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Abstract

We study the effects of institutional constraints on stability, efficiency and network formation. An exogenous "societal cover" consisting of a collection of possibly overlapping subsets covering the set of players specifies the social organization in different groups or "societies". It is assumed that a player may initiate links only with players that belong to at least one society that she also belongs to, thus restricting the feasible strategies and networks. In this setting, we examine the impact of such societal constraints on stable/efficient architectures and on dynamics. We also study stability and stochastic stability in the presence of decay.

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1 Introduction

In recent years, the study of the economics of networks has attracted considerable attention from researchers and become one of the hottest topics of economic research¹. The economics of networks is, in Goyal's words, "an ambitious research program which combines aspects of markets (e.g., prices and competition) along with explicit patterns of connections between individual entities to explain economic phenomena" (Goyal, 2007, p. 6).

Several seminal papers provide the basic models of strategic formation of networks. In the simplest model, links are formed unilaterally (Goyal, 1993, Bala, 1996). In this setting, Bala and Goyal (2000a) study Nash and strict Nash stability and provide a dynamic model. A model where links are formed on the basis of bilateral agreements is studied by Jackson and Wolinsky (1996), who introduce the notion of pairwise stability. These seminal papers assume homogeneity across players and that the current network is common knowledge to all node-players. These models have been extended in different directions. Bala and Goyal (2000b) introduce imperfect reliability of links. Galeotti et al. (2006) consider heterogeneous players, while Bloch and Dutta (2009) consider endogenous link strength. The common knowledge assumption may be unrealistic in many cases, and indeed is dropped by McBride (2006), who studies the effects of limited perception, namely, assuming that each node-player perceives the current network only up to a certain distance from the node.

In the seminal models, networks provide a means for the flow of information or other benefits through the links, but the current network is assumed to be common knowledge to all players, who may unrestrictedly initiate links with any other players. This may be an unrealistic assumption in some cases and, in general, the larger the number of agents and the network are the more unrealistic it will be. Due to what is generically referred to here as "institutional constraints" (social, cultural, linguistic, geographical, economic, etc.), individuals may often see only "part of the world" and initiate links only within that part or a part of that part. Thus, it seems more realistic to assume that a set of possibly overlapping groups (family, tribe, clan, club, gender, age, linguistic community, nationality, professional association, department, etc., depending on the context) configures the social constraints within which individuals interact². More precisely, we assume that each individual may initiate links only within the groups she belongs to. In a way, this is an unorthodox approach if, as put by Goyal, "the theoretical research on network effects (...) is motivated by the idea that, within the same

¹Some recent books surveying this literature are Goyal (2007), Jackson (2008) and Vega-Redondo (2007).

²The importance of group membership is nowadays widely recognized. A vast literature in psychology deals with the relationship between identity and group membership since at least Tajfel and Turner (1979) (see also Brewer (1991) and Brewer and Gardner (1996)). In the economic literature, Akerlof and Kranton (2000) introduce a model where group membership enters the definition of a utility function. In the experimental field see Chen and Li (2009). See Dev (2010) for a recent attempt to relate networks and identity formation.

group [in italics], individuals will have different connections and that this difference in connections will have a bearing on their behavior." (Goyal, 2007, p. 7). Nevertheless, this is the approach adopted here and it is worth remarking that the orthodox single-group assumption is in fact a particular case of the more general setting adopted here. In particular, this allows Bala and Goyal's (2000a) "two-way flow" basic model, on which we concentrate in this paper, to be integrated into a wider model which sheds new light on various conclusions of their model, showing which prevail and up to which point, and which do not in this wider setting.

Based on this idea, this paper focusses on the effects of such institutional constraints on stability, efficiency and network formation. More precisely, an exogenous "societal cover" specifies social organization in different groups or "societies". A societal cover is a collection of possibly overlapping subsets of the set of players or "societies" that covers the whole set (i.e., each player belongs to at least one set in this collection) such that no set in this collection is contained in another. It is assumed that a player may initiate links only with players that belong to one or more of the societies that she also belongs to, thus restricting her feasible strategies, and as a consequence the feasible networks.

It is also assumed that only the part of the current network within each "component" of the societal cover (in a sense to be specified later) is common knowledge to all players in that "component". Further note that this model collapses to Bala and Goyal's (2000a) unrestricted setting for the particular case of the simplest societal cover consisting of a single society including all players. The notion of societal cover seems a rather natural constraining structure in the link-formation context. Moreover, we prove a somewhat confirming result relative to this naturalness: the societal cover model provides the most general symmetric link-formation constraint that can be considered. This in particular means that in the context of bilateral link formation (Jackson and Wolinsky, 1996), where only symmetric constraints make sense, the societal cover provides a general model of constraint. Of course, other (i.e., non-symmetric) types of constraints can be considered in the context of unilateral link-formation.

For any given societal cover, we constrain our attention to the admissible networks (i.e., those consistent with the cover) and first extend Bala and Goyal's (2000a) notion of a Nash network as those admissible networks where no player has an incentive to change her strategy, i.e., her choice of admissible links. We then easily extend their characterization of Nash networks as those among the admissible networks which are minimally connected. The set of such Nash networks is thus a subset of the set of Bala and Goyal's unrestricted Nash networks. Then the notion of strict Nash network is also naturally extended to this setting. Now a strict Nash network is a network consistent with the societal cover where no player may initiate and/or delete any admissible link(s) without loss. By contrast with Nash networks, things turn out to be more complicated with strict Nash networks. In Bala and Goyal's setting, the center-sponsored star is the only (non-empty) architecture of strict Nash networks, while in our setting the center-sponsored star architecture is feasible only when the "societal hub" is not empty,

i.e. there is at least one player that shares membership of at least one society with any other player. Nevertheless, even when the center-sponsored star architecture is feasible, this might not be the only possible architecture of strict Nash networks. A variety of architectures of strict Nash networks appear for non-single society covers, and the more complex the societal cover the greater this variety is. Nevertheless, some patterns are common to these architectures. Moreover, a full characterization of all strict Nash networks for a societal cover is provided by means of a condition that encapsulates synthetically the essence of the architecture of these networks, embodying a clear hierarchical principle. The main features of their architectures, where stars continue to play a prominent role, are studied. Particular attention is paid to the role of players who belong to more than one society, by means of whom different but overlapping societies can be connected. It turns out that the two-way flow model under societal constraints yields as strict Nash networks the paradigm of hierarchical structures: either oriented diverging trees (also called "arborescences" in graph theory) or a sort of "grafted" oriented trees. The latter are proved to be possible only when there are "hinge-players", i.e., players who are the *unique* common member of two or more societies.

We then apply Bala and Goyal's dynamic model, where starting from any initial network each player with some positive probability plays a best response or randomizes across them when there is more than one, otherwise the player exhibits inertia, i.e., keeps her links unchanged. In this way, a Markov chain on the state space of all networks is defined. In Bala and Goyal's setting, the absorbing states are precisely the strict Nash networks and they prove that starting from any network the dynamic process converges to a strict Nash network (i.e., the empty network or a center-sponsored star) with probability 1. When adapted to our setting the best response dynamic model does not necessarily lead to strict Nash networks. The reason is that in our more complex setting this dynamic process may lead to the formation of partially stable "incomplete" strict Nash incompatible networks that cannot be part of the same strict Nash network, thus blocking the converging process. Therefore institutional constraints may hinder the way towards strict Nash networks. Nevertheless, best response dynamics lead to absorbing sets of minimally connected networks that we call "quasi-strict Nash networks" and characterize them. Thus, with probability 1, best response dynamics would lead either to a strict Nash network (whenever the set of quasi-strict Nash networks reached is a singleton) or one of these absorbing sets of quasi-strict Nash networks where the best response dynamics would oscillate forever. Nevertheless stability is reached in terms of payoffs as it is proved that all quasi-strict Nash networks within each of these absorbing sets yield the same payoffs to all players.

We end by examining the impact of decay on this setting. We first partially extend some of Bala and Goyal's results studying the relative robustness of different strict Nash networks in the presence of decay for certain societal covers. It turns out that when feasible, i.e., when the societal hub is not empty, stars are the most robust strict Nash networks. More precisely, in the presence of decay stars remain strictly stable

within a wider range of values for the parameters (cost and level of decay), while other strict Nash architectures remain stable only within narrower ranges. We then study stochastically stable networks using Feri's (2007) dynamic model. We obtain similar conclusions about the relative robustness of different strict Nash architectures. We extend Feri's (2007) model and show in particular how when the societal hub is not empty and for all the societies the number of individuals that belong to that society and only that one is sufficiently large, stars are the only stochastically stable architectures. As to efficiency in the presence of decay, a general conclusion seems to arise: in the presence of decay, efficiency and stability go basically in the same direction at least when the societal hub is not empty, as the star centered at the societal hub is the non-empty architecture with the most robust stability and most efficient.

The rest of the paper is organized as follows. In section 2, the basic model is specified along with the necessary notation and terminology. Section 3 studies stability and efficiency under institutional constraints. In section 4, Bala and Goyal's dynamic model is extended to this setting. In section 5, we study the effects of introducing decay in the model and discuss stability in 5.1, stochastic stability in 5.2 and efficiency in 5.3. Finally, section 6 summarizes the main conclusions and points out some lines of further research.

2 The model

Let $N = \{1, 2, ..., n\}$ denote the set of nodes or players. Players may choose with which other players to initiate or support links. By $g_{ij} \in \{0, 1\}$ we denote the existence $(g_{ij} = 1)$ or not $(g_{ij} = 0)$ of a link connecting i and j initiated by i. Vector $g_i = (g_{ij})_{j \in N \setminus i} \in \{0, 1\}^{N \setminus i}$ specifies³ the set of links supported by i and will be referred to as an (unrestricted) strategy of player i. $G_i := \{0, 1\}^{N \setminus i}$ denotes the set of i's (unrestricted) strategies and $G_N = G_1 \times G_2 \times ... \times G_n$ the set of (unrestricted) strategy profiles. An unrestricted strategy profile $g \in G_N$ univocally determines a directed $network^4$ (N, Γ_q) , where

$$\Gamma_g := \{(i,j) \in N \times N : g_{ij} = 1\},\$$

that we identify with g and refer to as network g. If $M \subseteq N$ we denote by $g|_M$ the subnetwork $(M, \Gamma_{g|_M})$ with

$$\Gamma_{g|_M} := \{(i,j) \in M \times M : g_{ij} = 1\}.$$

We now consider the following situation. An exogenous "societal cover" specifies a set of possibly overlapping "societies" that represent a social constraint in the following sense: each player in N can initiate links with any other player as long as they share membership of at least one society. Formally, we have the following

³We always drop the brackets "{..}" in expressions such as $N\setminus\{i\}$.

⁴In graph theory this is called a "digraph" without loops, i.e., edges connecting a node with itself (see, for instance, Tutte (1984)).

Definition 1 A "societal cover" of N is a collection of subsets of N (called "societies"), $\mathcal{K} \subseteq 2^N$, such that: (i) $\bigcup_{A \in \mathcal{K}} A = N$, and (ii) for all $A, B \in \mathcal{K}$ ($A \neq B$), $A \nsubseteq B$.

