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# A Mechanism for Group Decision Making in Collaborative Activity

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#### Abstract

The SharedPlans formalization of collaboration (Grosz and Kraus 1999) stipulates that collaborating agents must commit to certain decision-making processes, but it does not specify those processes. This paper presents a mechanism for group decision making that may be applied to the decisions that agents involved in a SharedPlan need to make: adopting the initial commitment, selecting a recipe, assigning agents to subtasks, and identifying various action parameters. The paper thus more fully specifies the dynamic expansion of a partial SharedPlan to a more complete plan. The decisionmaking mechanism is represented by a fixed, fully-specified SharedPlan. A set of speech acts and conditions under which those speech acts invoke the decision-making SharedPlans are also defined. The definition of the force of declarative speech acts is based on Searle's notion of constitutive rules (Searle 1998).

# Introduction

SharedPlans (Grosz and Kraus 1999) is a theory of collaborative planning that specifies the mental-state requirements of agents collaborating on a group activity. A group of agents holding a certain set of individual intentions, beliefs, and mutual beliefs are said to have a SharedPlan.

Typically, a group's plan is partial: they may not yet have selected a recipe, decided which agents should do which subtasks, or selected values for various parameters. When plans are partial, the SharedPlans formalization specifies that the group must be committed to certain group decisionmaking processes, but it does not define those processes. In particular, it does not specify how a group of agents having a partial SharedPlan might make the group decisions needed to complete the plan.

In this paper, we present a generic voting-based groupdecision-making mechanism that we represent as a fixed, fully-specified SharedPlan that agents may invoke directly using declarative speech acts. We show how this mechanism can be applied to the decisions that must be made by a group of agents collaborating on some group activity.

The voting process in the decision-making mechanism uses declarative speech acts. We define the *force* (Searle 1998) of declarative speech acts composing the group Massimo Zancanaro

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decision-making process in such a way that the group decisions arising from this process transform agent beliefs and intentions only in ways such that agents continue to satisfy the requirements of a SharedPlan as their plan evolves.

The definition of the force of the declarative speech act is based on Searle's theory of the construction of social reality (Searle 1998). In this theory, institutional facts (e.g., that Bill Clinton is the President of the United States) are distinguished from brute facts (e.g., that the Space Shuttle weighs over 500 pounds). Institutional facts exist only within systems of constitutive rules (i.e., rules that not only regulate an activity, but also create its very possibility). For example, the rules of chess are constitutive: without them there can be no game. Furthermore, the rules have a specific form: Xcounts as Y in the context C. In chess, moving my knight to the space occupied by your bishop in the context of it being my turn counts as my knight capturing your bishop. In specifying voting speech acts, we treat the type of decision as part of the context. This permits a single voting-based mechanism to be used for every type of decision faced by agents collaborating on a SharedPlan.

## **Preliminaries**

In this section, we present axiomatizations for conditional actions and for declarative and assertive speech acts. Belief, mutual belief, intention to (do an action), and intention that (a proposition hold) are modeled using the modal operators, *Bel*, *MB*, *Int*. *To* and *Int*. *Th* (Grosz and Kraus 1999).

#### **Conditional Actions**

An example of a conditional action is: "If the phone rings, answer it." We model conditional actions of the form: if  $\phi$  then A, where  $\phi$  is a triggering condition and A is a single-agent action.<sup>1</sup> In this paper, the actions being triggered are mental actions (e.g., adopting an intention). We define the conditional actions  $C_{To}$  and  $C_{Th}$  by:

 $C_{To}(\phi, X)$ : if  $\phi$  then Adopt.Int.To(X) $C_{Tb}(\phi, \psi)$ : if  $\phi$  then  $Adopt.Int.Th(\psi)$ 

where X is a single-agent action and  $\psi$  is a proposition.  $C_{To}(\phi, X)$  is interpreted as: "If  $\phi$  becomes true, adopt an

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<sup>&</sup>lt;sup>1</sup>Conditional actions can also be constructed as expressions from standard operators in dynamic logic (Ortiz 1999b).

intention to do X";  $C_{Th}(\phi, \psi)$  is interpreted as: "If  $\phi$  becomes true, adopt an intention that  $\psi$  hold."<sup>2</sup>

