Teamwork Design Based on Petri Net Plans

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Abstract. This paper presents an implementation of cooperative behaviors based on Cohen's and Levesque's Joint Commitment Theory through Petri Net Plans. Petri Net Plans formalism is used for the design of multi-robot plans, embodying the guidelines for the design of teamwork provided by the theory. Petri Net Plans are able to represent complex plans in highly dynamic, partially observable and unpredictable environments, providing all means necessary to achieve multirobot action synchronization and interruption. Experimental results are shown through the implementation of a robotic-soccer passing task, performed by Sony AIBO robots.

1 Introduction

The design of complex robotic behaviors in dynamic, partially observable and unpredictable environments is a crucial task for the development of effective robotic applications. The annual RoboCup soccer competitions provide an ideal testbed for the development of robotic behavior control techniques, as the design of behaviors in the roboticsoccer environment requires the definition of expressive plans for the performance of complex tasks.

Petri Nets [5] are an appealing modeling tool for Discrete Events Systems, that has been used in several works for the modeling of robotic behaviors. [2] provides an interesting formal approach for the modeling and analysis of single-robot tasks, and in [8] it is shown how Petri Nets can be used to model a multi-robot coordination algorithm for environment exploration. In this work we adopt Petri Net Plans (PNPs [11]) for the definition of robotic behaviors. This representation framework allows intuitive design of complex plans, and multi-robot interactions can be designed through multi-robot plans.

Cooperation in multi-robot systems plays an important role, as teamwork can lead to consistent performance improvements. Several RoboCup teams achieve cooperation facilitating interaction through the assignment of individual behaviors, as for instance through the tactical placements of the team members in the soccer field. Some works have studied the possibility of a structured approach to the design of cooperation, for which coordination and synchronization is required. In [10], synchronization through explicit communication is used to attain cooperation on real robots. Implicit communication is used in [6] for the performance of a pass behavior among the members of a

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team in the RoboCup Simulation League, while in [4] (also in the RoboCup Simulation League) a neural network is employed to learn the conditions associated to the performance of a pass. In [12] a team participating in Robocup Rescue, Virtual Robot League uses stigmergic and explicit communication to achieve cooperation. In these works, the engagement of cooperation is not usually explicitly modeled, and it is difficult to handle situations, such as action failures, in which the robots have to withdraw the cooperative execution. In [9], the Joint Commitment theory [1] has been used to guide the implementation of cooperative passes through finite state automata. In our work the principles for cooperation outlined by the Joint Commitment theory are modeled through Petri Nets, which are provably more expressive than finite state automata.

Section 2 briefly describes the key elements and operators of Petri Net Plans. Section 3 introduces the Join Commitment theory, showing how it is used as a guideline for the design of multi-robot Petri Net Plans for teamwork. Section 4 describes how this approach has been used in the domain of the technical challenges in the RoboCup Four Legged League.

2 Petri Net Plans

Petri Net Plans [11], are a behavior representation framework that allows the design of highly expressive plans in dynamic, partially observable and unpredictable environments. Note that PNPs do not follow a generative approach, but are a tool for for graphical representation of plans. PNPs are based on Petri Nets ([5]), a graphical modeling language for dynamic systems, which is used to represent the many features that are required for behavior modeling, such as non-instantaneous actions, sensing, loops, concurrency, action failures, and action synchronization in a multi-agent context.

The basic structures of a PNP are non-instantaneous ordinary and non-instantaneous sensing actions, shown in Figures 1 and 2.



Fig. 1. A non-instantaneous ordinary action

Fig. 2. A non-instantaneous sensing action

In an ordinary action two transitions and three places are employed: p_i , p_e and p_o are, respectively, the initial, execution and termination places. A token in p_e represents the execution phase of the non-instantaneous action. The firing of the transitions t_s and t_e represents, respectively, the starting and the ending of the action. Transitions may be labelled with conditions (typically expressed through a propositional formula)

that control their firing. In a sensing action (Figure 2), the ordinary action structure is enriched through an additional transition and a place. Depending on the value of the sensed condition, the corresponding transition is fired (t_{et} is fired if the sensed condition is true, t_{ef} is fired otherwise). Ordinary and sensing actions can also be modeled as instantaneous. In this case a single transition is used to represent the start, execution and ending of actions (in the case of a sending action two transitions are used according to the value of the sensed condition). An additional structure, called no - action, can be used to connect the structures during the design of a plan. This structure is represented by a single place with no transitions.