Condition (i) ensures that every player belongs to at least one society; while condition (ii) precludes superfluous societies: if $A \subseteq B$, A would be superfluous given the interpretation of societies.

We denote by $\mathcal{K}_i \subseteq \mathcal{K}$ the set of *societies* to which *i* belongs, and by $N(\mathcal{K}_i) \subseteq N$ the set of *nodes* that *i* may directly access, that is:

$$\mathcal{K}_i := \{ A \in \mathcal{K} : i \in A \}$$

and

$$N(\mathcal{K}_i) := \bigcup_{A \in \mathcal{K}_i} A.$$

Two nodes i, j have identical affiliation if they belong to the same societies, i.e., $\mathcal{K}_i = \mathcal{K}_j$. Two nodes i, j have the same reach if $N(\mathcal{K}_i) = N(\mathcal{K}_j)$. Note that identical affiliation implies the same reach, but the converse is not true.

Example 1 If $N = \{1, 2, 3, 4, 5, 6, 7, 8, 9\}$ and

$$\mathcal{K} := \{\{1, 2, 3, 4, 5, 6\}, \{4, 5, 6, 7, 8, 9\}, \{1, 2, 4, 5, 7, 8\}, \{2, 3, 5, 6, 8, 9\}\},\$$

then 2 and 4 have the same reach: $N(\mathcal{K}_2) = N(\mathcal{K}_4) = N$, but different affiliations as $\mathcal{K}_2 \neq \mathcal{K}_4$.

Observe that we consider a particular type of a more general situation where an exogenous "link-constraining system" specifies for each player in N with which other players she can initiate links. Formally, we have the following

Definition 2 A "link-constraining system" in N is a collection of subsets of N, $\mathcal{L} = \{\mathcal{L}_i\}_{i \in \mathbb{N}}$, such that, for all $i, i \in \mathcal{L}_i$.

With the anticipated interpretation: each player i is assumed to be able to initiate links with any player in \mathcal{L}_i (different from herself, as it is only a matter of convenience to include i in set \mathcal{L}_i). Note that this allows for asymmetric situations, where it may be the case that a player i may initiate a link with j but j cannot initiate a link with i. In particular, a societal cover \mathcal{K} imposes a link-constraining system, namely $L(\mathcal{K}) := \{N(\mathcal{K}_i)\}_{i\in N}$, by limiting the reach of each player. This raises the reciprocal issue: under which conditions a link-constraining system \mathcal{L} can be interpreted as associated with or imposed by a societal cover? The answer is given by the following condition: a link-constraining system \mathcal{L} is symmetric if for all $i, j \in \mathcal{N}$: $i \in \mathcal{L}_j$ if and only if $j \in \mathcal{L}_i$. Then we have the following result.

Proposition 1 A link-constraining system \mathcal{L} can be interpreted as associated with or imposed by a societal cover if and only if it is symmetric.

Proof. Necessity (\Rightarrow) : It follows immediately from the constraints imposed by a societal cover.

Sufficiency (\Leftarrow): Let \mathcal{L} be a symmetric link-constraining system. Define $K(\mathcal{L})$ as the set of non-empty subsets A of N s.t. (i) for all $i \in A$, $A \subseteq \mathcal{L}_i$, and (ii) no $A' \supseteq A$ exists that satisfies condition (i). First note that $K(\mathcal{L})$ is well-defined given that the set of subsets that satisfy condition (i) is partially ordered by inclusion, and consequently maximal elements do exist. $K(\mathcal{L})$ consists of such maximal elements. Equivalently, $K(\mathcal{L})$ consists of maximal sets with this property: every two nodes within the set are within each other's reach. Further note that for all $i, i \in A$ for some $A \in K(\mathcal{L})$, given that $\{i\} \subseteq \mathcal{L}_i$, and for all $A, A' \in K(\mathcal{L})$ s.t. $A \neq A'$, $A \not\subseteq A'$. Therefore $K(\mathcal{L})$ is a societal cover. It only remains to be shown that for all $i, N(K_i(\mathcal{L})) = \mathcal{L}_i$, i.e., that $\bigcup_{A:i\in A\in K(\mathcal{L})}A = \mathcal{L}_i$. First, assume $j \in N(K_i(\mathcal{L})) = \bigcup_{A:i\in A\in K(\mathcal{L})}A$, i.e., $j \in A \in K(\mathcal{L})$ for some A s.t. $i \in A$. Then by condition (i) in the definition of $K(\mathcal{L})$, $A \subseteq \mathcal{L}_i$ and consequently $j \in \mathcal{L}_i$. Now reciprocally, assume $j \in \mathcal{L}_i$. Then, given that \mathcal{L} is symmetric, $i \in \mathcal{L}_j$. Therefore $\{i,j\}$ satisfies condition (i) in the definition of $K(\mathcal{L})$, and consequently $\{i,j\}\subseteq A$ for some $A \in K(\mathcal{L})$. Thus $j \in \bigcup_{A:i \in A \in K(\mathcal{L})} = N(K_i(\mathcal{L}))$.

Proposition 1 provides a different (but equivalent) interpretation: a societal cover specifies a symmetric link-constraining system. But note that different societal covers may yield the same link-constraining system. Nevertheless, it is easy to check that for any link-constraining system \mathcal{L} the cover $K(\mathcal{L})$ constructed in the proof of Proposition 1 is the maximal one that yields it in the following sense: any society of any cover that yields that link-constraining system is contained in some society of $K(\mathcal{L})$. In fact, we have the following relationship:

$$L(K(\mathcal{L})) = \mathcal{L},$$

while in general the maximal societal cover that represents the link-constraining system imposed by a societal cover \mathcal{K} differs from \mathcal{K} , that is: $K(L(\mathcal{K})) \neq \mathcal{K}$. For instance, for the societal cover in Example 1

$$K(L(\mathcal{K})) = \{N \setminus \{1,3\}, N \setminus \{3,9\}, N \setminus \{7,9\}, N \setminus \{1,7\}\} \neq \mathcal{K}.$$

It is worth remarking the generality of the type of constraint a societal cover imposes: all the results that follow apply to any symmetric link-constraining system⁵. Nevertheless we find the societal cover notion closer to, or at least embodying a more intuitive perception of, real world constraints, and it is in these terms that all results are presented.

⁵In particular, in the context of bilateral link formation (Jackson and Wolinsky, 1996) only symmetric link-constraining make sense. In other words, in the context of bilateral link formation the societal cover provides a general model of constraint.

A component C of a societal cover K is a subset $C \subseteq K$ such that (i) for all $A, B \in C$ there exist $A_1, ..., A_k \in K$ s.t. $A_1 = A$ and $B = A_k$, and $A_i \cap A_{i+1} \neq \emptyset$ for i = 1, ..., k-1, and (ii) for all $B \in K \setminus C$, $B \cap (\bigcup_{A \in C} A) = \emptyset$. The subset $\bigcup_{A \in C} A$ of N covered by a component C is denoted by N(C). For each i, $C_i(K)$ denotes the component of K that contains K_i . A societal cover is connected if it has a unique component. The societal hub of a societal cover is the set of nodes whose reach is N, i.e.,

$$hub(\mathcal{K}) := \{i \in N : N(\mathcal{K}_i) = N\}.$$

This set may be empty. Note that only the players in the societal hub may have direct access to all individuals in N.⁶

Let \mathcal{K} be a societal cover of N, if $\mathcal{K}' \subseteq \mathcal{K}$ we say that \mathcal{K}' is a subcover of \mathcal{K} if \mathcal{K}' is a societal cover of $N(\mathcal{K}') := \bigcup_{A \in \mathcal{K}'} A$ s.t. for all $A \in \mathcal{K}$, $A \subseteq N(\mathcal{K}')$ implies $A \in \mathcal{K}'$. In particular, a component of a societal cover \mathcal{K} is a (connected) subcover of \mathcal{K} .

The following definition constrains the structure of a network so as to be consistent with a given societal cover of N by ruling out links connecting individuals who are not members of at least one society in common.

Definition 3 A network g is consistent with a societal cover \mathcal{K} (or is a \mathcal{K} -network) if for every link $g_{ij} = 1$ there exists some $A \in \mathcal{K}$ s.t. $i, j \in A$ (i.e., $\mathcal{K}_i \cap \mathcal{K}_j \neq \emptyset$).

A vector $g_i = (g_{ij})_{j \in N(\mathcal{K}_i) \setminus i} \in \{0, 1\}^{N(\mathcal{K}_i) \setminus i}$ specifies a set of \mathcal{K} -feasible links initiated by i and is referred to as a \mathcal{K} -admissible strategy of player i, as we assume i's capacity to choose which links to support $in\ N(\mathcal{K}_i)$. $G_i(\mathcal{K}) := \{0, 1\}^{N(\mathcal{K}_i) \setminus i}$ denotes the set of i's \mathcal{K} -admissible strategies and $G_{\mathcal{K}} = G_1(\mathcal{K}) \times G_2(\mathcal{K}) \times ... \times G_n(\mathcal{K})$ the set of \mathcal{K} -admissible strategy profiles. A \mathcal{K} -admissible strategy profile g univocally determines a \mathcal{K} -network that we identify with g.

Observe that this setting is *not* narrower than Bala and Goyal's standard one. It is in fact more general as the standard (i.e., unrestricted) notions of network, strategy and strategy profile correspond to the particular case of the simplest societal cover $\mathcal{K} = \{N\}$, where a single society includes all players and all links are feasible.

Given a network g, we denote $\bar{g}_{ij} := max\{g_{ij}, g_{ji}\}$. In this way a non-directed network \bar{g} is defined⁷. \bar{g} represents the effective communication provided by network g, which is independent of who supports the existing links according to the assumptions of the model. We say that there is a path of length k from i to j in g if there exist k+1 players $j_0, j_1, ..., j_k$, s.t. $i = j_0, j = j_k$, and for all l = 1, ..., k, $\bar{g}_{j_{l-1}j_l} = 1$, and we say that such a path is i-oriented if for all l = 1, ..., k, $g_{j_{l-1}j_l} = 1$. A path (oriented or not)

⁶A more restrictive notion is that of societal core or set of nodes that belong to all societies, i.e., $core(\mathcal{K}) := \cap_{A \in \mathcal{K}} A$. In general, $core(\mathcal{K}) \subsetneq hub(\mathcal{K})$. For instance, in Example 1 we have $core(\mathcal{K}) = \{5\}$ and $hub(\mathcal{K}) = \{2, 4, 5, 6, 8\}$. But it is easy to check that for any \mathcal{K} $core(K(L(\mathcal{K}))) = hub(K(L(\mathcal{K})))$. In other words, core and hub coincide for maximal covers. In Example 1, $core(K(L(\mathcal{K}))) = hub(K(L(\mathcal{K}))) = \{2, 4, 5, 6, 8\}$.

