

# Super Altruistic Hedonic Games

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## ABSTRACT

Hedonic games are coalition formation games in which agents' utility depends only on their own coalition. The introduction of Altruistic Hedonic Games increased the expressive potential of Hedonic Games by considering the utility of each of the agent's friends within the coalition. We introduce *Super Altruistic Hedonic Games (SAHGs)*, in which an agent's utility may depend on the utility of all other agents in the coalition, weighted according to their distance in the friendship graph. We establish the framework for this new model and investigate the complexity of multiple notions of stability. We show that SAHGs generalize Friend-oriented Hedonic Games, Enemy-oriented Hedonic Games, and selfish-first Altruistic Hedonic Games, inheriting the hardness results of these games as minimum upper complexity bounds. We also give SAHGs that have neither Nash stable nor strictly core stable partitions.

## KEYWORDS

Coalition formation (non-strategic); Cooperative games: computation; Cooperative games: theory & analysis

## 1 INTRODUCTION

Consider the process of choosing where to live. Much has been written (in the RecSys literature, preferences, etc.) about how to choose the right house or apartment, even the right roommates for a stable configuration. Let us consider the choice of *neighbors*, perhaps in a setting where students are choosing their dormitories/hostels. We can see the partitioning of students into living units (floors, buildings, etc.) as an hedonic game. It is clear that we value our friends' happiness with the living situation, as we will hear about it from them; our enemies' happiness could be assumed to also affect how they treat us. (If we stopped there, we would be modeling evaluation as a *Altruistic Hedonic Game*.) More generally we can also argue that our friends' friends' happiness will affect our friends', and thus indirectly, our own, and that this continues out friendship chains, with decreasing (or at least, non-increasing) effect as we increase the social distance from ourselves.

If we were building intranets, a node could evaluate the quality of the local network in terms of the bandwidth to reachable nodes. However, it would also need to take into account the quality of more distant connections, if it hopes to have its packets relayed. There are many other applications in which agents care not only about immediate connections, but also those farther away. We introduce a family of hedonic games that model such broad evaluations of coalitions: the Super Altruistic Hedonic Games.

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## 2 RELATED WORK

SAHGs are a natural extension of Altruistic Hedonic Games wherein agents consider the preferences of other agents [10]. In AHGs, agents only consider the preferences of their friends. In SAHGs, agents consider the preferences of all agents in their coalition. In AHGs, friends are assigned fixed weights. In SAHGs, the weights assigned to friends and enemies are not fixed, and the preferences of all agents in a coalition are considered, often taking advantage of indirect relationships such as friends of friends to adjust weights. (Note that friendship is not transitive: a friend of a friend could be our enemy.)

Social Distance Games (SDGs) are a class of coalition formation games wherein an agent's utility is a measure of their closeness, or social distance, from the other members of their coalition [4]. SDGs have certain similarities to SAHGs, but we believe that SAHGs can better model realistic human interactions by combining the notion of social distance with the consideration of others' preferences proposed in AHGs.

As we demonstrate later, SAHGs generalize Friends and Enemies-oriented Hedonic Games [7]. In the former, agents seek to find coalitions that maximize the number of friends with a secondary goal of minimizing the number of enemies. In the latter, minimizing the number of enemies is the primary goal, while maximizing the number of friends becomes secondary. Recent work has investigated the impact that neutral agents have on these games, defining a neutral agent as one that is neither friend nor enemy [11]. It was shown that permitting neutral agents in EHG allows for games that have no core stable partition [11]. Core stable partitions are still guaranteed to exist in FHGs with neutral agents; however, strict-core stable partitions are not [11]. The proofs of these findings cannot be readily translated to SAHGs, because SAHGs do not allow neutral agents. Neutral agents could be modeled as graph-based games by labeling appropriate edges as neutral, but SAHGs are focused on simple graph-based models, so the addition of neutral edges is beyond the scope of this paper.