In a PNP these elementary structures are combined, through a set of operators, to achieve action sequences, loops, interruption, conditional and parallel execution. These operators are detailed in [11].

2.1 Sub-Plans

In the design of a PNP, sub-plans can be used for a higher modularity and readability. A sub-plan is represented as an ordinary action but refers to a PNP rather than to a primitive behavior. A plan execution module, running on the robot, takes care of dynamically loading sub-plans in case a super-plan invokes its execution. In particular, whenever a start transition of a subplan is fired, the marking of the subplan is set to the initial one. The subplan will then be executed, possibly concurrently with other primitive behaviors or subplans, until it reaches its goal marking or a condition labeling its ending transition is met. Moreover, subplans allow a more powerful use of interrupts which can be used to inhibit an entire behavior at once. This is a very important feature which will be used, as described in the following, to provide a generic implementation of teamwork through PNPs.

2.2 Multi Robot Plans

Petri Net Plans are also able to represent multi-robot plans, through the union of n single robot PNPs enriched with synchronization constraints among the action of different robots. The model we present allows for the design of plans for small teams of robots, such as the ones used in Robocup, and may also be scaled up to medium size teams with an appropriate use of sub-plans. Multi-robot Petri Net Plans are produced in a centralized manner, and then automatically divided, implementing the *centralized planning for distributed plans approach* [3]. Each action of a multi-robot PNP is labeled with the unique *ID* of the robot that performs it. At execution time each robot divides the multi-robot plan into a single agent plan, for its individual execution. Two operators are used to attain synchronization: the *softsync* operator and the *hardsync* operator. Figure 3 shows the structure of the hard sync operator, used to synchronize the execution of two actions.

The hard sync operator relies on the single-robot *sync* primitive, used to establish a communication link between the two robots to exchange information and synchronize the execution. In the example shown in Figure 3, one robot moves to a side of a table to lift it, while the other robot reaches the other side. The hard sync operator ensures that



Fig. 3. Hard synchronization operator: (a) multi-robot plan (b) single-robot plans

the table will be lifted only after the robots have successfully terminated their preparation phase. The soft sync operator provides the possibility to establish a precedence relation among the actions of the individual robots in the multi-robot plan (see [11] for further details).

The case of a multi-robot action interruption is shown in Figure 4. Single agent communication primitives are again used to communicate the need for an action interruption among different robots. In Figure 4, if the robot R1 becomes aware of a *failure* condition during the execution of *action*1, it notifies the robot R2, and the execution of both *action*1 and *action*2 is interrupted.

Petri Net Plans have been used for the implementation of a number of robotic applications. Various videos and complete plans can be found at http://www.dis.uniromal.it/~ziparo/pnp.

3 The Joint Commitment Theory through Petri Net Plans

In [1] P. Cohen and H. Levesque present a formal insight into teamwork, describing the properties that a design of cooperative behavior should satisfy. This section presents a brief overview of these properties, showing how they can be embodied in a PNP and used to implement cooperation.

The Joint Commitment theory isolates a set of basic characteristics that all the cooperating members of a team should share. Too strong and too weak specification of these characteristics are avoided, in order not to set unnecessary constraints on the design, and at the same time to maintain the possibility of a consistent design of cooperative



Fig. 4. Multi-robot interrupt operator: (a) multi-robot plan (b) single-robot plans

behaviors, given the potential divergence on the mental states of the team members. The theory is rooted in the concept of *commitment*, that is established among the team members that decide to perform teamwork. To summarize, a set of team members that are committed to the execution of a cooperative behavior will continue their individual action execution until one of the following conditions hold:

- 1. The behavior was concluded successfully
- 2. The behavior will never be concluded successfully (it is impossible)
- 3. The behavior became irrelevant

The prescriptive approach of the Joint Commitment (JC) theory can be used to provide a systematic design of cooperative behaviors in a multi-robot team.