We assume that if a group GR mutually believe both that (1) an agent G intends—in the event of  $\phi$ —to adopt some other intention, and (2) that G believes  $\phi$ , then GR mutually believe that G actually adopts the new intention, as represented by the following axiom schemata:

$$(R_1) \quad MB(GR, Int.To(G, C_{To}(\phi, X)) \land Bel(G, \phi)) \\ \Rightarrow MB(GR, Int.To(G, X)) \\ (R_2) \quad MB(GR, Int.To(G, C_{Th}(\phi, \psi)) \land Bel(G, \phi)) \\ \Rightarrow MB(GR, Int.Th(G, \psi))$$

### **Performatives**

The decision-making mechanism uses two performatives: Declare and Assert.<sup>3</sup> We model performatives as primitive actions of the form  $Perf(G, \phi, GR^-)$ , where Perf is either Declare or Assert, G is an agent,  $GR^-$  is a group of agents that does not include G, and  $\phi$  is a proposition. The following axiom schema represents our simplifying assumption that performatives have been executed (i.e., "done") if and only if the group  $GR = GR^- \cup \{G\}$  mutually believe they have been executed:

$$(P) \quad Done(G, Perf(G, \phi, GR^{-})) \\ \Leftrightarrow MB(GR, Done(G, Perf(G, \phi, GR^{-})))$$

Thus, for example, G makes a declaration  $\phi$  to  $GR^-$  if and only if GR mutually believe G has made such a declaration. For convenience, we use the following abbreviations:

$$Declared(G, \phi, GR^{-}) = Done(G, Declare(G, \phi, GR^{-}))$$
  
Asserted(G, \phi, GR^{-}) = Done(G, Assert(G, \phi, GR^{-}))

**Declarations.** In an arbitrary context, someone's declaring "I hereby dub thee *Sir Lancelot*" may have no implications; however, if Queen Elizabeth II declares it in the context of a royal ceremony, it will result in someone's being knighted. Agents use the *Declare* performative to establish certain propositions as mutually-believed institutional facts. Following Searle (1998), we use constitutive rules of the form, X counts as Y in the context C, to define the force of declarative speech acts. We represent these rules as axioms of the form,  $X \wedge C \Rightarrow Y$ . For example, we might define the force of the dubbing declaration as follows:

$$Declared(G_1, Knighted(G_2, \texttt{SirLancelot}), \{G_2\}) \\ \land Royalty(G_1) \\ \Rightarrow MB(\{G_1, G_2\}, Knighted(G_2, \texttt{SirLancelot}))$$

**Assertions.** Agents use *Assert* to report their beliefs and intentions to other agents. We assume that agents are truth-



Figure 1: A method  $\mathcal{M}_A$  for GR doing A

ful in their assertions.<sup>4</sup> We also assume that if an agent G asserts to some other agents  $GR^-$  that it holds a particular belief or intention, then the result of that assertion is that they all mutually believe G holds that belief or intention, as represented by the following:

$$(S_{Bel}) \quad Asserted(G, Bel(G, \psi), GR^{-}) \\ \Rightarrow MB(GR, Bel(G, \psi)) \\ (S_{To}) \quad Asserted(G, Int. To(G, X), GR^{-}) \\ \Rightarrow MB(GR, Int. To(G, X)) \\ (S_{Th}) \quad Asserted(G, Int. Th(G, \psi), GR^{-}) \\ \Rightarrow MB(GR, Int. Th(G, \psi)) \\ \end{cases}$$

It follows from  $(S_{Bel})$  and the definition of mutual belief that if *each* member of GR asserts to the other agents in GR that it believes some  $\psi$ , then the entire group mutually believe  $\psi$ :

**Lemma 1.** Given axiom schemata  $(S_{Bel})$ , the following is valid for all GR and  $\psi$ :

$$[(\forall G \in GR) Asserted(G, Bel(G, \psi), GR^{-})] \\ \Rightarrow MB(GR, \psi)$$

where  $GR^-$  (i.e., the "rest of the group") implicitly depends on G.

Throughout the rest of this paper, we assume a theory that includes all instances of all axiom schemata introduced to this point.

