companion, therapeutic play partner, coach. Companion robots are typically in the shape of animals, e.g. PARO, AIBO, with basic reactive behaviors and emotions to interact with children with autism [28], and elderly with dementia [34] or loneliness [2], etc. Some studies focus on using robots as therapeutic play partners mainly with children with autism in which the robots are used along with human therapists [23]. Architectures used in these studies are symbolic e.g. sense-plan-act (KASPAR) [36], homeostatic-based with physiological and affectional needs (Probogotchi) [27], arbitration between task-based action and social/emotional action (Bandit and Pioneer) [12, 13]; or neural networks e.g. Robota [6, 4], FACE [21]. Robots can be also used as coaches in therapies e.g. physical exercise (Bandit and Pioneer) [11], rehabilitation (Bandit and Pioneer) [35], children affected by diabetes (NAO) [3]. Robot behaviors in these applications are generated taking into account both the scenario and user's information such as user's performance or emotional feedback. Overall, most of the above-mentioned studies employ ad-hoc solutions for particular therapies and robot platforms, and thus cannot be applied to any other therapeutic situations.

3 ARCHITECTURE REQUIREMENTS

Robot-assisted therapy research requires interdisciplinary collaboration. A robot control architecture for RAT should meet requirements from both therapeutic and robotic perspectives. Okamura *et. al* suggested ten desired system capabilities the robotic systems must have for ideal integration into medicine and healthcare focusing on tech-

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nical issues [20]. Therapists, on the other hand, pay more attention to the therapeutic process and ethical issues [10, 8]. We hereby summarize different perspectives into five main requirements for a robot control architecture, as a part of the robotic system, to enable the system to acquire the desired capabilities. Figure 1 illustrates the elements related to these requirements.

3.1 Sustaining user's motivation and engagement

User's motivation and engagement significantly influence the therapeutic performance. Both extrinsic motivation (driven by external rewards) and intrinsic motivation (self-triggered based on enjoyment and satisfaction) need to be maintained during all phases of the therapeutic process e.g. diagnosis, intervention, prevention [10, 11]. From a therapeutic perspective, the human-robot interaction should be personal (e.g. personality adaptation, personal information, performance history) and have an interesting play scenario with different levels of difficulty [11, 22, 30]. Taking these inputs, the robot behavior controller creates a fluid interaction with the user generating believable and coherent behaviors.

3.2 Achieving the goal of interaction

While most robot behaviors are generated based on the robot's "well-being", robots used in RAT are designed to help a user obtain particular therapeutic goals with well-structured interaction protocols. The robot's decision making, therefore, has to follow the interaction protocol. Moreover, the robot behaviors should strictly conform to ethical issues (e.g. vocabulary, cognition and affect, decision making and action) defined in user-caregiver interaction manuals or by experts [18]. To ensure the goal of interaction to be reached, the robot's operation should always be under the guidance of human therapists [8].

3.3 Therapeutic scenario-independence

In order to go beyond ad-hoc solutions for particular therapies, the robot behavior architecture should be highly adaptable to different therapeutic scenarios. Architecture modules developed for a scenario might be reusable for another one without significant modification.

3.4 Platform-independence

Being platform-independent is another requirement to move beyond ad-hoc solutions. A recent trend in social robotics focuses on coding robot behaviors by using parameters e.g. [17, 26, 32]. Rather than controlling actuators specific to one robot platform, the architecture will prescribe parameters in descriptions and representations that are common across all platforms. Afterward, these robot non-specific commands will be translated into robot-specific actions. Consequently, behaviors developed for a certain robot can be transferred to another without reprogramming.

3.5 Providing data for analysis

In RAT research, therapists and roboticists might have different interests in extracted data. The robot behavior architecture should provide data (e.g. therapeutic performance, user's performance history, robot operation) recorded in structured forms to different parties.

4 ARCHITECTURE DESIGN

4.1 Architecture's key specifications

We propose five key specifications that a platform-independent robot control architecture should have to fulfill the requirements defined in Section 3:

- 1. Human-robot personality adaptation
- User's profile and affect influencing behavior generation and realization
- 3. Platform-independent behavior
- 4. Supervised-autonomy
- 5. Modular multi-layer behavior architecture

The first two specifications related to user's personality and emotion create a personal interaction and hence contribute to sustain user's motivation and engagement. The platform-independent behavior directly supports the system to be independent with the robot platform. Supervised-autonomy allows therapists to control the whole process of the robot system to ensure that the therapeutic goal can be reached. Lastly, designing an architecture with a modularity approach mainly contributes to therapeutic scenario-independence but more or less supports the other requirements.

4.2 Architecture's working principle

Figure 2 illustrates the working principle of the architecture to obtain the five aforementioned specifications. The architecture should be designed with a robot's personality module in which its parameters are adapted to user's personality. The personality determines the varied rates of mood and emotion when a certain event occurs. The behavior is generated based on the robot's personality and the user profile, therapeutic scenario, and self-monitoring rules. The generated behavior is realized taking into account the personality and robot's morphology. The whole system is supervised by a therapist.