⁷In graph theory terms, \bar{g} is the "underlying graph" of digraph g (see, e.g., Tutte, 1984).

is \mathcal{K} -feasible if all its links are \mathcal{K} -feasible. The set of players with whom i supports a link is denoted by $N^d(i;g)$, and the set of players connected with i by a path (union $\{i\}$) by N(i;g), and their cardinalities by $\mu_i^d(g) := \#N^d(i;g)$ and $\mu_i(g) := \#N(i;g)$. Note that if g is a \mathcal{K} -network then $N^d(i;g) \subseteq N(\mathcal{K}_i)$ and $N(i;g) \subseteq N(\mathcal{C}_i(\mathcal{K}))$. We say that a network g is an oriented diverging tree (converging tree) if there is a node i_0 such that for any other node j there is a unique path connecting it with the node root i_0 and such path is i_0 -oriented (j-oriented).

A component of a network g is a subnetwork $g|_C$, where $C \subseteq N$, such that any two players in C are connected by a path, and no player in $N \setminus C$ is connected by a path with a player in C. We say that g is connected if g is the unique component of g. A network is minimal if for all i, j s.t. $g_{ij} = 1$, the number of components of g is smaller than the number of components of g - ij, where g - ij is the network that results by replacing $g_{ij} = 1$ by $g_{ij} = 0$ in g (similarly, when $g_{ij} = 0$ we write g + ij to represent the network that results by replacing $g_{ij} = 0$ by $g_{ij} = 1$ in g). A network is minimally connected if it is connected and minimal.

Remark: Note the relationship between the notions of connected component of a societal cover K of N and connected component of a K-network: a connected component of a K-network is always covered by a connected component of the societal cover K.

We denote by g_{-i} the network where all links supported by i in g are deleted, and by (g_{-i}, g'_i) the strategy profile and network that results by replacing g_i by g'_i in g.

It is assumed that each node contains valuable information and a link allows that information to flow in both directions, without friction or decay⁸, independently of who supports it, so that each node receives the information from all nodes with which it is connected by a path. Let $v_{ij} > 0$ be the payoff that player i derives from connecting directly (by a link) or indirectly (by a path) with player j, and $c_{ij} > 0$ the cost for player i of initiating a link with j. Thus, the payoff of player i in g is

$$\Pi_i(g) = \sum_{j \in N(i;g)} v_{ij} - \sum_{j \in N^d(i;g)} c_{ij}.$$

If we assume costs and benefits to be homogeneous⁹ across players (i.e., $v_{ij} = v$ and $c_{ij} = c$, for all i, j) and v > c, connections with new nodes are always profitable and¹⁰

$$\Pi_i(g) = v\mu_i(g) - c\mu_i^d(g). \tag{1}$$

⁸This assumption is abandoned in section 5.

⁹The societal cover imposes a certain heterogeneity but of different nature of the one considered in Galeotti et al. (2006), where players are assumed to be partitioned into disjoint groups that can be ordered on a line so that the distance is interpreted as a measure of the heterogeneity and the cost of a link between two players depends on the distance between the groups these players belong to. This model does not include, nor is included in, the one we are dealing with here.

¹⁰Although the results presented here can easily be extended with some slight modifications to the case where payoffs are, as in Bala and Goyal (2000a), given by a function $\Phi(\mu_i(g), \mu_i^d(g))$, where $\Phi(x,y)$ is strictly increasing in x and strictly decreasing in y, we prefer this simpler assumption about payoffs so as to make the statements of the basic results simpler. The assumption v>c is dropped in section 5 when we consider decay.

A \mathcal{K} -network is *efficient* if it maximizes the aggregate payoff under the constraint of \mathcal{K} -feasible payoffs, that is, those that can be obtained by means of \mathcal{K} -networks.

We next discuss some notions of stability of networks consistent with a given societal cover \mathcal{K} .

3 Stability and efficiency

The following definitions are natural extensions of the notions of Nash stability and strict Nash stability following Bala and Goyal (2000a) for a network in a scenario where payoffs are given by (1) and: (i) a societal cover \mathcal{K} allows only for links connecting individuals that have at least one society in common, and (ii) all players in the same component \mathcal{C} of \mathcal{K} , i.e., in $N(\mathcal{C})$, have common knowledge of the part of the current network connecting individuals of $N(\mathcal{C})$. The common knowledge assumption restricted to players in the same component of the cover can be justified by assuming that information about the current network propagates between overlapping societies¹¹. Note that this scenario yields the unconstrained and common-knowledge environment of Bala and Goyal (2000a) for the particular case of the simplest societal cover: $\mathcal{K} = \{N\}$.

Definition 4 A Nash K-network is a K-network g that is stable under K-admissible strategies, that is, for all $i \in N$:

$$\Pi_i(g) \ge \Pi_i(g_{-i}, g_i') \quad \text{for all } g_i' \in G_i(\mathcal{K}).$$
 (2)

When (2) holds, we say that g_i is a best (admissible) response of i to g_{-i} . Thus, in a Nash \mathcal{K} -network every player is playing a best \mathcal{K} -admissible response to those played by the others. Note that for $\mathcal{K} = \{N\}$ a Nash \mathcal{K} -network is a Nash network in the standard setting.

The stability notion can be refined in the strict sense by extending Bala and Goyal's strict Nash networks.

Definition 5 A strict Nash K-network is a Nash K-network g such that for all $i \in N$:

$$\Pi_i(g) > \Pi_i(g_{-i}, g_i') \quad \text{for all } g_i' \in G_i(\mathcal{K}) \ (g_i' \neq g_i).$$
(3)

Thus, (3) means that in a strict Nash \mathcal{K} -network every player is playing her *unique* best (admissible) response to those played by the others. Likewise note that for $\mathcal{K} = \{N\}$ a strict Nash \mathcal{K} -network is a strict Nash network in the standard setting.

¹¹This assumption can be weakened by assuming that each player knows which nodes are within her reach and the payoff associated with each of her strategies if played against the current network g, that is, $N(i; (g_{-i}, g'_i))$ for all g'_i . This is a weaker assumption as many different networks may yield the same payoff, and it is not completely unrealistic: one individual may have a clear idea of how worthy is a connection even ignoring the details of the connections of that connection.

Given the constraints on information, strategies and feasible networks that a societal cover imposes, the set of players $N(\mathcal{C})$ in each component \mathcal{C} of the cover, where subcover \mathcal{C} prescribes what links are feasible, form an entirely "separate world": no link with $N\backslash N(\mathcal{C})$ is possible and no information about it reaches $N(\mathcal{C})$. In particular we have the following straightforward result.

Proposition 2 A K-network g is a Nash (strict Nash) K-network if and only if $g \mid_{N(C)}$ is a Nash (strict Nash) C-network for each component C of K.

Remark: Although societies consisting of a single individual are included in the model, such trivial societies are of no interest in this setting. Moreover, the only connected societal cover \mathcal{K} that contains a society A s.t. #A = 1 is $\mathcal{K} = \{A\}$.

Therefore, in view of Proposition 2 and the preceding remark, in what follows our attention is constrained to connected societal covers and we always assume that all societies have at least two individuals. The following proposition extends Bala and Goyal's result to this setting.

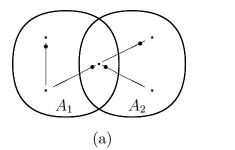
Proposition 3 A K-network g is a Nash K-network if and only if it is minimally connected.

Proof. Necessity (\Rightarrow): Let \mathcal{K} be a connected societal cover of N, and g a \mathcal{K} -network. Assume g is not connected. Then there exist two nodes $i, j \in N$ not connected by a path in g. As cover \mathcal{K} is connected, a finite sequence of nodes $x_1, ..., x_m$ exists, such that $x_1 = i, x_m = j$ and for each k = 1, ..., m-1, there is some $A \in \mathcal{K}$ s.t. $x_k, x_{k+1} \in A$. Then for at least two consecutive nodes among these m nodes, say x_k and x_{k+1} , there is no path in g connecting them. But then it is feasible and profitable for either of these two nodes to initiate a link with the other. Thus g must be connected. If g were not minimal there would be some superfluous link that could be eliminated and that would benefit the player that did so, and consequently g would not be a Nash \mathcal{K} -network.

Sufficiency (\Leftarrow): Reciprocally, assume that g is minimally connected. Let i be any player and g'_i be any strategy $g'_i \in G_i(\mathcal{K})$ ($g'_i \neq g_i$). We show that $\Pi_i(g) \geq \Pi_i(g_{-i}, g'_i)$. A new strategy $g'_i \neq g_i$ means deleting some links and initiating new ones. If g is minimally connected, then each deletion means disconnecting i with a set of nodes, and if there is more than one deletion, any two of these sets of nodes disconnected from i must also be disconnected from each other (otherwise a deleted link would be redundant). Thus the number of links initiated should be at least equal to the number deleted, otherwise the payoff would decrease. But then i's payoff for (g_{-i}, g'_i) cannot be greater than for g. Therefore if g is minimally connected no player has an incentive to make any \mathcal{K} -admissible change.

In Bala and Goyal (2000a), the following result is established (in our terminology and under the assumptions about costs and benefits made here¹²): a network is effi-

 $^{^{12}}$ In fact, given their weaker assumptions on the payoffs (see footnote 10), the empty network may also be Nash stable in their setting, as would be the case in ours assuming c > v in (1).



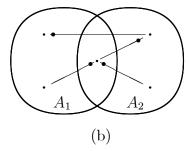


Figure 1: Minimally connected networks and K-networks.

cient if and only if it is minimally connected, and Nash networks are those minimally connected. In view of this, we have the following

Corollary 1 A network g is an efficient K-network if and only if g is a Nash K-network.

Therefore, for any given set of nodes N and any societal cover \mathcal{K} , the set of Nash \mathcal{K} -networks is a subset of the set of standard unrestricted Nash networks. In Figure 1 two minimally connected networks are represented¹³: (a) is a Nash \mathcal{K} -network, while (b) is not even a \mathcal{K} -network because one link connects two nodes that do not belong to the same society.

We now focus on strict Nash K-networks. Stars of different types play an important role in network stability in different contexts (see, e.g., Bala and Goyal (2000a, 2006), Jackson and Wolinsky (1996), Bloch and Dutta (2009)), and, as we show below, they are also important in connection with strict Nash K-networks. In this context, the following variant of the notion of center-sponsored star proves useful.

Definition 6 A set of players $M \subseteq N$ (# $M \ge 2$) is said to be connected by a center-sponsored stars in a network g if $g \mid_{M} = s$ and there is a node $i \in M$ s.t. $N^{d}(i;g) = M \setminus i$ and $g_{jk} = 0$ for all $j \in M \setminus i$ and all $k \in M \setminus j$.

Note that, according to this definition: (i) a center-sponsored star does *not* necessarily connect all players in N; (ii) its center i can be linked from other nodes different from those in the star; and (iii) the nodes in the periphery, i.e., those j in M s.t. $g_{ij} = 1$ can be connected with other nodes that do not belong to the star. When M = N we say that the star is *all-encompassing*.

Re-stated in terms of the current setting, notation and terminology, and adapted to it, Bala and Goyal (2000a) establish the following result: the only strict Nash networks are those consisting of a single center-sponsored star that connects all players¹⁴.

¹³As in all figures, nodes are represented by dots (without labels unless convenient for the purpose of the illustration), links by segments between them, and a filled circle over a link close to a node indicates the node that supports it.

¹⁴Given their weaker assumptions on the payoffs (see footnotes 10 and 12), the empty network may also be strict Nash in their setting.