# Methods and Full SharedPlans

We define a *method*  $\mathcal{M}$  for a group of agents GR doing a multi-agent action A as a triple:  $\langle R, S, \mathcal{B} \rangle$ , where R is a fixed recipe for doing A, S is a complete set of agent assignments for the subacts in R, and  $\mathcal{B}$  is a complete set of bindings for all the parameters of A and R. For example, Figure 1 gives a schematic representation of a method  $\mathcal{M}_A$  that specifies that the two-agent group,  $GR = \{G_1, G_2\}$ , can do the multi-agent action A using the recipe  $\{A_1, A_2\}$ , where  $G_1$  does the primitive subact  $A_1$  at time  $T_1$ , and  $G_2$  does  $A_2$  at  $T_2$ .

To *adopt* (or commit to) a fully-specified SharedPlan (FSP) means to *establish* the individual intentions and mutual beliefs specified in the definition of the FSP metapredicate (Grosz and Kraus 1999; Hunsberger 1999). The FSP requirements depend on the method being used. We write  $\mathcal{F}_{\mathcal{M}}$  for the set of FSP requirements corresponding to the method  $\mathcal{M}$ .

<sup>&</sup>lt;sup>2</sup>The *Adopt.Int*. *To* and *Adopt.Int*. *Th* actions correspond to a subset of the functions of Ortiz' *Update* action (Ortiz 1999b).

<sup>&</sup>lt;sup>3</sup>Our specification of speech acts borrows from Cohen and Levesque (1990). Cohen and Levesque (1997) derive the semantics for request and commissive speech acts from the definition of an "attempt." We take a more direct approach. Ortiz (1999b) gives an alternative definition of an attempt.

<sup>&</sup>lt;sup>4</sup>Perrault(1990) addresses the problem of agents making assertions they do not believe.

For the method  $\mathcal{M}_A$  depicted in Figure 1, the FSP requirements (i.e.,  $\mathcal{F}_{\mathcal{M}_A}$ ) reduce to the following:<sup>5</sup>

- $F_1$ :  $MB(GR, Is.Recipe(\{A_1, A_2\}, A))$
- $F_2$ :  $MB(GR, CBA(G_1, A_1))$
- $F_3$ :  $MB(GR, CBA(G_2, A_2))$
- $F_4$ :  $MB(GR, Int.Th(G_1, Done(GR, A)))$
- $F_5: MB(GR, Int. Th(G_2, Done(GR, A)))$
- $F_6$ : Int.  $To(G_1, A_1) \wedge MB(GR, Int. To(G_1, A_1))$
- $F_7$ :  $MB(GR, Int.Th(G_2, CBA(G_1, A_1)))$
- $F_8$ : Int.  $To(G_2, A_2) \land MB(GR, Int. To(G_2, A_2))$
- $F_9$ :  $MB(GR, Int.Th(G_1, CBA(G_2, A_2)))$

In general, the FSP requirements corresponding to some method  $\mathcal{M}$  may be partitioned into two subsets which we denote  $\mathcal{F}^0_{\mathcal{M}}$  and  $\mathcal{F}^I_{\mathcal{M}}$ . The requirements in  $\mathcal{F}^0_{\mathcal{M}}$  involve mutual beliefs pertaining only to the validity of the method (i.e., that the recipe is valid and that the agents are able to do their assigned subacts). Agents holding such mutual beliefs need not be committed to doing anything. For the example above,  $\mathcal{F}^0_{\mathcal{M}_A} = \{F_1, F_2, F_3\}$ . In contrast, the requirements in  $\mathcal{F}^I_{\mathcal{M}}$  involve agent commitments and mutual beliefs about those commitments. For the example above,  $\mathcal{F}^I_{\mathcal{M}_A} = \{F_4, F_5, F_6, F_7, F_8, F_9\}$ .