There are graph-related hedonic games that depend on edge-weighted graphs. For instance,  $\mathcal{B}$  and  $\mathcal{W}$  games are a category of hedonic games in which an agent's utility is defined by the agents in their coalition that they rate as the best or the worst, respectively [5]. While these games fall into the category of hedonic games, we don't believe SAHGs can generalize  $\mathcal{B}$  or  $\mathcal{W}$  games. Similarly, we do not believe that either  $\mathcal{B}$  or  $\mathcal{W}$  games can generalize SAHGs. This is due to the differences between  $\mathcal{B}$  and  $\mathcal{W}$  games and SAHGs. These differences include the fact that the former two categories assume each agent can assign a unique value to each other agent, while SAHGs restrict agents to placing others into one of two categories. Additionally,  $\mathcal{B}$  and  $\mathcal{W}$  games do not consider the preferences of others as SAHGs do.

The COALITION STRUCTURE GENERATION (CSG) problem presents a set of coalition formation games representable as a graph where

each agent contributes a fixed value to their coalition [9]. There are several significant differences between the CSG problem and SAHGs, despite both falling under the broad scope of coalition formation games. One major difference is the way agent values are handled. In the CSG problem there can be as many values as there are agents and all agents agree on the values assigned to each agent, whereas SAHGs only allow one of two values to be assigned to each agent and different agents can evaluate the same agent differently. Additionally, the CSG problem assumes that utility is transferable, so all members of a coalition earn the same utility. SAHGs do not have transferable utility, so not all agents in a given coalition are guaranteed to have the same utility. As a result, there is no clear means to translate between the CSG problem and SAHGs.

### 3 DEFINITIONS

Below, we outline three types of cooperative games with non-transferable utility, specifically coalition formation games. In each type, a game  $G$  consists of

- (1)  $N$ , a finite set of  $n$  agents, with
- (2) preference set  $P = \{P_i : i \in N\}$ , where  $P_i$  is the preference of each agent  $i$  over partitions of  $N$  into coalitions.

Depending on the type of game,  $P$  may exhaustively list each individual's preferences or provide a succinct representation from which preferences are derived.

*Definition 3.1.* [2, 3] **Hedonic games** are coalition formation games with nontransferable utility wherein players are concerned only with their own coalition. This inherently self-interested means of determining utility makes such games hedonic in nature.

Let  $\mathcal{N}_i$  be the set of possible coalitions containing agent  $i \in N$ . A preference ordering of  $\mathcal{N}_i$  is derived from the preference set  $P_i \in P$ . A solution for a game is a partition  $\pi$ , which is contained in the set of all distinct partitions  $\Gamma$ . Each player  $i \in N$  ranks each partition  $\pi \in \Gamma$  based on the coalition to which they belong.

Hedonic games are a broad category, so it can be useful to define sub-categories that exhibit certain interesting or useful properties. Altruistic hedonic games are one such sub-category that has been a major inspiration for the work done in this paper.

*Definition 3.2.* [10] An **altruistic hedonic game (AHG)** is a hedonic game in which agents derive utility from both their own basic preferences and those of any friends in the same coalition.

Let each agent  $i \in N$  have utility  $u_i$ , and let  $i$  partition other agents into friends and enemies, given by  $F_i, E_i$ . Three levels of altruism are considered in AHGs: **selfish-first**, **equal treatment**, and **altruistic first**. The function used to determine an agent's utility depends on their altruism level and on pre-utility preference values calculated as the utility agents would have in a friends-oriented hedonic game based on the same graph ( $n|C \cap F_i| - |C \cap E_i|$ ). Two of these functions utilize a weight parameter of  $M = n^5$  to ensure that one of the terms in the equation dominates the other. This weight value is the smallest whole number exponent of  $n$  which guarantees this for both equations that make use of  $M$ . Definitions for each altruism level and their utility functions are outlined below:

- (1) **Selfish-First:** agents prioritize their own preferences, but use the preferences of others to break ties.

$$u_i = M(n|C \cap F_i| - |C \cap E_i|) + \sum_{a \in C \cap F_i} \frac{n|C \cap F_a| - |C \cap E_a|}{|C \cap F_i|}$$

- (2) **Equal Treatment:** all preferences are treated equally.

$$u_i = \sum_{a \in C \cap (F_i \cup \{i\})} \frac{n|C \cap F_a| - |C \cap E_a|}{|C \cap (F_i \cup \{i\})|}$$

- (3) **Altruistic First:** agents prioritize the preferences of others, but use their own preferences to break ties.

$$u_i = n|C \cap F_i| - |C \cap E_i| + M \cdot \sum_{a \in C \cap F_i} \frac{n|C \cap F_a| - |C \cap E_a|}{|C \cap F_i|}$$

AHGs introduce some interesting ideas by incorporating the preferences of others into utility computations in a polynomially computable fashion. The three levels of altruism provide a means to vary the degree to which agents consider the preferences of others, while also providing bounds on the weights needed to ensure the dominance of one term in the utility equation. However, only considering the preferences of friends and three variations of altruism limits the preferences and degrees of altruism that can be represented. We introduce Super Altruistic Hedonic Games in order to broaden the scope of representation.