As we show below, the societal cover diversifies the stable/efficient networks. A variety of constellations of interconnected stars emerges as possible strict Nash \mathcal{K} -networks depending on the structure of the societal cover; moreover, in general, several architectures appear as strict Nash for a given societal cover. Our next goal is to identify and characterize these networks.

In the characterization of strict Nash K-networks, the following binary relation on N associated with a network g plays an important role. Let \xrightarrow{g} be the transitive closure of the binary relation L_g defined by

$$i L_a j \Leftrightarrow (i = j \text{ or } q_{ij} = 1).$$

That is to say, $i \xrightarrow{g} j$ if i = j or there exists an *i-oriented* path from i to j. This relation is obviously transitive, but in general, for an arbitrary network g, it is not complete, antisymmetric or acyclic¹⁵. But if g is minimally connected, then \xrightarrow{g} is certainly antisymmetric and acyclic (otherwise at least one link would be redundant). Thus, in view of Proposition 3, we have the following

Lemma 1 For any Nash K-network g, the binary relation $\stackrel{g}{\rightarrow}$ is a partial order on N.

For any Nash K-network g, we use the following terminology. We say that i is a predecessor of j (and that j is a successor of i) in g if $i \neq j$ and $i \xrightarrow{g} j$. We say that a node is terminal in g if it has no successors, and we say that a node is maximal in g if it has no predecessors.

As we will presently prove, strict Nash K-networks have a strongly hierarchical structure and the following terminology proves useful.

Definition 7 A node j is "within hierarchical reach" of another node i in a minimally connected K-network g if j is within i's reach and j is not a predecessor of i nor there is a predecessor of i connected with j through a path not containing i.

That is, j is within hierarchical reach of i in g if: (i) $j \in N(\mathcal{K}_i) \setminus i$, (ii) $j \not\stackrel{g}{\Rightarrow} i$, and (iii) there is no $k \neq i$ s.t. $k \stackrel{g}{\Rightarrow} i$ and $j \in N(k; g|_{N \setminus i})$. Note that a necessary condition for for j to be within hierarchical reach of i in g it is that $g_{ji} = 0$, but it is not required that $g_{ij} = 1$. When this is required, so that every node supports links with every node within its hierarchical reach, the network adopts a strongly hierarchical structure as we will presently see. This motivates the following

Definition 8 A K-network g is "hierarchical" if it is minimally connected and every node supports links with all those within its hierarchical reach in g.

¹⁵A binary relation R on a set X is antisymmetric if, for all $x, y \in X$, xRy and yRx, implies x = y; and R is said to be acyclic if there is no finite chain $x_1, x_2, ..., x_n$ in X s.t. x_kRx_{k+1} for k = 1, 2, ..., n-1, and x_nRx_1 , unless $x_k = x_{k+1}$ for k = 1, 2, ..., n-1. In general, the second condition is weaker than the first, but when the relation is transitive they are equivalent.

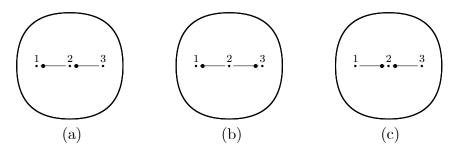


Figure 2: Hierarchical and non-hierarchical connections.

Figure 2, representing three situations where three nodes belonging to a society are connected by two links, illustrates Definitions 7 and 8. Only (c) can occur in a hierarchical \mathcal{K} -network one of whose societies contains the three nodes, while (a) and (b) cannot. In (a) 3 is within 1's hierarchical reach and $g_{13} = 0$, and in (b) 1 and 3 are within each other's hierarchical reach and $g_{13} = g_{31} = 0$.

Then we have the following characterization: strict Nash K-networks are just hierarchical K-networks.

Theorem 1 A network g is a strict Nash K-network if and only if g is a hierarchical K-network.

Proof. Necessity (\Rightarrow): Obviously, a strict Nash \mathcal{K} -network g is also a Nash \mathcal{K} -network and, by Proposition 3, necessarily minimally connected, so that, by Lemma 1, $\stackrel{g}{\rightarrow}$ is a partial order. Now let i be a node in g and assume $g_{ij} = 0$ for some j within i's hierarchical reach, i.e., some $j \in N(\mathcal{K}_i) \setminus i$ that is not a predecessor of i and for which there is no k predecessor of i such that $j \in N(k; g|_{N \setminus i})$. As g is minimally connected, there must be a path connecting i and j, that then does not contain any predecessor of i. Therefore the first link on that path must be a link supported by i. But then i can delete that link and initiate a link with j without altering i's payoff, and consequently g is not a strict Nash \mathcal{K} -network.

Sufficiency (\Leftarrow): Assume that g is a minimally connected \mathcal{K} -network. According to Proposition 3, g is a Nash \mathcal{K} -network. Let i be any node and any $g'_i \in G_i(\mathcal{K})$ s.t. $g'_i \neq g_i$. We show that $\Pi_i(g) > \Pi_i(g_{-i}, g'_i)$ if g is hierarchical. Reasoning as in Proposition 3, as g is minimally connected, $g'_i \neq g_i$ involves deleting some links and initiating at least an equal number of new links for (g_{-i}, g'_i) to be also minimally connected, otherwise i's payoffs would be smaller in (g_{-i}, g'_i) , but in fact the number of links deleted and that of those newly initiated by i should be the same for the same reason. Let link ii' be one of the former (i.e., $g_{ii'} = 1$ and $g'_{ii'} = 0$) and let ij be one of the latter (i.e., $g_{ij} = 0$ and $g'_{ij} = 1$). If g is hierarchical, either j is a predecessor of i in g or there exists a k predecessor of i in g such that $j \in N(k; g \mid_{N \setminus i})$. But this implies a cycle in (g_{-i}, g'_i) . The reason is this: evidently adding link $g'_{ij} = 1$ to g means a cycle in $(g_{-i}i') + ij$, but it must be proved that this cycle is contained $in(g_{-i}, g'_i)$. This is so because no link in the path in g connecting i and j can have been initiated by i (this would imply a

cycle in g, which is assumed to be minimally connected). Therefore, no matter which other links in g_i are deleted in g'_i , the cycle is entirely contained in (g_{-i}, g'_i) . The same can be said about all new links in g'_i w.r.t. g_i , all new links are redundant in (g_{-i}, g'_i) . Therefore necessarily $\Pi_i(g) > \Pi_i(g_{-i}, g'_i)$.

This characterization allows in particular for a constructive proof of existence of strict Nash \mathcal{K} -networks for any societal cover \mathcal{K} : start at any node i_0 and initiate links with all nodes in $N(\mathcal{K}_{i_0})$, then extend the network by initiating new links from those nodes, always respecting hierarchical priority. In fact we have the following result:

Proposition 4 For any societal cover K and any node $i_0 \in N$ there exists an oriented diverging tree g rooted at i_0 that is a strict Nash K-network.

Proof. Iterate the following procedure:

- Step 0: Initially let i_0 be any player in N, and g^0 the \mathcal{K} -network that results by i_0 initiating links with all players in $N(\mathcal{K}_{i_0})$, and let $C_0 := N(\mathcal{K}_{i_0})$.
- Step from k to k+1: If g^k is the current \mathcal{K} -network resulting from step k, take a terminal node, say i_{k+1} , in g^k , for which the set of nodes $N(\mathcal{K}_{i_{k+1}}) \setminus C_k$ is not empty, and let i_{k+1} initiate links with all those players. If no such node exists, stop; otherwise, let g^{k+1} be the \mathcal{K} -network that results by adding all these links initiated by i_{k+1} to g^k , and $C_{k+1} := C_k \cup N(\mathcal{K}_{i_{k+1}})$.

It is clear that if K is connected, this iterated process must stop in a finite number of steps (when $C_k = N$) and the resulting network will be an oriented diverging tree rooted in i_0 that is obviously hierarchical, thus forming a strict Nash K-network connecting all players in N.

As a corollary of Theorem 1, the following propositions establish some prominent features of the architecture of strict Nash \mathcal{K} -networks that help to form a clearer idea about these networks, which we later illustrate with some examples. The first one shows the role of stars in strict Nash \mathcal{K} -networks.

Proposition 5 In a strict Nash K-network q:

- (i) There is at least one node that supports links with all nodes within its reach.
- (ii) For each society $A \in \mathcal{K}$, $g \mid_A$ consists of disjoint center-sponsored stars and/or isolated nodes.
- **Proof.** (i) By Lemma 1, given that g is minimally connected, $\stackrel{g}{\rightarrow}$ is a partial order and necessarily exists at least one maximal element, i.e., with no predecessor. Let i_0 be a maximal element. As i_0 is maximal, by Theorem 1, necessarily $N^d(i_0; g) \cup \{i_0\} = N(\mathcal{K}_{i_0})$, i.e., i_0 must support links with all nodes within its reach.
- (ii) Let A be a society in the cover K. Assume that for some $i, j \in A$, $g_{ij} = 1$. It is enough to show that the only other link that may exist connecting any $k \in A \setminus \{i, j\}$ with i or j is a link supported by i. Assume that $g_{kj} = 1$. Then, k can delete the link with j and initiate one with i and have the same payoff. Assume that $g_{jk} = 1$. Then, i can delete the link with j and initiate one with k and have the same payoff. Finally,

assume that $g_{ki} = 1$. Then k can delete the link with i and initiate one with j and have the same payoff. Thus, the only remaining possibility of a link connecting any $k \in A \setminus \{i, j\}$ with i or j is a link $g_{ik} = 1$.

As an immediate corollary of Proposition 5, we have the following conclusion that yields Bala and Goyal's result as a particular case.

Corollary 2 An all-encompassing star is a strict Nash K-network if and only if the societal hub is non-empty and the center belongs to it. In particular, when $K = \{N\}$ the only strict Nash K-networks are the all-encompassing center-sponsored stars.

Observe the similarity of the proof of part (ii) with Bala and Goyal's proof of their result and its differences: minimal connectedness and "strict Nash-ness" do not entail all nodes in a society A being connected by a single star. Now the possibility of other center-sponsored stars within a society is left open, along with even the possibility of some nodes being left outside these stars (but linked through nodes belonging to societies other than A). Yet the hierarchical arrangement of a strict Nash K-network entails a maximum of two levels within each society: centers and spokes (as seen in Figure 2). The question now is: how do nodes in different societies interconnect in g? Evidently through overlapping societies. More precisely, the following proposition shows that in a strict Nash K-network connections "propagate" in an oriented way that can be reversed only at a node that is linked by another two whose reaches' intersection contains only that player.

Proposition 6 Let g be a strict Nash K-network, and $i, j, k \in N$ s.t. $g_{ji} = g_{ki} = 1$, then necessarily $N(K_j) \cap N(K_k) = \{i\}$.