# **Invoking a Method**

When collaborating on some group activity, agents typically begin with a partial plan that, over time, they elaborate into a complete plan. Grosz and Kraus (1996, 1999) argue that certain planning (i.e., group decision making) processes should be modeled as fixed, fully-specified SharedPlans (FSPs). In a subsequent section, we present a generic group-decision-making method. In this section, we describe how a group of agents can adopt an FSP corresponding to such a method. In particular, we describe how—given an arbitrary proposition  $\phi$  and a decision-making method  $\mathcal{M}$ —a group's adoption of an FSP corresponding to the method  $\mathcal{M}$  may be triggered by the group's mutual belief that  $\phi$  holds. We call  $\phi$  the triggering condition and we say that the group's mutual belief of  $\phi$  invokes the method (or invokes the FSP corresponding to the method). Sufficient requirements are:

- (1) the group GR mutually believe that the method is valid (i.e., the mutual beliefs in  $\mathcal{F}^0_{\mathcal{M}}$  hold); and
- (2) the group GR mutually believe that they hold a certain set of background commitments (dependent on both  $\mathcal{M}$  and  $\phi$ , as described below) that may be interpreted as their willingness to adopt the FSP when triggered.

We first describe the triggered invocation of an FSP corresponding to the method  $\mathcal{M}_A$  depicted in Figure 1. Let  $\phi$  be an arbitrary triggering condition. Let  $\mathcal{C}_{\mathcal{M}_A}(\phi)$  be a set containing the following conditional commitments (dependent on both  $\mathcal{M}_A$  and  $\phi$ ):

 $C_{1}: Int. To(G_{1}, C_{Th}(\phi, Done(GR, A))) \\C_{2}: Int. To(G_{1}, C_{To}(\phi, A_{1})) \\C_{3}: Int. To(G_{1}, C_{Th}(\phi, CBA(G_{2}, A_{2}))) \\C_{4}: Int. To(G_{2}, C_{Th}(\phi, Done(GR, A))) \\C_{5}: Int. To(G_{2}, C_{To}(\phi, A_{2})) \\C_{6}: Int. To(G_{2}, C_{Th}(\phi, CBA(G_{1}, A_{1}))) \\C_{6}: Int. Co(G_{2}, C_{Th}(\phi, CBA(G_{1}, A_{1}))) \\C_{6}: Int. Co(G_{1}, C_{Th}(\phi, CBA(G_{1}, A_{1}))) \\C_{6}: Int. C$ 

For example,  $C_3$  represents  $G_1$ 's commitment (conditioned on  $\phi$ ) to adopt an intention that  $G_2$  be able to do  $A_2$ —which is precisely what must be mutually believed to satisfy the FSP requirement  $F_9$ .

The following theorem says that if the group GR mutually believe both (1) that they hold the conditional commitments in  $C_{\mathcal{M}A}(\phi)$  and (2) that the triggering condition  $\phi$  holds, then all of the FSP requirements in  $\mathcal{F}_{\mathcal{M}A}^{I}$  necessarily hold; hence, if they also mutually believe that the method is valid (i.e., the FSP requirements in  $\mathcal{F}_{\mathcal{M}A}^{0}$  hold), then the FSP requirements corresponding to the method  $\mathcal{M}_A$  necessarily hold (i.e., the group has adopted the FSP corresponding to the method  $\mathcal{M}_A$ ). In the theorem, the brackets around  $\mathcal{C}_{\mathcal{M}A}(\phi)$ ,  $\mathcal{F}_{\mathcal{M}A}, \mathcal{F}_{\mathcal{M}A}^{I}$  and  $\mathcal{F}_{\mathcal{M}A}^{0}$  are used to represent the conjunction of all the clauses in the bracketed set.

**Theorem 1 (Special Case:**  $\mathcal{M} = \mathcal{M}_A$ ). The following is valid for all GR and  $\phi$ :

 $MB(GR, \phi \land [\mathcal{C}_{\mathcal{M}_A}(\phi)]) \Rightarrow [\mathcal{F}^I]; \text{ and hence:} \\ MB(GR, \phi \land [\mathcal{C}_{\mathcal{M}_A}(\phi)]) \land [\mathcal{F}^0] \Rightarrow [\mathcal{F}_{\mathcal{M}_A}].$ 

[All proofs are omitted due to space limitations.]

**Theorem 1 (General Version).** Theorem 1 is easily generalized to cover the triggered invocation of an FSP based on an arbitrary method  $\mathcal{M}$  whose recipe includes any number of primitive subacts and which involves a group of arbitrarily many agents. The voting-based group-decision-making mechanism described in the next section is based on such a method. The more subacts and agents involved in the method, the more numerous are the requirements in  $\mathcal{F}_{\mathcal{M}}^0$  and  $\mathcal{F}_{\mathcal{M}}^I$ , and the more numerous are the conditional commitments in  $\mathcal{C}_{\mathcal{M}}(\phi)$ ; the basic idea, however, is the same.