*Definition 3.3.* **Super Altruistic Hedonic Games<sup>1</sup> (SAHGs)** extend the core principal of AHGs so agents consider the preferences of all agents in their coalition. Agents weigh their consideration of each other's preferences according to some polynomially computable value.

Let parameters  $(a, g, M, L)$  be non-negative weights where  $a$  and  $g$  represent the weights associated with friends and enemies, respectively, while  $M$  and  $L$  represent the weights associated with personal preference and the average of friends' preferences. Next, let  $D(i, j)$  be a polynomial-time computable function that is non-increasing with the graph distance between  $i$  and  $j$ . Let the number of other agents in coalition  $C_i$  be  $h_i = |C_i \setminus \{i\}|$ . For each agent  $i \in N$ , let that agent's base preference be  $b_i = a|C_i \cap F_i| - g|C_i \cap E_i|$ , and let their utility be

$$u_i = Mb_i + L \sum_{j \in C_i \setminus \{i\}} \frac{D(i, j) \cdot b_j}{h_i}.$$

(If  $C_i = \{i\}$  then the sum is set to 0.) The default definition of  $D$  is the inverse graph distance function: for any pair of agents  $i, j \in N : i \neq j$ , let  $d_{ij}$  be the shortest path distance between them, then let  $D(i, j) = 1/d_{ij}$ . The **total utility** of a partition  $\pi$  is given by  $U_T = \sum_{i \in N} u_i$ .

**PROPOSITION 3.4.** *SAHGs generalize several graph-based hedonic games.*

- A *Friends-oriented Hedonic Game* is a SAHG with parameters  $(a, g, M, L) = (n, 1, 1, 0)$ , and an *Enemies-oriented Hedonic Game* is a SAHG with parameters  $(1, n, 1, 0)$ . (Because  $L = 0$ , it does not matter how we define  $D$ .) Thus, all hardness results for FHGs and EHGs are inherited by SAHGs.

<sup>1</sup>We considered calling them "Super Kinda Altruistic ex-Hedonic Fun Games," even though the sound of it was really quite atrocious.

- SAHGs also model Altruistic Hedonic Games under the selfish-first criterion  $((a, g, M, L) = (n, 1, n^5, 1)$  and  $D(i, j) = 1$  if  $j \in F_i$  and  $D(i, j) = 0$  if  $j \notin F_i$ ).
- If  $D \equiv 1$  and  $(a, g, M, L) = (n, 1, 1, 1)$  then we capture the notion of a friend-oriented hedonic game on the transitive closure of the friendship graph.

In Section 5 we discuss complexity-theoretic results. We assume familiarity with the classes P and NP.

**Definition 3.5.** [12] The complexity class **DP** contains languages defined as the difference between two languages in NP.

For example, let  $C$  be an NP-complete language, and let  $L = \{(c_1, c_2) : c_1 \in C \wedge c_2 \notin C\}$ . Then  $L = \{C \times \Sigma^* \setminus \{\Sigma^* \times C\}$  (where  $\Sigma^*$  is the set of all strings over the alphabet used to define  $C$ ).

**Definition 3.6.** Complexity class  $\Theta_2^P$  is an alternative name for  $P^{NP[\log]}$  [8]. Games in this class are solvable by a P machine that can make  $O(\log n)$  queries to an NP oracle.

### 3.1 Stability and Optimality

One of the major topics of hedonic games is *stability*, the idea that a partition will not be disrupted by individuals rejecting their assigned coalitions and moving to other coalitions. There are many sets of constraints placed on such disruptions, such as the number of agents that can move simultaneously; whether all moving agents must see an increase in utility; whether agents left behind by movers must see their utility increase, or whether agents being joined by movers must see their utility improve.