Proof. Let g be a strict Nash \mathcal{K} -network, and $i, j, k \in N$ s.t. $g_{ji} = g_{ki} = 1$. Assume that $i' \in N(\mathcal{K}_j) \cap N(\mathcal{K}_k)$, with $i \neq i'$. If i and i' were linked (i.e., $\bar{g}_{ii'} = 1$), then j (or k) could delete the link with i and initiate a link with i' without loss. Thus, we should have $\bar{g}_{ii'} = 0$. As g is minimally connected, either a path connecting i' and j and not containing k exists, or there exists a path connecting i' and k and not containing j. In the first case k can delete the link with i and initiate a link with i', and in the second j can delete the link with i and initiate a link with i'. In both cases this is without loss for the player who changes strategy, therefore contradicting that g is a strict Nash \mathcal{K} -network. \blacksquare

The examples in Figure 3 illustrate the characterization and its corollaries and convey the logic of strict Nash \mathcal{K} -networks. Of course, the characterizing condition of respecting hierarchical priority holds in all cases, as the reader may check. Examples (a) and (b) represent societal covers with a non-empty hub where an all-encompassing center-sponsored star is *one* of the possible architectures of strict Nash \mathcal{K} -networks: (d) and (c) represent other strict Nash \mathcal{K} -networks for the same covers. In examples (a), (b) and (d) a single center-sponsored star covers (partially) each society, while two center-sponsored stars cover society A_3 in (c) and society A_5 in (e), and in both cases

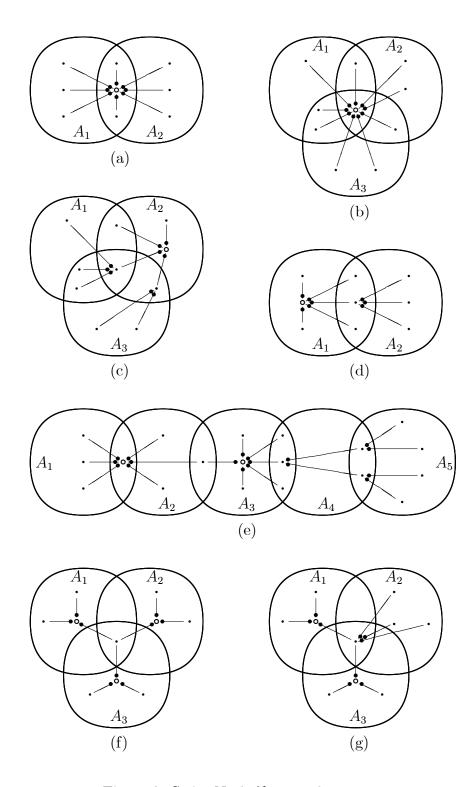


Figure 3: Strict Nash K-networks.

no other link exists between pairs of individuals. In all cases, a maximal node exists (represented by a white circle "o"), but there may be more than one, as in examples (e), (f) and (g), which illustrate Proposition 6: stars connecting "hand in hand" by means of a "free rider" node are possible when a single player belongs to both societies. We reach in fact the following conclusion: when no pair of societies in the societal cover \mathcal{K} share a single player, a strict Nash \mathcal{K} -network is an oriented diverging tree, as is proved by the following

Corollary 3 Let K be a societal cover such that for all $A, B \in K$, $A \cap B$ is empty or contains at least two nodes, then a strict Nash K-network necessarily forms an oriented diverging tree.

Proof. There is a unique path connecting any maximal node with each node. Assume that there are two maximal nodes i_0 and i_1 . Then, there is a path connecting i_0 and i_1 , but then there must be three nodes on that path i, j and k such that $g_{ij} = g_{kj} = 1$. Now if the intersection of any two societies in \mathcal{K} is either empty or contains *more* than a single player, this is impossible according to Proposition 6. Therefore, there can be only one maximal node connected with any other node by a unique path and consequently g is an oriented diverging tree.

But note that, as examples (e), (f) and (g) in Figure 3 show, when there are two or more societies to which a *single* player belongs, several maximal nodes may exist. In such cases, an oriented diverging tree does not result. In this case, two or more "grafted" oriented diverging trees may emerge, so that any node is connected by an oriented diverging tree with at least one but possibly more maximal nodes. In this case several hierarchies overlap consistently.

Finally, in the spirit of the "community detection" problem (see, e.g., Jackson, 2009), we address a reciprocal issue to that considered so far. Given a network g, can it be interpreted as a strict Nash \mathcal{K} -network for any particular societal cover \mathcal{K} ? It is easy to see that this question admits many answers: in general, an oriented diverging tree (or several grafted ones) can be seen as a strict Nash \mathcal{K} -network for different societal covers. Restricting attention to oriented diverging trees, the following associated societal covers are worth noting. Let g be an oriented diverging tree rooted at i_0 . The generational cover, consisting of a minimal number of societies, each consisting of all nodes at the same distance from the root that are not terminal along with their "offspring"; the family cover where each node forms a society with its offspring; and the trivial binary cover where any two directly linked nodes form a society. For all three societal covers, the oriented diverging tree g is a strict Nash \mathcal{K} -network and it is the only one with maximal node i_0 for the latter two.

4 Dynamics

We now study Bala and Goyal's (2000a) dynamic model in this setting. Namely, starting from any initial K-network g each player i with some positive probability responds

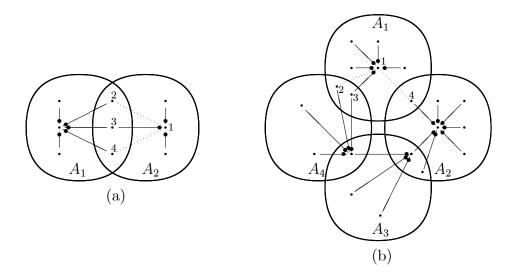


Figure 4: Dynamic deadlock towards a strict Nash K-network.

with a \mathcal{K} -admissible best response¹⁶ to g_{-i} or randomizes across them when there are more than one, otherwise player i exhibits inertia, i.e., keeps her links unchanged. In this way, a Markov chain on the state space of all \mathcal{K} -networks is defined. Bala and Goyal's prove that in their setting, i.e., for $\mathcal{K} = \{N\}$, starting from any network, the dynamic process converges to a strict Nash network (i.e., the empty network or a center-sponsored star) with probability 1. In other words, the only absorbing sets are singletons consisting of strict Nash networks. The following example shows that this $is\ not$ the case for the same dynamic model in the context of \mathcal{K} -networks.

Example 2 In Figure 4 (a) players in A_1 have no best response but keep their strategies, while player 1 is indifferent between initiating a link with 2 or 3 or 4. Consequently the best response dynamic process would oscillate forever within this three-element absorbing set. Similarly, in Figure 4 (b) all players in A_2 , A_3 and A_4 keep their strategies, while player 1 is indifferent between supporting a link with 2 or 3 or 4, and consequently best response dynamics would oscillate forever among these three networks forming a three-element absorbing set. Note that in both examples the \mathcal{K} -networks among which the best response dynamics oscillate are minimally connected and yield the same payoffs to all players.

The example shows an interesting difference with respect to Bala and Goyal's setting. The same logic that in their setting leads to the absorbing strict Nash networks, in ours may also lead to the formation of interconnected center-sponsored stars, whose centers are fixed (i.e., immune to miscoordination), which are incompatible in any strict Nash \mathcal{K} -network. In this case, the converging process is blocked. Thus, in general, the dynamic process leads to an absorbing set, that is, a minimal set of \mathcal{K} -networks closed

 $[\]overline{\Pi_i(g_{-i}, g_i')}$, is a best response to g_{-i} .

under best response dynamics. This raises the question about what these absorbing sets consist of. We call quasi-strict Nash K-networks to those that belong to any of these absorbing sets and explore their structure. For this purpose a clear understanding of the possibility of miscoordination in a minimally connected K-network is needed.

Definition 9 A minimally connected K-network is "miscoordination-proof" if it cannot be disconnected by best response dynamics.

Observe that both examples in Figure 4 consist of miscoordination-proof \mathcal{K} -networks. In a minimally connected \mathcal{K} -network miscoordination between two nodes can only occur if their reaches intersect and both support a link with the same node k. This occurs when both have best responses that consist of breaking these links with k and replacing them by initiating new ones with nodes connected by some path with the other that separately would not disconnect the network, but when they are simultaneous this would disconnect it. Moreover, even if two nodes do not support a link with the same node k, it may be the case that one or both have best responses consisting of linking the same node and we are back to the situation just discussed. The following lemma specifies in detail the conditions under which none of these situations may occur in a minimally connected \mathcal{K} -network, which is therefore miscoordination-proof.

Lemma 2 A minimally connected K-network g is miscoordination-proof if and only if for every society $A \in K$, $g \mid_A$ consists of center-sponsored stars and/or isolated nodes and for any two nodes i, j either (i) $N(K_i) \cap N(K_j) = \emptyset$, or (ii) for all k, either (ii-1) $g_{ik} = g_{jk} = 1$ and

$$N(\mathcal{K}_i) \cap N(j; g - jk) = \varnothing \quad or \quad N(\mathcal{K}_j) \cap N(i; g - ik) = \varnothing,$$
 (4)

or (ii-2) $g_{ik} = 1$ and $g_{jk} = 0$ and for all k' s.t. $g_{jk'} = 1$ and it is a best response for j to delete link jk' and initiate jk, condition (4) holds for the resulting network, or (ii-3) $g_{ik} = g_{jk} = 0$ and for all k' s.t. $g_{ik'} = 1$ and it is a best response for i to delete ik' and initiate ik and all k'' s.t. $g_{jk''} = 1$ and it is a best response for j to delete jk'' and initiate jk, condition (4) holds for the network that results from both best responses.

Proof. Necessity (\Rightarrow): Let g be a minimally connected \mathcal{K} -network. First note that if for some society $A \in \mathcal{K}$, $g \mid_A$ does not consist of center-sponsored stars and/or isolated nodes miscoordination between nodes of that society can surely disconnect the network¹⁷. Assume then that this condition holds. If for some pair of nodes i, j whose reaches intersect any of the other three conditions fails to hold, it is easy to check that it is possible to disconnect the network by miscoordination in one best response step in case (ii-1) and in two steps in cases (ii-2) or (ii-3).

Sufficiency (\Leftarrow) : Let g be a minimally connected \mathcal{K} -network for which all conditions in the lemma hold. Then it is easy to check that no sequence of best response steps can disconnect the network. \blacksquare

¹⁷The proof is similar to that for Theorem 4.1 in Bala and Goyal (2000a).

We have then the following result that proves that quasi-strict Nash K-networks are just miscoordination-proof minimally connected K-networks.

Proposition 7 Under a societal cover K the absorbing sets under best response dynamics consist of miscoordination-proof minimally connected K-networks, and any miscoordination-proof minimally connected K-network belongs to an absorbing set.

Proof. First note that starting from any miscoordination-proof minimally connected \mathcal{K} -network best response dynamics cannot disconnect the network and can only yield another network satisfying the same conditions, i.e., another miscoordination-proof minimally connected K-network where the number of links supported by each node remains unchanged. Therefore, any miscoordination-proof minimally connected \mathcal{K} network along with all others that can be reached from it by best response dynamics form an absorbing set. It remains to be shown that there are no other absorbing sets. Starting from any K-network, best response dynamics lead with probability 1 to a minimally connected K-network g such that for every society $A \in \mathcal{K}$, $g \mid_A$ consists of center-sponsored stars and/or isolated nodes¹⁸. If some of the conditions of Lemma 2 does not hold, miscoordination is possible (in one or two steps) in a way that the network is disconnected (i and j deleting simultaneously their links with k) and a cycle appears. In a new best response step, one of the involved nodes, say i, links k again and the other breaks the cycle. In this way, a new minimally connected network results where the i-centered star has a new spoke and one of the possibilities of miscoordination has disappeared. A sequence of best response steps that leads to a miscoordinationproof minimally connected \mathcal{K} -network is therefore proved to exist. \blacksquare

As a corollary, we have the following result that shows that when an absorbing set is reached, in spite of the possibly perpetual oscillation, stability in terms of payoffs is reached given that all networks in the same absorbing set *yield the same payoffs to all players*.