3.1 Petri Net Plans for Teamwork

Given the intuitive and expressive behavior programming approach provided by the Petri Net Plans Framework, it is easy to embody the specifications provided by the JC theory in the design of multi-robot plans for cooperative tasks. The multi-robot interrupt operator shown in the previous section is used to consistently interrupt the action execution among the different robots that are engaged in a cooperation (being *committed*), in case the behavior becomes irrelevant or fails. The successful conclusion of the individual actions is implemented in the multi-robot plan through a hard-sync operator. Figure

5 shows a multi-robot Petri Net Plan for the performance of a cooperative behavior, according to the specifications provided by the JC theory.



Fig. 5. A Petri Net Plan for a cooperative behavior

After a first synchronization (during which the commitment is established), the two robots start the cooperation, executing their individual behaviors (i.e. behavior1 and behavior2) which are represented as sub-plans. Following the guideline provided by the JC theory, the commitment is broken if one of the above listed conditions holds. In case one of the engaged robots senses that his behavior became irrelevant or that it has failed, the multi-agent interrupts ensure the event is communicated to the partner, and the execution of the individual actions is interrupted. In the case of successful termination of both behavior1 and behavior2, a hard sync is performed to successfully end the commitment. It may be possible that one of the two robots successfully terminates the execution of the cooperative behavior while the other is still performing some actions. To handle this possibility and to prevent a deadlock situation from occurring, the conditions for unsuccessful commitment breaking have been duplicated. In Figure 6 the single agent plan for the robot R2 is shown. Only one of the two interrupt transitions connected to the execution, as



Fig. 6. Single agent plan for the cooperative behavior

the other robot will only handle one of the two possible multi-robot interrupt communications.

3.2 Applications

Teamwork is very beneficial, if not unavoidable, in many robotic applications. The structure shown in the PNP of Figure 5 can be used as a model for a wide range of cooperative tasks that require the establishment of an explicit *commitment* among robots.

As an example, in the RoboCup Rescue domain, consider a mini UGV and a mini UAV proceeding in formation during the exploration of a terrain. The two vehicles are *committed* to the cooperative exploration. While committed, the mini UAV and the mini UGV perform complex individual behaviors for the exploration. The formation is in this case a necessary condition for the success of the cooperation. In case, for some reason, the formation is broken (e.g. the mini UAV looses visual contact with the mini UGV), the commitment is broken (through a communication action), and the cooperative exploration is interrupted. This interruption leads to the execution of individual behaviors that will allow the reestablishment of the formation (e.g. the mini UGV performs a behavior to facilitate its detection, while the mini UAV seeks its partner). The described behaviors can be easily represented in the PNP framework, making use of the structure of Figure 5 to handle the commitment of the two vehicles.

Explicit cooperation for the execution of complex tasks may be required in the RoboCup Soccer scenario as well. Consider the example of a pass between two robotic-soccer players. If the conditions for a pass hold, a commitment is established. The

robots will need to agree on the allocation of the required tasks (pass an intercept the ball). Suppose the passer robot looses the ball (e.g. an adversary robot intercepts it before the pass can take place): the failure of the pass needs to be communicated to the intercepting robot, which is meantime preparing to receive the pass, and the execution of the individual cooperative behaviors needs to be interrupted. This example has been implemented in the RoboCup Four Legged League scenario, and will be detailed in the next section.

4 An Example in the Robotic-Soccer Environment

In the past editions of the RoboCup competitions the development of cooperative behaviors has been encouraged. The Passing Challenge, proposed in 2006 (Bremen, Germany) and 2007 (Atlanta, USA) in the Four Legged League, directly addresses the problem of cooperation. In this technical challenge the robots are placed in three spots on the soccer field with the task of passing a ball. Passing the ball to a robot which was not engaged in the last pass has a higher score reward, and a pass is considered valid if the robot intercepts the ball within a certain distance from its assigned position. The implementation of this task requires (besides the development of basic functions such as vision, localization and primitive actions, which strongly influence the overall performance) synchronization and coordination. The implementation of this passing task through Petri Net Plans is described in [7], and some videos are available at http://www.dis.uniromal.it/~ziparo/pnp_extras. The multi-robot PNPs written for the implementation of this task, as shown below, reflect the principles of the JC theory.