*Optimality*, the notion of finding a utility-maximizing partition, is another major topic of hedonic games. Notions of optimality are subject to constraints which clarify what is being optimized, such as whether individual or collective (egalitarian or utilitarian) utility is being optimized, or whether utility can be improved for some at the expense of others (Pareto efficiency).

We next define notions related to stability that are referenced in the rest of the paper. In these definitions  $\pi$  is a partition composed of a set of  $k$  disjoint coalitions  $\{C_1, C_2, \dots, C_k\}$ .

- **Nash Stability** [3]:  $\forall i \in N$  and  $\forall C \in \pi : C \neq \pi(i)$  we have  $\pi(i) \succeq_i C \cup \{i\}$
- **Individual Stability** [3]:  $\forall i \in N$  and  $\forall C \in \pi \cup \{\emptyset\} : C \neq \pi(i) : \pi(i) \succeq_i C \cup \{i\}$  or  $\exists j : C \succ_j C \cup \{i\}$  Permission must be received from all existing coalition members before a new agent can join.
- **Contractual Individual Stability** [3]:  $\forall i \in N$  and  $\forall C \in \pi \cup \{\emptyset\} : C \neq \pi(i) : \pi(i) \succeq_i C \cup \{i\}$ ,  $\exists j : C \succ_j C \cup \{i\}$ , or  $\exists k : \pi(i) \succ_k \pi(i) \setminus \{i\}$
- **Wonderful Stability** [18]:  $\forall C \in \pi : C$  is a maximal (non-extendable) clique.
- **Strictly Popular** [10]: partition  $\pi$  beats all other  $\pi' \neq \pi$  in pairwise comparisons

$$|\{i \in N | \pi(i) \succ_i \pi'(i)\}| > |\{i \in N | \pi'(i) \succ_i \pi(i)\}|$$

- **Blocking coalition** [15]: A coalition  $C$  blocks partition  $\pi$  if  $\forall i \in C : C \succ_i \pi(i)$ .
- **Weakly blocking coalition** [15]: A coalition  $C$  weakly blocks partition  $\pi$  if  $\forall i \in C : C \succeq_i \pi(i)$  and  $\exists j : C \succ_j \pi(j)$ .

- **(Strict) Core Stability** [15]: no (weakly) blocking coalition exists.

## 4 PROPERTIES OF PARTITIONS

**PROPOSITION 4.1.** If a coalition comprises a single clique,  $C$ , then individual utilities are given by a linear function of the number of agents and coalition utility is defined by a geometric function of the number of agents.

**PROOF.** We first recall that the base preference of each agent  $i \in N$  is given by  $b_i = a|C_i \cap F_i| - g|C_i \cap E_i|$  where  $C_i$  is the coalition to which  $i$  belongs, and that  $h_i = |C_i \cap F_i| + |C_i \cap E_i|$  defines the number of agents in  $C_i \setminus \{i\}$ . Next recall that each agent  $i \in N$  has utility given by

$$u_i = Mb_i + L \sum_{j \in C_i \setminus \{i\}} \frac{D(i, j) \cdot b_j}{h_i}.$$

The total utility of a partition is defined by  $U_T = \sum_{i \in N} u_i$ .

Now we define the total utility of a coalition as  $U_C = \sum_{i \in C} u_i$ . Because  $C$  is a clique, we know that  $\forall i, j \in C, i \neq j D(i, j) = 1$ . We also know that all  $i \in C$  have  $h_i = |C| - 1$  and  $b_i = a(|C| - 1)$ . We use this to calculate

$$u_i = M \cdot a(|C| - 1) + L \sum_{j \in C_i \setminus \{i\}} \frac{a(|C| - 1)}{1(|C| - 1)},$$

which simplifies to  $u_i = (M + L) \cdot a(|C| - 1)$ .

The total utility of the coalition is  $U_C = \sum_{i \in C} u_i$ , which simplifies to  $U_C = (M + L)(a(|C|^2 - |C|))$ . Thus, we have demonstrated that, given a coalition  $C$  comprised of a single clique, the individual utility is a linear function of  $|C|$  and the coalition utility is a geometric function of  $|C|$ .  $\square$

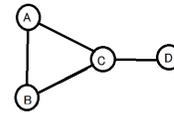
**PROPOSITION 4.2.** Different partitions of a set of agents into cliques may have different utilities.