Corollary 4 For any two quasi-strict Nash K-networks g, g' that belong to the same absorbing set and all $i \in N$, $\Pi_i(g) = \Pi_i(g')$.

Proof. Let Q be an absorbing set and $g \in Q$. As g is a miscoordination-proof minimally connected K-network, the number of links supported by each node is invariant under best response dynamics. Therefore, the payoffs must remain unchanged for all players within Q.

In summary, quasi-strict Nash K-networks, i.e., the constituent of the absorbing sets of best response dynamics, are not very different from strict Nash K-networks. They are minimally connected K-networks consisting of interconnected stars, one or several disjoint ones in each society, where nodes support links with all nodes within their hierarchical reach with the only possible exception of some nodes that support

 $^{^{18}}$ The proof is similar to that for Theorem 4.1 in Bala and Goyal (2000a), merely respecting K-feasibilty.

links with only one node among several between which best response dynamics can oscillate. Thus, the architecture of quasi-strict Nash \mathcal{K} -networks is that of grafted trees, something that was only possible for strict Nash networks when a unique individual belonged to two different societies.

5 Decay

We now consider the case where the value that a player i receives from another player j is sensitive to the geodesic distance between them, i.e., the length of the path with the minimum number of links that connects them. Namely, if d(i, j; g) denotes this distance in a network g, we assume that this value is discounted by $\delta^{d(i,j;g)}$, where $0 < \delta \le 1$. Therefore, assuming homogeneity and, without loss of generality, that v = 1, the payoff of player i in network g is

$$\Pi_i(g) = \sum_{j \in N(i;g)} \delta^{d(i,j;g)} - c\mu_i^d(g). \tag{5}$$

If $\delta = 1$, we have the linear case we have dealt with so far. In the sequel, we assume there is actual decay i.e., $\delta < 1$. We now have to deal with two parameters: c and δ .

5.1 Stability and decay

When a societal cover K constrains link formation, a natural extension of Bala and Goyal's notion of "tw-complete" network is the following: a tw-complete K-network is a network g where $\bar{g}_{ij} = 1$ for all i, j s.t. $K_i \cap K_j \neq \emptyset$ (every node is at distance 1 from every other K-reachable node) and $g_{ij} = 1 \Rightarrow g_{ji} = 0$ (no link is twice paid). In Bala and Goyal's setting, a variety of all-encompassing mixed stars become stable in the presence of decay. That is to say, stars that (i) connect all other nodes to a center, and (ii) each link is either paid by the center or by the spoke node, but never by both. An all-encompassing star is periphery-sponsored if all the links are supported by the spoke nodes. Such all-encompassing stars are feasible in our setting only when the societal hub is not empty. Then, given that under a societal cover the feasible responses of any node form a subset of her feasible responses without constraints, the following extension of Bala and Goyal's (2000a) Proposition 5.3 is straightforward:

Proposition 8 Let the payoffs be given by (5) and K the societal cover that constrains link formation, then:

- (i) If $0 < c < \delta \delta^2$, then tw-complete K-networks are the only strict Nash K-networks. (ii) If $\delta - \delta^2 < c < \delta$ and $hub(K) \neq \emptyset$, then every all-encompassing star centered at any point in the hub is a strict Nash K-network.
- (iii) If $\delta < c < \delta + (n-2)\delta^2$ and $hub(\mathcal{K}) \neq \emptyset$, then any periphery-sponsored all-encompassing star centered at any point in the hub, but none of the other stars, is a strict Nash \mathcal{K} -network.

(iv) If $\delta < c$, then the empty network is strict Nash.

When a societal cover constrains link formation, the societal hub may be empty and (ii)-(iii) parts of Proposition 8 do not apply in that case, but, as we have seen, even when it is not empty, hierarchical architectures different from the all-encompassing star may be strict Nash when there is no decay. Bala and Goyal (2000a) focus on the stability of different types of mixed stars under different ranges of cost and decay. The situation is here more complicated, given the variety of strict Nash architectures even for relatively simple societal covers. In our setting, a rather general analogous of the mixed stars whose stability Bala and Goyal deal with are \mathcal{K} -compatible "mixed" (i.e., not necessarily oriented) trees or grafted trees that result from a strict Nash \mathcal{K} -network without decay (i.e., an oriented diverging tree or several grafted diverging trees satisfying the hierarchical characterizing condition of Theorem 1) by just allowing each link to be paid by any one of the two nodes it connects (but never by both). We have thus the following

Definition 10 A "mixed hierarchical" K-network is a K-network g s.t. (i) for all $i, j \in N$, $g_{ij} = 1$ implies $g_{ji} = 0$, and (ii) there exists a hierarchical K-network h s.t. $\bar{h} = \bar{g}$.

We say that a mixed hierarchical K-network is periphery-sponsored if every node that has only one node at distance 1 supports the link that connects it. The question thus arises about the stability and efficiency of such architectures in the presence of decay and the comparison with all-encompassing stars when these are feasible. Some simple examples allow us to illustrate what seem to be the basic patterns. We first consider the case when the societal hub is not empty. In order to make the comparison with Bala and Goyal (2000a) easier, we discuss the effect of decay for the same different intervals of values relating c and δ . In view of Proposition 8-(i), we can start with c and δ in the interval of case (ii). The following notation is used: for each $A \in K$, A denotes the set of nodes in A that do not belong to any other society, i.e., $A := A \setminus \bigcup_{A' \in K \setminus \{A\}} A'$, and the cardinalities of A and A by a := #A and a := #A.

1. Interval: $\delta - \delta^2 < c < \delta$. In this case it is worth initiating a link whose marginal contribution is that of connecting an isolated node $(c < \delta)$ and it is not worth supporting a link whose marginal contribution is that of shortening from 2 to 1 the distance to just one node $(\delta - \delta^2 < c)$, but this may be worthwhile if that node is sufficiently well connected. As a simple term of reference, let us consider a societal cover consisting of two intersecting societies $\mathcal{K} = \{A, B\}$. In this case, an oriented diverging tree rooted at, say, $i_0 \in \dot{A}$, where $i_1 \in A \cap B$ supports links with all nodes in \dot{B} , is strict Nash if there is no decay, but may fail to be stable if $\delta < 1$. In fact, if $c \leq \delta + (\dot{b} - 1)\delta^2 - \dot{b}\delta^3$ this network is not strict Nash because any individual in A other than i_0 would be better off (or at least as well) by initiating a link with i_1 . Note that this number is surely greater than $\delta - \delta^2$, but it is within the interval considered (i.e., $\delta + (\dot{b} - 1)\delta^2 - \dot{b}\delta^3 < \delta$) only if $\delta > (\dot{b} - 1)/\dot{b}$. That is, for sufficiently large \dot{b} ,

unless there is almost no decay, this network is *not* strict Nash for any value of c in the whole interval. If $\delta > (\dot{b} - 1)/\dot{b}$, this number divides the interval considered into two subintervals: this network is strict Nash only for costs above this number. Now consider the mixed hierarchical variations of this \mathcal{K} -network. If $\dot{b} \geq a - 3$ and at least one node $j \neq i_1$ in A supports her link with i_0 , this \mathcal{K} -network is not strict Nash since j has a best response consisting of deleting the link with i_0 and replacing it by a link with i_1 , and this does not depend on the value of c. If $\dot{b} < a - 3$ or there is no node in A different from i_1 that supports her link with i_0 , the discussion and conclusions are entirely similar as those for the diverging tree rooted at i_0 .

Similar conclusions are obtained for the oriented diverging tree (and all its mixed hierarchical variations) where two or more nodes in the intersection $A \cap B$ instead of only one support links with the reminder nodes in \dot{B} .

Now consider the case where $A \cap B$ contains a unique node i_0 . As we have seen, two center-sponsored stars "hand-in-hand", one centered at A, the other at B, connecting all nodes in A and B respectively and i_0 in particular, is a strict Nash K-network in this case. Assume $b \geq a$. The situation is again similar: this network is stable only if $c > \delta + (\dot{b} - 2)\delta^3 - (\dot{b} - 1)\delta^4$. Note that this number is greater than $\delta - \delta^2$, but it is within the interval considered (i.e., $\delta + (\dot{b} - 2)\delta^3 - (\dot{b} - 1)\delta^4 < \delta$) only if $\delta > (b-2)/(b-1)$. Therefore, again as \dot{b} grows this network is not strict Nash in the whole interval, unless there is almost no decay. If $\delta > (b-2)/(b-1)$, this number divides the interval considered into two subintervals: this network is strict Nash only for costs above this number. Now consider the mixed hierarchical variations of this K-network. If at least one node j in A(B) supports her link with the center of the star in A(B) and $(\dot{a}-3)-(\dot{a}+\dot{b}-4)\delta+(\dot{b}-1)\delta^2\leq 0$ $((\dot{b}-3)-(\dot{a}+\dot{b}-4)\delta+(\dot{a}-1)\delta^2\leq 0)$, this K-network is not strict Nash since j has a best response consisting of deleting her link with the center of the star in A(B) and replacing it by a link with i_0 , and this does not depend on the value of c. Otherwise, the discussion and conclusions are entirely similar as those for the case of two center-sponsored stars "hand-in-hand".

Thus, roughly speaking, for a social configuration as the one described, and c and δ within the interval considered, all-encompassing stars centered in the societal hub are efficient and stable, while non-efficient architectures as mixed hierarchical variations of strict Nash (without decay) \mathcal{K} -networks can be stable only for certain combinations involving a relatively small number of nodes in some society outside the societal hub, a relatively low decay and a relatively high cost.

Let us consider now the case where c and δ are in the interval of case (iii).

2. Interval: $\delta < c < \delta + (n-2)\delta^2$. In this case, it is not worth connecting an isolated node $(\delta < c)$, but it would surely be worth for an isolated node to support a link with the center of a star that connects all other nodes $(c < \delta + (n-2)\delta^2)$. In this case, given that $\delta < c$, only periphery-sponsored mixed hierarchical \mathcal{K} -networks can be stable. Let us consider then a tree as the first one we have considered in the first interval, but where the terminal nodes support the links connecting them, while the link between nodes i_0 and i_1 could be supported by either of them. Given that $\delta < c$,

restrictions on c are needed in order to ensure that no node finds profitable to delete the link she is supporting in the tree. If the link between nodes i_0 and i_1 is supported by i_1 , it is necessary $c < \min\{\delta + (a-2)\delta^2, \delta + \dot{b}\delta^2 + (a-2)\delta^3\}$; and if the link between nodes i_0 and i_1 is supported by i_0 , it is necessary $c < \min\{\delta + \dot{b}\delta^2, \delta + (a-2)\delta^2 + \dot{b}\delta^3\}$. Furthermore in both cases, the same reason as for the interval $\delta - \delta^2 < c < \delta$ requires $\dot{b} < a-3$ and $c > \delta + (\dot{b}-1)\delta^2 - \dot{b}\delta^3$ for these networks to be stable, which may still be actually a constraint as $\delta + (\dot{b}-1)\delta^2 - \dot{b}\delta^3$ is in the interval now considered if $\delta < (\dot{b}-1)/\dot{b}$. We again see the same pattern: only for certain combinations involving a relatively small number of nodes in either society outside the societal hub, a relatively low decay and a relatively high cost the periphery-sponsored mixed hierarchical variants of this architecture remain stable, while periphery-sponsored stars centered at any point of the societal hub remain stable in the whole interval.