Fig. 7. Two robots passing the ball during the passing task

The assignment of the roles for the pass behavior is performed in the multi-robot PNP at the first stage of the task execution: two of the three robots select the roles of *Passer* and *Receiver*, according to the position of the ball in the field and the previously performed passes (a robot that recently passed the ball has a lower probability of being assigned with the role of *Receiver*). For further details on the assignment of the cooperative roles see [7]. The synchronized actions execution required by the passing task is implemented through Petri Net Plans, which embody, as shown in the previous

sections, the guidelines provided by the Joint Commitment Theory. A first synchronization is used to commit the robots to the execution of the pass. The hard synchronization operator is used for this purpose. The robot that has been assigned with the *Passer* role reaches the ball, grabs it and rotates towards its partner. Meanwhile the *Receiver* robot reaches the desired position and prepares to intercept the passed ball, rotating towards the *Passer*. At the end of this phase, the robots renew their commitment through another synchronization. The hard sync operator is again used to ensure both the robots have completed their task before they can proceed with the pass. This preparation phase is prone to action failures, due to the difficulty of implementing reliable grab and rotation primitives with AIBO robots, and due to possible occurrence of exogenous events (e.g. collisions with other robots) that may interfere with the predicted performance of the primitives. Reflecting the principles of the JC theory, the robots break their commitment if and when a failure occurs during this phase (in this particular task the cooperative behavior is never considered irrelevant, as the robots have the unique task of passing the ball).



Fig. 8. Preparation phase of the pass behavior

Figure 8 shows the Petri Net Plan for the execution of this first part of the task. The *LostBall* condition becomes *true* in case the *Passer* robot realizes that the ball has been lost during the grab or the rotation phases. The ball may in fact roll away from the robot, causing the need for a new task assignment procedure. If control of the ball is lost by the *Passer* robot, the *Receiver* robot needs to be notified, in order to break

its commitment to the current execution of the pass. A multi-robot interrupt operator is used to consistently interrupt the execution of the actions of both the *Passer* and the *Receiver*. If the commitment is successfully maintained the pass can take place.



Fig. 9. Multi-robot Petri Net Plan for the pass behavior



Fig. 10. Single-robot Petri Net Plan for the pass behavior: Passer

The *Passer* robot kicks the ball towards the receiver, which in the meantime performs an intercept behavior. This phase does not require particular attention for action interruption, as the kick and the intercept behaviors are atomically performed and the pass behavior is concluded both in the case of success and in the case of failure of the pass.

A further synchronization (through a hard sync operator) is performed to exchange information about the outcome of the behavior, and the commitment is broken. The final multi-robot plan for the pass behavior is shown in Figure 9, while Figure 10 shows the single agent plan executed by the *Passer* robot.

5 Conclusions

The use of Petri Net Plans for the representation and execution of robotic behaviors has proven very effective. Besides the formal characteristics of the framework, and its intuitive graphical interface, an appealing characteristic of PNPs is the systematic approach that has been provided for the implementation of single and multi-robot behaviors. In this work we have introduced a general model for the design of cooperation through PNPs, building upon the multi-robot synchronization operators, aided by the specifications provided by the Joint Commitment Theory. To illustrate the effectiveness of the proposed model we have detailed the design of a robotic-soccer task, but the same approach may be applied to a wide range of cooperative behaviors.

To achieve teamwork, communication is required. In the presented work we have assumed the existence of a reliable communication channel. However, the appropriate use of behavior interruptions, not shown for simplicity in the presented PNPs, allows the handling of noisy communications as well.

As a future work towards a structured definition of cooperation in the RoboCup domain, we are working on the integration of cooperative behaviors in the soccer competitions. To this extent, we are currently developing a system for the establishment of commitments among the team members during the soccer games, using a task assignment algorithm based on utility functions.

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