# Invoking an FSP to Make a Group Decision

In this section, we show how an agent can invoke a decisionmaking FSP that a group of agents may use to make a group decision. We describe a single voting-based decisionmaking method  $\mathcal{M}_V$ ; however any decision-making method representable by an FSP may be similarly treated. Thus, the presentation in this section has wide applicability to group decision making in multi-agent systems. Without loss of generality, we describe a scenario in which a particular agent ( $G_1$ ) invokes the method.

A schematic for the voting method  $\mathcal{M}_V$  is shown in Figure 2. The method involves a group GR of n agents:  $G_1, \ldots, G_n$ . The recipe has n + 1 subacts, each of which is a declarative speech act.  $D_1$  is the declaration used by  $G_1$  to invoke the method;  $V_2, \ldots, V_n$  are declarations by the rest of the agents either to accept or reject the proposal contained in the invoking declaration;  $D_a$  is  $G_1$ 's declaration

 $<sup>{}^{5}</sup>Is.Recipe$  models that the given set of subacts constitutes a recipe for the given action; CBA ("can bring about") models an agent's ability to do an action (Grosz and Kraus 1999).



Figure 2: A schematic for the voting method  $\mathcal{M}_V$ 

announcing the result of the voting. The axioms associated with the declarations in  $\mathcal{M}_V$  (given below) ensure that if  $G_1$  announces that the group has accepted the proposal, then the group's decision shall necessarily be established as a mutually believed fact.

Let  $\mathcal{F}^{0}_{\mathcal{M}_{V}}$  and  $\mathcal{F}^{I}_{\mathcal{M}_{V}}$  be the FSP requirements corresponding to the method  $\mathcal{M}_{V}$ . We assume that the group mutually believe that the voting method is valid (i.e., that the mutual beliefs in  $\mathcal{F}^{0}_{\mathcal{M}_{V}}$  hold). Let  $\mathcal{C}_{\mathcal{M}_{V}}(\phi_{V})$  be the set of conditional commitments corresponding to the method  $\mathcal{M}_{V}$  and the triggering condition  $\phi_{V}$ , as described in the previous section. (The triggering condition  $\phi_{V}$  is defined below.) We assume that the agents mutually believe that they hold the conditional commitments in  $\mathcal{C}_{\mathcal{M}_{V}}(\phi_{V})$ . Thus, by Theorem 1 (general version), mutual belief in  $\phi_{V}$  is sufficient to trigger the group's adoption of the FSP corresponding to  $\mathcal{M}_{V}$ .

Without loss of generality, we consider a "simple selection" decision problem in which the group must select a single item  $\sigma$  from a fixed set  $\Sigma$ .

**Invoking the Voting Method.**  $G_1$ 's initial declaration is:  $Declare(G_1, Invoked\_VM(G_1, \mathcal{M}_V, \pi), GR^-)$ , where  $\mathcal{M}_V$  includes the following parameters:

group:  $GR = \{G_1, \dots, G_n\}$  invocation time:  $T_1$ voting time interval:  $T_v$  announcement time:  $T_a$ 

and  $\pi$  includes the following additional parameters:

decision problem: (SelectItem,  $\Sigma$ )

proposal:  $\delta = (\texttt{Select}, \sigma_3)$ 

The force of  $G_1$ 's declaration is defined by the following axiom schema:

$$(S_1) \quad Declared(G_1, Invoked_VM(G_1, \mathcal{M}_V, \pi), GR^-) \\ \Rightarrow MB(GR, Invoked_VM(G_1, \mathcal{M}_V, \pi))$$

Let  $\phi_V$  be the following triggering condition:

Invoked\_VM(
$$G_1, \mathcal{M}_V, \pi$$
)

By schema  $(S_1)$ ,  $G_1$ 's initial declaration is sufficient to ensure that the group mutually believe  $\phi_V$ . Thus, by Theorem 1 (general version) the group necessarily adopts the voting-mechanism FSP in response to  $G_1$ 's invocation.