**PROOF.** Consider that coalition utility scales geometrically with the number of agents if the coalition is a clique. Unless the clique-coalitions are all of equivalent size, then the net utility will be different.

We can also prove by contradiction with a game based on Figure 1 with parameters  $(a, g, M, L) = (1, 1, 1, 1)$ . For each  $i \in N$  we have:

- $b_i = |C_i \cap F_i| - |C_i \cap E_i|$
- $u_i = b_i + \sum_{j \in C_i \setminus \{i\}} \frac{D(i, j) \cdot b_j}{h_i}$ .

**Figure 1: Unequal Cliques**



Consider two partitions:

$$\pi_1 = \{\{A, B, C\}, \{D\}\} \text{ and } \pi_2 = \{\{A, B\}, \{C, D\}\}.$$

In  $\pi_1$ , we have  $b_A = b_B = b_C = 2$  and  $b_D = 0$ . We also have  $u_A = u_B = u_C = 4$  and  $u_D = 0$  and  $U_T(\pi_1) = 12$ . In  $\pi_2$ , we have  $b_A = b_B = b_C = b_D = 1$  and  $u_A = u_B = u_C = u_D = 2$ . Thus,  $U_T(\pi_2) = 8$ .

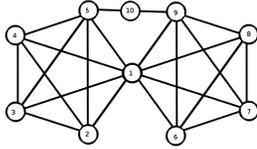
Since we have two partitions into cliques with different total utility values, we can conclude that partitioning agents into cliques does not ensure a consistent total utility. However, given partitions  $\pi_3$  and  $\pi_4$  dividing agents into equal numbers of cliques of each size, the total utilities of the two partitions will be the same.  $\square$

**PROPOSITION 4.3.** *For all parameter values, for all stability notions considered in this paper, there exist SAHGs with stable partitions.*

**PROOF.** Let  $G$  be the SAHG with structure given by a graph with  $n$  nodes and no edges with parameters  $(a, g, M, L)$ . For the partition of singletons, each agent  $i$  has utility  $u_i = 0$ . Since there are no edges in the graph, no agent would benefit from forming a coalition with any other agent or set of agents, so the partition of singletons is stable.  $\square$

**THEOREM 4.4.** *Not all SAHGs have Nash stable partitions.*

**Figure 2: Game with no Nash stable partition**



**PROOF.** Let  $G$  be the SAHG with structure given in Figure 2, and weight parameters  $(a, g, M, L) = (1, 1, 1, 3)$ . This gives us:

- $b_i = |C_i \cap F_i| - |C_i \cap E_i|$
- $u_i = b_i + 3 \sum_{j \in C_i} \frac{D(i,j) \cdot b_j}{h_i}$ .

This game has two equal-sized cliques which are connected to each other through two intermediate agents. The first connecting agent, agent 1, is connected to all agents in both cliques. The second connecting agent, agent 10, is connected to a single agent in each clique and is not connected to agent 1. The first clique is composed of agents 1–5 and the second of agents 1, 6–9.

Because the only member common to both cliques is agent 1, it is reasonable to expect that no stable coalition containing one clique will contain any members from the other, except for agent 1. If members from two cliques form into coalitions which do not include agents 1 and 10, then these two remaining agents would prefer to remain as singletons rather than forming a two-person coalition with each other. In this case, the utility of an agent in one of the two clique coalitions is 12, while the utility of agents 1 and 10 are zero since they are singletons. This describes partition  $\pi_1 = \{\{1\}, \{2, 3, 4, 5\}, \{6, 7, 8, 9\}, \{10\}\}$  with total utility  $U_T = 96$ .

The partition  $\pi_1$  is unstable, because agent 1 can improve their utility by joining one of the two clique coalitions. Since agent 1 is connected to all agents in both cliques, its joining either coalition will increase the size of the clique by 1, increasing the utility of all agents in the coalition from 12 to 16. Agent 1 is indifferent between the two cliques. This presents two possible partitions

- $\pi_2 = \{\{1, 2, 3, 4, 5\}, \{6, 7, 8, 9\}, \{10\}\}$  and
- $\pi_3 = \{\{2, 3, 4, 5\}, \{1, 6, 7, 8, 9\}, \{10\}\}$ ,

each of which has total utility  $U_T = 128$ .