This range of cost-decay values has other implications. For instance, for the same cover, a tree where all nodes in A are at distance 1 to $i_0 \in A$ and two (or more) nodes in the intersection $A \cap B$ are linked by the nodes in B is not strict Nash whatever the cost in this range be. A strict Nash may only result if all nodes in B support links with only one and the same node in $A \cap B$. We here see another pattern: a tendency to concentrate inter-societal connections in the presence of decay.

Now consider the case where $A \cap B$ contains a unique node i_0 . And consider two mixed stars "hand-in-hand", one centered at $i_1 \in \dot{A}$, the other at $i_2 \in \dot{B}$. Assume $b \geq a$. Given that $\delta < c$, only periphery-sponsored mixed hierarchical \mathcal{K} -networks can be stable, therefore the spoke nodes in $\dot{A} \cup \dot{B}$ support the links connecting them, while the link between nodes i_1 and i_0 could be supported by either of them, the same for the link between nodes i_2 and i_0 . Given that $\delta < c$, restrictions on c are needed in order to ensure that no player finds profitable to delete the link that she is supporting in the grafted tree. If i_0 supports both links with i_1 and i_2 , it is necessary $c < \delta + (\dot{a} - 1) \delta^2$; if i_1 and i_2 both support their links with i_0 , $c < \delta + \delta^2 + (\dot{a} - 1) \delta^3$; if i_0 supports the link with i_1 and i_2 supports the link with i_2 and i_1 supports the link with i_0 , $c < \min\{\delta + (\dot{b} - 1)\delta^2, \delta + \delta^2 + (\dot{b} - 1)\delta^3\}$. Furthermore, in the four cases, the same reason as for the interval $\delta - \delta^2 < c < \delta$ require $(\dot{a} - 3) - (\dot{a} + \dot{b} - 4)\delta + (\dot{b} - 1)\delta^2 > 0$ and $c > \delta + (\dot{b} - 2)\delta^3 - (\dot{b} - 1)\delta^4$ for these networks to be stable.

It would be long and tedious to discuss it in detail, but the case of a connected societal cover consisting of three societies with a non-empty societal hub can be discussed case by case to obtain similar conclusions. In fact, whatever the number of societies, when the societal hub is not empty we have similar conclusions: (i) the all-encompassing center-sponsored star is the most robust architecture among the strict Nash \mathcal{K} -networks without decay as it remains stable in the first interval $(\delta - \delta^2 < c < \delta)$, while other architectures remain stable only for a relatively low decay, a relatively high cost and a relatively small number of nodes in every society involved in the "graft" in the case of grafted trees, or relatively small number of nodes in at least one society outside the societal hub in the case of trees; (ii) in the second interval $(\delta < c < \delta + (n-2)\delta^2)$, as spoke

nodes must pay the links that connect them to the network, neither all-encompassing center-sponsored stars nor any strict Nash network without decay is stable with decay, but some mixed trees and grafted trees may remain stable subject to similar limitations. In contrast, all-encompassing periphery-sponsored stars centered at any point of the societal hub remain stable in this interval.

In sum, it is not a heavy societal hub that compels the society to organize itself as an all-encompassing star when this is feasible, but a heavy hub-periphery. More precisely, we have the following conclusion from the preceding discussion¹⁹:

Proposition 9 Let the payoffs be given by (5) and K be a societal cover such that $hub(K) \neq \emptyset$, then:

(i) If $\delta - \delta^2 < c < \delta$ and the number of nodes in \dot{A} is sufficiently large for all $A \in \mathcal{K}$, the only strict Nash \mathcal{K} -networks without decay that remain strict Nash with decay are the all-encompassing center-sponsored stars whose center is within the societal hub.

(ii) If $\delta < c < \delta + (n-2)\delta^2$ and the number of nodes in \dot{A} is sufficiently large for all $A \in \mathcal{K}$, the only mixed hierarchical \mathcal{K} -networks that are strict Nash with decay are the all-encompassing periphery-sponsored stars whose center is within the societal hub.

These results and the preceding discussion may make the reader think of Feri's (2007) results about stochastic stable networks. In the next subsection, we explicitly deal with Feri's dynamics and use these conclusions.

Let us now consider the case where the societal hub is empty. The simplest case of a connected cover with an empty hub is a three-society cover $\mathcal{K} = \{A, B, C\}$ with $A \cap B \cap C = \emptyset$. In this case, reasoning in similar terms to the case of a two-society cover, it can be concluded that *none* of those \mathcal{K} -networks which are strict Nash without decay (nor any mixed hierarchical variant of them) remains stable in the presence of decay if the number of nodes that belong to each one, but only one, of the three societies is big enough²⁰. Nevertheless, mixed stars, interlinked in a variety of ways, maybe redundant, sharing a number of spoke nodes, appear as strict Nash for the different ranges of the parameters. Consider the case where $A \cap B \neq \emptyset$, $B \cap C \neq \emptyset$ and $A \cap C = \emptyset$. Let m be the cardinality of the smallest set of A and A. Then if $A \cap B = \emptyset$ and $A \cap C = \emptyset$ and $A \cap C = \emptyset$ are the network where a node $A \cap B = \emptyset$ is linked with all nodes in $A \cap B = \emptyset$ and $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ and $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ and $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is linked with all nodes in $A \cap C = \emptyset$ is a strict Nash network (note that as the upper

¹⁹Consider the following example: let \mathcal{K} be a two-society cover $\mathcal{K} = \{A, B\}$ and $A \cap B \neq \emptyset$, and let g be the strict Nash \mathcal{K} -network without decay where some $i \in \dot{A}$ supports links with all other nodes in A, and a node in $A \cap B$ supports links with all other nodes in \dot{B} . If \dot{B} is small enough, say 1, this network remains strict Nash in the interval $\delta - \delta^3 < c < \delta$.

²⁰Otherwise, in some particular cases a strict Nash \mathcal{K} -network without decay or a mixed tree variant remains stable with decay. For instance, if $\#(A \cap B) = \#(B \cap C) = 1$, and $\dot{B} = \emptyset$ then the oriented \mathcal{K} -tree rooted at the unique point in one intersection forms a strict Nash \mathcal{K} -network in the first interval (in the second interval spoke nodes in $\dot{A} \cup \dot{C}$ should pay their links).

²¹Note this is a "quasi linked star" (qls) in Feri's (2007) terms.

bound of this interval can be in the second interval, i.e. if $\delta < \delta + (m-1)\delta^2 - m\delta^3$, in this case, if c is in this second interval spoke nodes should pay their links). Now if $\delta + (m-1)\delta^2 - m\delta^3 < c < \delta + m\delta^2 - \delta^3 - m\delta^4$, then the link between i_1 and i_2 should be eliminated, and doing so the remaining \mathcal{K} -network could be strict Nash where two stars share their spoke nodes in B^{22} .

In summary, in the presence of decay, when the hub is not empty we have: (i) in the first interval, all-encompassing center-sponsored stars are the most robust strict Nash among those without decay, but also all mixed all-encompassing stars centered in the hub become strict Nash; (ii) in the second interval, all-encompassing periphery-sponsored stars centered in the hub are the only stars which are strict Nash. These patterns corroborate, in a more complex context, Goyal's diagnosis: "Decay introduces incentives for players to reduce the lengths of paths between themselves. This means that the star network is even more attractive than before. However, the introduction of decay also means that cycles can be sustained in equilibrium." (Goyal, 2007, p. 172). Moreover, even when the hub is empty, stars, which are no longer all-encompassing under institutional constraints, interlinked in possibly redundant ways seem a persisting feature in strict Nash networks under decay, while none of the strict Nash \mathcal{K} -networks without decay is robust in its presence if for all the societies the number of nodes that belong to that society and only that one is large enough.

5.2 Stochastic stability and decay

In Feri (2007), a different dynamic model consisting of unperturbed dynamic plus errors or mutations is considered²³. Namely, one node is randomly chosen at every period to revise her strategy by choosing a best response (or one of them at random when there are more than one). This is the *unperturbed dynamic*, but at every period the chosen node with a probability $\varepsilon > 0$ makes a mistake consisting of choosing her strategy randomly. Thus, an evolutionary process results that is an aperiodic and irreducible Markov chain, which consequently has a unique invariant probability distribution μ_{ε} . Feri then studies the stochastically stable networks, i.e., those g for which $\hat{\mu}(g) > 0$, where $\hat{\mu} = \lim_{\varepsilon \to 0} \mu_{\varepsilon}$. This can be done by applying the result according to which the stochastically stable states of such an evolutionary process are characterized as those that belong to an absorbing set of a recurrent set of the evolutionary process (Proposition 7.7 in Samuelson (1997)). A recurrent set is a set R of absorbing sets of the unperturbed dynamic such that (i) for any state within the recurrent set, a mutation followed by unperturbed dynamics cannot end up in an absorbing set not belonging to R, and (ii) it is possible to reach any absorbing set in R from any other likewise in R by means of a sequence of one-step mutations, i.e., steps consisting of one

²²This is a "quasi linked star 2" (qls2) in Feri's (2007) terms.

²³Other papers dealing with dynamic models in the presence of decay are Watts (2001), Jackson and Watts (2002), Goyal and Vega-Redondo (2005), Hojman and Szeidl (2008) and Feri and Meléndez (2009).

mutation followed by unperturbed dynamics.

As is by now clear, when a societal cover \mathcal{K} constrains link-formation, things become rather complicated. Nevertheless, part of Theorem 1 in Feri (2007) can be easily extended. Denote by $\hat{G}(\mathcal{K})$ the set of stochastically stable \mathcal{K} -networks under Feri's dynamic, by $G^c(\mathcal{K})$ the set of all tw-complete \mathcal{K} -networks, and by $G^s(\mathcal{K})$ ($G^{ps}(\mathcal{K})$) the set of all-encompassing (periphery-sponsored) stars whose center belongs to $hub(\mathcal{K})$ whenever it is not empty. Then we have

Theorem 2 Let the payoffs be given by (5) and K a societal cover, and let $0 < \delta < 1$: (i) If $c < \delta - \delta^2$, then $\hat{G}(K) = G^c(K)$. (ii) If $\delta - \delta^2 < c < \delta$ and $hub(K) \neq \emptyset$, then $\hat{G}(K) \supseteq G^s(K)$; moreover, if $\delta - \delta^3 < c < \delta$, there exists $n(c, \delta)$ such that if $\dot{a} > n(c, \delta)$ for all $A \in K$, then $\hat{G}(K) = G^s(K)$. (iii) If $\delta < c$ and $hub(K) \neq \emptyset$, there exists $n'(c, \delta)$ such that if $\dot{a} > n'(c, \delta)$ for all $A \in K$, then $\hat{G}(K) = G^{ps}(K) \cup \{g^e\}$.