**The Voting Phase.** During the time interval  $T_v$  (a parameter in  $\mathcal{M}_V$ ), the agents  $G_2, \ldots, G_n$  must do the voting actions  $V_2, \ldots, V_n$ , respectively. Each vote is a declaration of

accepting or rejecting the proposal  $\delta$  (a parameter in  $\pi$ ). Axiom schema ( $S_2$ ) defines the force of a vote to accept  $\delta$ . The force of a vote to reject  $\delta$  can be defined analogously.

$$(S_2) \quad Declared(G, Accepted(G, \delta), \{G_1\}) \\ \land MB(\{G, G_1\}, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \land G \in GR \\ \land G \neq G_1 \\ \Rightarrow MB(\{G, G_1\}, Accepted(G, \delta)) \end{cases}$$

**The Announcement.** After the voting interval,  $G_1$  announces the results of the voting to the rest of the group by making the declaration:  $Declare(G_1, \chi, GR^-)$ , where  $\chi$  is either  $GroupAccepted(GR, \delta)$  or  $GroupRejected(GR, \delta)$ . Due to space limitations, we only describe the announcement to accept.

We provide a set of three constitutive rules— $(S_3)$ ,  $(S_4)$ and  $(S_5)$  below—sufficient to ensure that if  $G_1$  announces the group decision to accept  $\delta$ , then that announcement establishes the group's decision as a mutually-believed fact (formalized in Theorem 2 below). We use three constitutive rules rather than a single rule to explicitly show the assumptions sufficient to generate the desired result.

The rules have the following form:

 $(S_3) \quad X \wedge C_1 \Rightarrow Y_1;$ 

$$(S_4)$$
  $X \land (C_1 \land C_2) \Rightarrow Y_2$ , where  $Y_1 \Rightarrow C_2$ ; and

$$(S_5) \quad X \land (C_1 \land Y_2) \Rightarrow Y_3.$$

In each rule, X stands for  $G_1$ 's announcement. The result  $(Y_1)$  of the first rule enriches the context for the second rule; the result  $(Y_2)$  of the second rule enriches the context for the third rule.

In the first rule  $(S_3)$ ,  $G_1$ 's announcement, in the context of the group mutually believing that  $G_1$  invoked the voting mechanism, counts both as an assertion that each member agent voted to accept the proposal and as establishing the group's mutual belief that  $G_1$  accepted the proposal.

$$(S_3) \quad Declared(G_1, GroupAccepted(GR, \delta), GR^-) \\ \land MB(GR, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \Rightarrow Asserted(G_1, Bel(G_1, Accepted(G_2, \delta)), GR^-) \\ \vdots \\ \land Asserted(G_1, Bel(G_1, Accepted(G_n, \delta)), GR^-) \\ \land MB(GR, Accepted(G_1, \delta))$$

From Lemma 1, these assertions entail that the group GR mutually believe that  $G_1$  believes that everyone *else* voted to accept:

$$(\forall G \in GR^{-})MB(GR, Bel(G_1, Accepted(G, \delta))).$$

In the second rule  $(S_4)$ , the context is enriched by the mutual beliefs resulting from the first rule. In this context,  $G_1$ 's announcement counts as the group mutually believing that everyone voted to accept  $\delta$ :

 $(S_4) \quad Declared(G_1, GroupAccepted(GR, \delta), GR^-) \\ \land MB(GR, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \land (\forall G \in GR^-)MB(GR, Bel(G_1, Accepted(G, \delta))) \\ \land MB(GR, Accepted(G_1, \delta)) \\ \Rightarrow (\forall G \in GR)MB(GR, Accepted(G, \delta))$ 

In the third rule  $(S_5)$ , the context includes the result of the second rule. In this context,  $G_1$ 's announcement counts as establishing the group's decision as a mutually believed fact.