Both  $\pi_2$  and  $\pi_3$  are also unstable because agent 10 can also improve its own utility by joining a coalition. If agent 10 chooses to

join the coalition that agent 1 did not, it derives utility  $u_{10} = 3.25$ , while it derives utility  $u_{10} = 3.6$  if it joins the same coalition as agent 1. Thus, agent 10 prefers to join whichever coalition agent 1 joined, which results in either  $\pi_4 = \{\{1, 2, 3, 4, 5, 10\}, \{6, 7, 8, 9\}\}$  or  $\pi_5 = \{\{2, 3, 4, 5\}, \{1, 6, 7, 8, 9, 10\}\}$ . The total utility of this new partition is  $U_T = 104$ .

Still,  $\pi_4$  and  $\pi_5$  are unstable because agent 1 can improve its utility by leaving the current coalition to join the other clique, thereby restoring its utility to 16. This gives either  $\pi_6 = \{\{2, 3, 4, 5, 10\}, \{1, 6, 7, 8, 9\}\}$  or  $\pi_7 = \{\{1, 2, 3, 4, 5\}, \{6, 7, 8, 9, 10\}\}$ . In these partitions, the total utility is  $U_T = 110.5$ . However,  $\pi_6$  and  $\pi_7$  are unstable since agent 10 can improve its utility by following agent 1, which creates a cycle of four partitions, none of which are Nash stable. Thus we conclude that there is no Nash stable partition for this game, and, by extension, that not all SAHGs are guaranteed to have Nash stable partitions.  $\square$

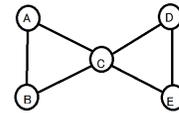
Notice that this game has core stable partitions:  $\{\{1, 2, 3, 4, 5\}, \{6, 7, 8, 9\}, \{10\}\}$  and  $\{\{2, 3, 4, 5\}, \{1, 6, 7, 8, 9\}, \{10\}\}$ . The 5-member cliques weakly block the opposing partition, but there are no coalitions that block either partition. Additionally, agent 10 would not be accepted in either coalition, since its presence decreases the utility of every other member in the coalition.

**THEOREM 4.5.** *Not all SAHGs have strictly core stable partitions.*

**PROOF.** Consider a game based on Figure 3 with parameters  $(a, g, M, L) = (1, 1, 1, 1)$ . For each agent  $i \in N$ , we have:

- $b_i = |C_i \cap F_i| - |C_i \cap E_i|$
- $u_i = b_i + \sum_{j \in C_i} \frac{D(i,j) \cdot b_j}{h_i}$ .

**Figure 3: Game with no strictly core partition**



This game contains two equal-sized cliques connected by a single intermediate agent,  $C$ . The grand coalition is weakly blocked by  $\{A, B, C\}$  and  $\{C, D, E\}$ . If one of these weakly blocking coalitions splits off from the grand coalition, we either have

$$\pi_1 = \{A, B, C\}, \{D, E\} \text{ or } \pi_2 = \{A, B\}, \{C, D, E\}.$$

$\pi_1$  is weakly blocked by  $\{C, D, E\}$  and  $\pi_2$  is weakly blocked by  $\{A, B, C\}$ .

The utility of  $A$  and  $B$  is maximized in  $\{A, B, C\}$ , while  $\{C, D, E\}$  maximizes the utility of  $C$  and  $D$ . The utility of agent  $C$  is maximized by the grand coalition and by  $\{A, B, C\}$  and  $\{C, D, E\}$ . As such, all possible partitions are weakly blocked by  $\{A, B, C\}$ ,  $\{C, D, E\}$ , or both. Thus there is no strictly core stable partition.  $\square$

**PROPOSITION 4.6.** *[1] Contractually individually stable partitions are guaranteed to exist, for all hedonic games.*

## 5 COMPUTATIONAL COMPLEXITY

**PROPOSITION 5.1.** *Computing the utility of a partition for a SAHG is in  $P$ .*

PROOF. Consider a partition  $\pi$  of some game  $G$ . The steps to evaluate the partition are:

- (1)  $\forall i \in N$  and  $\forall j \in \pi(i)$  compute  $D(i, j)$
- (2)  $\forall i \in N$  compute  $h_i$  and  $b_i$
- (3)  $\forall i \in N$  compute  $u_i$
- (4) compute  $U_T(\pi)$ .

We assume that intermediate values are computed once and stored.