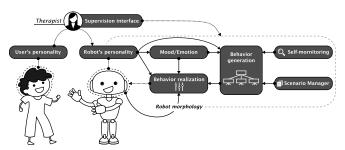


Figure 2. Architecture's working principle. Robot behavior is generated taking into account user's profile, robot platform, scenario, physical and ethical limits. The whole system is supervised by therapist.

4.3 Design of a platform-independent robot control architecture for multiple therapeutic scenarios

Following the working principle, we design an architecture with modules as depicted in Figure 3. The behavior controller, the center of the architecture, takes inputs from the perceptual system, user profile, scenario manager, supervision interface, and the memory - to generate proper behaviors.

The *Perceptual system* is responsible for gathering information concerning the human-robot interaction. The system receives raw

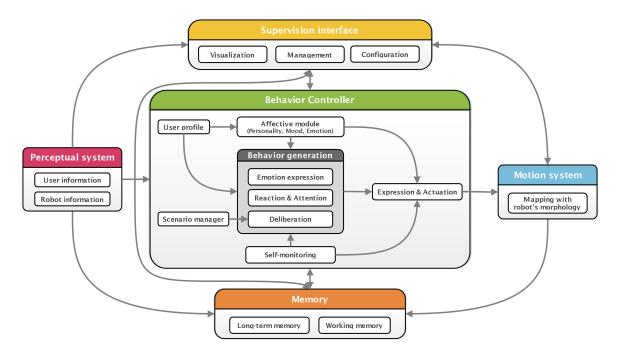


Figure 3. Description of the robot control architecture. Depending on the therapy and robot platform, therapeutic supervisors decide which modules to use and the processing mechanisms for each module.

data from sensors (e.g. camera, touch sensors) and then interprets into interaction events and user's performance (e.g. level of engagement) as inputs for the *Behavior controller*.

The Behavior controller includes a number of modules to generate robot behaviors. The behavior generation is the main module organized with different layers of behavior. The Emotion expression module displays the internal robot emotion managed by the Affective module. The Reactive and Attention module generates life-like behaviors, perceptual attention, and attention emulation to create the illusion of the robot being alive [16, 25]. The Deliberation module generates deliberative behavior to follow the therapeutic scenario if users are engaged in a task and otherwise to (re)engage them to the task. The robot behavior is therefore more adaptive to the user and the interaction context [14, 31]. The behavior generation in these three modules is checked by applying the technical and ethical rules in the Self-monitoring module. Later, the Expression and actuation module combines the three generated behaviors into a unified one. The unified behavior is abstract and coded by the Facial Action Coding System and Body Action Units [32]. Parameters of the unified behavior are adjusted taking into account influences from the affective module (personality, mood, and emotion). Finally the abstract behavior is translated into robot-specific actions in the Motion system.

The architecture operation is visualized, managed and configured through the *Supervision interface*. This will enable the therapist an ability to select the scenario, supervise the behaviors of the robot, and interrupt the robot's operation if necessary.

In this architecture, we do not specify which computational model is used in each module e.g. affect model, behavior generation mechanism, behavior mapping method. Depending on the therapy, therapeutic supervisors decide which modules to use and the processing mechanisms for each module.

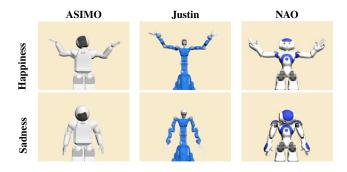


Figure 4. Examples of upper-body emotional expressions in different robots: Happiness and Sadness [32].



Figure 5. Child-robot interaction with NAO (left) and Probo (right).

5 DISCUSSION AND CONCLUSION

This paper proposes the design of a platform-independent robot control architecture for multiple therapeutic scenarios. Requirements from literature of therapy and robotics have been analyzed in order to decide appropriate modules for the architecture. The selection of computational models and processing mechanisms for modules are dependent on the therapeutic supervisors. Computational models for each module will be selected based on popular modules in human-robot interaction and virtual reality studies e.g. Five-Factor model of personality, circumplex model of affect, homeostatic drive theory for behavior decision. The integration of the modules in real-life application will face a number of technical challenges e.g. real-time communication and computation, the combination of action outputs from different modules. Other challenges might include correctly evaluating user's personality and solving conflict among different ethical rules, etc.

As for validation, the architecture will be implemented in robot-assisted autism therapy scenarios e.g. joint attention, turn taking, and imitation. The utilized robot platforms will be Nao and Probo [33] as depicted in Figure 5. Based on our previous work, a number of modules will be re-utilized. The behavior generation will be based on the homeostatic drive approach [7, 27]. The generic method to generate actions for different robots in [32] will be applied in therapeutic contexts (Figure 4). For this method to work in real-time is inevitably one of the biggest challenges foreseen. Experimental results will be used to evaluate the architecture performance e.g. comparing with the Wizard-of-Oz setup, assessing the applicability with different robot platforms and therapeutic scenarios.

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