 $(S_5) \quad Declared(G_1, GroupAccepted(GR, \delta), GR^-) \\ \land MB(GR, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \land (\forall G \in GR)MB(GR, Accepted(G, \delta)) \\ \Rightarrow MB(GR, GroupAccepted(GR, \delta))$ 

**Theorem 2.** Given axiom schemata,  $S_2, \ldots, S_5$ , the following is valid:

 $Declared(G_1, GroupAccepted(GR, \delta), GR^-) \\ \land MB(GR, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \Rightarrow MB(GR, GroupAccepted(GR, \delta))$ 

# Applying the Mechanism to Collaborative Planning

Agents collaborating on some group activity often cannot adopt a fully specified plan for that activity in a single stroke. Instead, they must make numerous decisions (e.g., which recipe to use, which parameter values to use, or which agents or subgroups to assign to the various subtasks) as they elaborate their possibly-hierarchical partial plan into a more complete plan. In this section, we describe how the voting mechanism from the previous section may be applied to the decisions encountered by a group of agents collaborating on some group activity. The key idea is that the definition of the force of a vote to accept a proposal (given in schema  $(S_2)$  above) must be augmented according to the context determined by the type of decision being voted on. Thus, for example, a vote to use a particular recipe represents one set of conditional commitments, while a vote to assign a fellow agent to a particular subtask represents another set of commitments.

We illustrate the use of the voting mechanism as a general-purpose decision-making tool by showing how it may be used by a group both to adopt a minimal Shared-Plan (i.e., a plan for which no recipe has been selected and no parameters have been bound) and to select a recipe for that plan (which introduces new decision problems).

To simplify the presentation, we assume a weaker model of the group's commitment to the plan-elaboration process than that used by Grosz and Kraus.<sup>6</sup> In particular, for each decision problem facing the group, we require only that the group mutually believe that each agent intends that the group find a way of resolving that problem.

**Deciding to Adopt a Minimal SharedPlan (MSP).** Suppose  $G_1$  invokes the voting mechanism as described previously, but with  $GR = \{G_1, G_2\}$  and  $\pi$  containing the following different parameters:

decision problem:  $Adopt_MSP(A)$ 

proposal:  $\delta_1 = YES$  (i.e., adopt the MSP)

Thus,  $G_1$  proposes that the group adopt a minimal Shared-Plan (MSP) to do the multi-agent action A.

To adopt such a plan means to establish a subset of the intentions and mutual beliefs in the definition of the PSP (Partial SharedPlan) meta-predicate (Grosz and Kraus, 1999; Hunsberger, 1999). In this case, these requirements reduce to the following (for each  $G_i$  in GR):

- $(M_1)$   $MB(GR, Int. Th(G_i, Done(GR, A)))$
- $(M_2)$   $MB(GR, Int. Th(G_i, Recipe. Selected(GR, A)))$

Let  $\xi_1 = GroupAccepted(GR, \delta_1)$ . An agent voting to adopt an MSP counts as that agent asserting that it intends, in the event of  $\xi_1$  (i.e., in the event that the group decides to accept the proposal), to adopt the intentions required of it in  $(M_1)$  and  $(M_2)$ , as follows.

$$(S_6) \qquad MB(GR, Accepted(G, \delta_1)) \\ \land DecisionProblemType(\pi, \texttt{Adopt}\_MSP(A)) \\ \Rightarrow Asserted(G, I_1 \land I_2, GR^-)$$

where  $I_1$  and  $I_2$  are given by:

$$I_1 = Int.To(G, C_{Th}(\xi_1, Done(GR, A)))$$
  

$$I_2 = Int.To(G, C_{Th}(\xi_1, Recipe.Selected(GR, A)))$$

Theorem 3 states that if a group of agents using this decision-making mechanism decide to adopt a minimal SharedPlan, then they will in fact adopt it.

**Theorem 3.** Given schemata,  $S_2, \ldots, S_6$ , the following is valid:

 $Declared(G_1, GroupAccepted(GR, \delta_1), GR^-) \\ \land MB(GR, Invoked\_VM(G_1, \mathcal{M}_V, \pi)) \\ \land DecisionProblemType(\pi, \texttt{Adopt\_MSP}(A)) \\ \Rightarrow MSP(GR, A)$ 

**Deciding to Select a Recipe.** Suppose  $G_1$ 's intention that the group select a recipe leads<sup>7</sup>  $G_1$  to invoke the voting mechanism with a proposal that the group use the recipe  $\{A_1, A_2\}$  (which introduces the unbound parameters  $T_1$  and  $T_2$ ). To incorporate this decision into their existing plan requires that they establish the following additional mutual beliefs (for each  $G_i$  in GR).