In the default case where  $D(i, j)$  is the graph distance between  $i$  and  $j$ , we can use the Floyd-Warshall algorithm to compute this distance for all  $(i, j) \in N \times N$  in time  $O(n^3)$  [6], otherwise, it is  $O(n^2)t(n)$ , where  $t(n)$  is the time needed to compute any  $D(i, j)$  for a SAHG of size  $n$ . We compute  $h_i$  and  $b_i$  in time  $O(n^2)$  by checking each entry in  $\pi(i)$  against the lists  $F_i$  and  $E_i$ . Computing  $h_i$  and  $b_i$  for all  $i \in N$  requires time  $O(n^3)$ . Calculating  $u_i$  requires time  $\Theta(|\pi(i)|) < O(n)$ . So the time required to compute  $u_i$  for all  $i \in N$  is  $O(n^2)$ .  $U_T(\pi)$  can then be computed in time  $O(n)$ . The overall time required to evaluate a partition is  $O(n^3)$ . Thus a partition of a Super Altruistic Hedonic Game can be evaluated in polynomial time.  $\square$

PROPOSITION 5.2. *Deciding whether a partition is Nash stable is in time  $O(n^2 \cdot e(n))$ , where  $e(n)$  is the time needed to evaluate the utility of a coalition.*

PROOF. Consider a partition  $\pi$  of some game  $G$ . To determine if  $\pi$  is Nash stable,  $\forall i \in N$  and  $\forall C \in \pi : C \neq \pi(i)$  we compare  $u_i(\pi(i))$  with  $u_i(C \cup \{i\})$ . If  $\nexists(i, C)$  such that  $u_i(C \cup \{i\}) > u_i(\pi(i))$ , then  $\pi$  is Nash stable.

There are at most  $n$  coalitions in  $\pi$  in the case of the partition of singletons, and for each  $C \in \pi$   $n$  utility values must be computed. At most  $n^2$  utility values must be computed to determine if  $\pi$  is Nash stable. Determining if a partition  $\pi$  is Nash stable requires time  $O(n^2 \cdot e(n))$  where  $e(n)$  is the time needed to compute the utility of a coalition.  $\square$

We have previously demonstrated that FHGs, EHG, and selfish-first AHGs are generalized by SAHG. As a result, SAHG inherit the complexity results of these games. Known complexity results for these games are outlined in Table 1.

COROLLARY 5.3. *Determining if strictly popular partitions exist in SAHG is coNP-hard [10]. Verifying a partition is strictly popular is coNP-hard [10]. Determining if strictly core stable partitions exist is DP-hard [13, 14]. Verifying a partition is (strictly) core stable is coNP-hard [18]. Determining if wonderfully stable partitions exist is DP-hard [13, 14].*

## 6 CONCLUSIONS AND OPEN QUESTIONS

A Probably Approximately Correct (PAC) learning model is intended to find good function approximations. This model has previously been applied to several varieties of hedonic games [16], for instance, to PAC learn stability. We conjecture that SAHG are also PAC learnable.

Future work will address the complexity of optimal partition algorithms for SAHG, and algorithms for finding stable partitions when they exist.

Table 1: Known HG Complexity Results

<b>Strictly Popular Verification</b>		
AHG	coNP-complete	[10]
<b>Strictly Popular Existence</b>		
AHG (selfish-first)	coNP-hard	[10]
<b>Nash Stable Existence</b>		
AHG	Always exist	[10]
<b>Individually Stable Existence</b>		
AHG	Always exist	[10]
<b>Contractually Individually Stable Existence</b>		
AHG	Always exist	[10]
<b>Core Stable Existence</b>		
EHG	Always exist	[7]
FHG	Always exist	[7]
AHG (selfish-first)	Always exist	[10]
<b>Strict Core Stable Existence</b>		
EHG	DP-hard	[13, 14]
FHG	Always exist	[13, 14]
AHG (selfish-first)	Always exist	[10]
<b>Core Stable Verification</b>		
EHG	coNP-complete*	[17]
<b>Strict Core Stable Verification</b>		
EHG	coNP-complete*	[17]
<b>Strict Core Stable Computation</b>		
FHG	P	[7]
<b>Wonderfully Stable Existence</b>		
EHG	DP-hard	[13, 14]
* Corollary of their result for additive games.		

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