- $(M_3)$  MB(GR, Int. Th(G<sub>i</sub>, Agent. Assigned. To(A<sub>1</sub>)))
- $(M_4)$  MB(GR, Int. Th(G<sub>i</sub>, Agent. Assigned. To(A<sub>2</sub>)))
- $(M_5)$   $MB(GR, Int. Th(G_i, Params.Bound(\{T_1, T_2\})))$

These mutual beliefs may be established by a schema nearly identical to  $S_6$  above.

**Other Types of Decisions.** Making other types of decisions (e.g., to select an agent to do a subact or to bind a parameter) have slightly different requirements, but the general

<sup>&</sup>lt;sup>6</sup>In addition, we conjecture that this weaker model, which Grosz and Kraus (1999) use to model the group's commitment to finding values for the parameters of the group action, but not their commitment to selecting a recipe or assigning agents to subtasks, may be sufficient in many scenarios.

<sup>&</sup>lt;sup>7</sup>We use "leads" in the same sense as Grosz and Kraus (1999) in their axioms of intention-that.

procedure remains the same. For example, if the group decides that  $G_1$  should do  $A_1$ , then they must establish clauses  $F_2$ ,  $F_6$  and  $F_7$  (discussed previously), which may be ensured by augmenting the definition of the force of an accept vote to make it count as an assertion of belief in  $G_1$ 's ability to do  $A_1$  and an assertion of conditional commitment corresponding to  $C_2$  (for  $G_1$ 's vote) or  $C_6$  (for  $G_2$ 's vote).

## **Related Work**

Many researchers are actively investigating frameworks for reasoning about collective activity in multi-agent systems. The role of communication is often recognized as crucial, but there are few formal studies of mechanisms for group decision making.

Werner (1990) distinguishes directive and informative speech acts. A "pragmatic interpretation" of high-level messages is used to transform the information and intentional states of agents. Werner also discusses the "institutional effects" of certain "representative declarative" speech acts, and gives examples of how directive and informative speech acts may be used in "social cooperation."

Cohen and Levesque (1997) derive the semantics for request and commissive speech acts from the definition of an "attempt" such that certain requests followed by certain commissive actions result in the formation of joint commitments. In contrast, we propose a general mechanism for group decision making and derive the adoption of a Shared-Plan as a special case. Cohen and Levesque (1997) do not discuss declarative speech acts.

The set of background conditions that enable certain speech acts to directly invoke the voting mechanism in our work is comparable to the locker-room agreements presented by Stone and Veloso (1999). Both approaches can be viewed as mutually-believed commitment by the group members to "do the right thing at the right time." The main difference is that the locker-room agreement is used to execute a plan in the absence of reliable communication, whereas the voting mechanism in our work is used to dynamically establish decisions needed in elaborating a partially-specified plan.

### Conclusions

The aim of the paper is to more fully specify the dynamic evolution of a partial SharedPlan to a more complete plan. The SharedPlans formalization of collaboration (Grosz and Kraus 1999) stipulates that collaborating agents must commit to certain decision-making processes (namely, adopting the initial commitment, selecting a recipe, assigning agents to subtasks, and identifying action parameters) but does not specify those processes. We have presented a mechanism for group decision making that may be applied to all of these types of decision.

The decision-making mechanism is modeled as a fixed, fully-specified SharedPlan (FSP) that can be directly invoked. We have provided conditions sufficient to ensure that the group will automatically adopt such an FSP as soon as they come to mutually believe a given triggering condition holds. We provided the *Declare* speech act to enable agents to establish mutual belief of a triggering condition. The definition of the force of the *Declare* speech act was specified using Searle's constitutive rule (i.e., "the performance of X in the context C counts as Y"). The *Assert* speech act was used to define the consequences of certain declarations.

We illustrated how the decision-making mechanism can be used to adopt a SharedPlan as well as to make the various decisions needed to elaborate a partially-specified plan, provided that the context C in the constitutive rules is properly managed. Furthermore, the techniques presented in this paper provide a solid foundation for formalizing the process of group decision making based on any mechanism representable by an FSP.

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