Proof. (i) The proof is an easy adaptation of the proof of part (i) of Feri's Theorem 1 that we omit.

(ii) The proof of the first part results from an easy adaptation of Feri's Lemmas 1 and 2. That is to say, within this interval of cost, from any \mathcal{K} -network, an error followed by unperturbed dynamic is enough to reach an all-encompassing centersponsored star whose center belongs to the hub (Lemma 1 in Feri (2007)); and for any two all-encompassing stars whose centers are in the hub a sequence of one-step mutations leads from one to the other (Lemma 2 in Feri (2007)). Then, using Proposition 7.7 in Samuelson (1997), one concludes that there is only one recurrent set, which contains $G^s(\mathcal{K})$. As to the second part, an overwhelmingly cumbersome detailed discussion that we omit here shows that when the number of nodes that belong to each society (and only to that society) is sufficiently large, starting at an all-encompassing star, a mutation followed by unperturbed dynamic ends up at another all-encompassing star (Lemma 3 in Feri (2007)).

(iii) We omit the details that again consist of an adaptation of Lemmas 4, 5 and 6 in Feri (2007). Within this interval of cost, from any K-network, an error followed by unperturbed dynamic is enough to reach the empty network (Lemma 4 in Feri (2007)); and if the number of nodes that belong to each society (and only to that society) is sufficiently large, starting at the empty network, a mutation followed by unperturbed dynamic ends up at the empty network or a periphery-sponsored all-encompassing star (Lemma 5 in Feri (2007)). There is then only one recurrent set and it contains the empty network. Finally when the number of nodes that belong to each society (and only to that society) is sufficiently large, starting at a periphery-sponsored all-encompassing star, a mutation followed by unperturbed dynamic ends up at another periphery-sponsored all-encompassing star or the empty network (Lemma 6 in Feri (2007)). ■

A more detailed extension of Feri's Theorem 1 should be possible, but a general extension does not seem feasible, given the variety of societal covers. In fact, there

should be a precise extension for each particular cover. A difficulty now arises that, even for very simple societal covers, there are several possible architectures for a strict Nash \mathcal{K} -network (with and without decay), moreover, quasi strict Nash \mathcal{K} -networks should also be taken into account when dealing with recurrent sets. Thus, the complexity of extending Feri's Lemmas 3 and 6 becomes explosive. To make things more complicated, as we have seen in the preceding subsection, different architectures of strict or quasi strict Nash \mathcal{K} -networks are stable within different ranges of the parameters c and δ , which makes cumbersome a detailed formulation about which ones are stochastically stable within each subinterval.

Nevertheless, in order to gain some insight on how things go in this complex setting, we constrain our attention to a very simple example of a two-society connected cover and show how this extension can be done and study the impact of the cover in stochastic stability.

Example 3 Let $N = \{1, 2, 3, 4, 5, 6, 7\}$ and $\mathcal{K} = \{A, B\}$, where $A = \{1, 2, 3, 4, 5, 6\}$ and $B = \{3, 4, 5, 6, 7\}$, so that $hub(\mathcal{K}) = A \cap B = \{3, 4, 5, 6\}$. Up to isomorphism, there are four architectures for strict Nash \mathcal{K} -networks (without decay):

- -SN1: all-encompassing center-sponsored stars whose center is within $A \cap B$;
- -SN2: oriented diverging trees rooted at A where a node in $A \cap B$ supports a link with node 7;
- -SN3: oriented diverging trees rooted at 7 where a node in $A \cap B$ supports links with nodes 1 and 2;
- -SN4: oriented diverging trees rooted at 7 where one node in $A \cap B$ supports a link with node 1 and another node in $A \cap B$ supports a link with node 2.

There are also two quasi strict Nash architectures:

- -QSN5: node 7 supports links with all other nodes in B and a node in A supports links with the other in A and with one in $A \cap B$ (in best response dynamics the latter would oscillate between the four nodes in $A \cap B$);
- -QSN6: a node in A supports links with all other nodes in A and node 7 supports a link with a node in $A \cap B$ (in best response dynamics the latter would oscillate between the four nodes in $A \cap B$).

Let us consider first the interval $\delta - \delta^2 < c < \delta$. In view of the discussion in the preceding subsection, we can expect different subintervals within which each of these architectures and/or their mixed variants remain strict or quasi strict Nash. Let us denote by M1 and M2 the architectures consisting of all mixed hierarchical variants of SN1 and SN2; by M3 the variants of SN3 where the links connecting 7 with those in $A \cap B$ not connected with nodes 1 and 2 are supported by 7; and by M4 and M5 the variants of SN4 and QSN5 where the links connecting 7 are supported by any one of the adjacent nodes, while the other links are supported as in SN4 and QSN5 (otherwise it would not even be Nash)²⁴. Note that the mixed hierarchical variants of QSN6 are M2.

 $^{^{24}}$ In all cases the excluded variants are not stable.

A similar discussion to that made in the preceding subsection leads to the following nested intervals where each of these architectures remains stable:

- -M1 remains strict Nash in the whole interval I_{M1} , where $\delta \delta^2 < c < \delta$;
- -M2 remains strict Nash in the interval I_{M2} , where $\delta \delta^3 < c < \delta$;
- -M3 remains strict Nash in the interval I_{M3} , where $\delta + \delta^2 2\delta^3 < c < \delta$ (note that this interval is not empty only for $\delta > 1/2$);
- -M4 remains strict Nash in the interval I_{M4} , where $\delta + \delta^2 \delta^3 \delta^4 < c < \delta$ (not empty only for $\delta > 0.618$);
- -M5 remains quasi strict Nash in the interval I_{M5} , where $\delta + \delta^2 \delta^3 3\delta^4 < c < \delta$ (not empty only for $\delta > 0.7676$).

Thus, we have that: (i) only for δ sufficiently high (always greater than 1/2) do the architectures M3, M4, and M5, remain stable or quasi stable in a non-empty subinterval; (ii) $I_{M1} \supseteq I_{M2} \supseteq I_{M3} \supseteq I_{M4} \supseteq I_{M5}$, so that the pattern is clear: as the cost goes down, the set of stable architectures shrinks and only all-encompassing mixed stars (i.e., M1) remain strict Nash below $\delta - \delta^3$.

As to stochastic stability within the interval considered, things become much more complicated. It can be seen²⁵ that the following extensions of Feri's lemmas 1 and 2 hold: (i) a transition from any \mathcal{K} -network to a star in M1 can be induced by a mutation followed by unperturbed dynamic; (ii) from any network in any of these five sets, any other can be reached in any other of these sets by a sequence of one-step mutations. Much more cumbersome as the reader may guess is the extension of Lemma 3 of Feri (2007). This requires all possible mutations in all of these architectures followed by unperturbed dynamic to be studied. A detailed discussion of cases leads to an upper bound for the cost in this interval in order to ensure that in the worst case unperturbed dynamic does not get stuck on its way towards some of these architectures. This upper bound is

$$c < \delta + 2\delta^2 - 3\delta^3.$$

Note that this number is between the lower bound of I_{M4} and that of I_{M5} , which leaves outside M5. In sum, we have the following conclusions. If $\hat{G}(\mathcal{K})$ denotes the set of networks within the recurrent set then we have that

- -in the interval $\delta \delta^2 < c < \delta \delta^3$: $M1 \subseteq \hat{G}(\mathcal{K})$;
- -in the interval $\delta \delta^3 < c < \delta + \delta^2 2\delta^3$: $\hat{G}(\mathcal{K}) = M1 \cup M2$;
- -if $\delta > 1/2$, in the interval $\delta + \delta^2 2\delta^3 < c < \delta + \delta^2 \delta^3 \delta^4$: $\hat{G}(\mathcal{K}) = M1 \cup M2 \cup M3$;
- -if $\delta > 0.618$, in the interval $\delta + \delta^2 \delta^3 \delta^4 < c < \delta + 2\delta^2 3\delta^3$: $\hat{G}(\mathcal{K}) = M1 \cup M2 \cup M3 \cup M4$.

Note how the set of stochastically stable architectures shrinks as the cost diminishes from $\delta + 2\delta^2 - 3\delta^3$ to $\delta - \delta^3$. Further note the wider interval for the mixed hierarchical architecture rooted in the society of greatest cardinality A (i.e., M2) with respect to that rooted at the smallest society B (i.e., M3).

²⁵We omit the details of the proofs of these extensions, easy for Lemma 1 and more tedious for Lemma 2.

Now let us consider the interval where $c > \delta$. In this interval a node that has only one node at distance 1 must support the link that connects it, therefore only peripherysponsored mixed hierarchical \mathcal{K} -networks can be stable, but it can easily be seen that periphery-sponsored mixed variants of M3, M4 and M5 are not strict Nash. This drives us to consider the following architectures:

-PM1: all-encompassing periphery-sponsored stars centered at any point of $A \cap B$;

-PM2: oriented converging trees rooted at 1 or 2 where all nodes in A support links with the root and 7 supports a link with a node in $A \cap B$;

Observe that $PM1 \subseteq M1$ and $PM2 \subseteq M2$.

A similar discussion to that made for the preceding interval leads to the following intervals where each of these architectures remains stable:

- -The empty network g^e remains strict Nash in the whole interval $\delta < c$;
- -PM1 remains strict Nash in the interval I_{PM1} , where $\delta < c < \delta + 5\delta^2$;
- -PM2 remains strict Nash in the interval I_{PM2} , where

$$\delta < c < \min\{\delta + \delta^2 + 4\delta^3, \delta + 4\delta^2\}.$$

As to the relative inclusion of these intervals, we always have $I_{PM1} \supseteq I_{PM2}$. Thus, we now have that in the interval considered, for sufficiently high cost, only the empty network is strict Nash, but as the cost decreases, all-encompassing periphery-sponsored stars (PM1) first also become strict Nash, then also PM2.

Let us now consider stochastic stability. It can be seen²⁶ that the following adaptations of Feri's results hold if $c > \delta$: (i) a transition from any K-network to the empty network can be induced by a mutation followed by unperturbed dynamic; (ii) a single mutation in the empty network followed by unperturbed dynamic converges to the empty network itself or a network in one of the two sets PM1 and PM2, in the latter two cases for a sufficiently low cost, namely:

- -PM1 can be reached if $c < \delta + 3\delta^2$;
- -PM2 can be reached if $c < \min\{\delta + 2\delta^2, \delta + \delta^2 + 4\delta^3\}$;

and (iii) if $c < \delta + 3\delta^2$ ($c < \min\{\delta + 2\delta^2, \delta + \delta^2 + 4\delta^3\}$) starting from PM1 (PM1 or PM2) a mutation followed by unperturbed dynamic leads to g^e or some network in PM1 (PM1 or PM2).

Then, combining this with the results about strict Nash stability, we have that:

- -in the interval where $\delta + 3\delta^2 < c$: $\{g^e\} = \hat{G}(\mathcal{K})$. -in the interval $\min\{\delta + 2\delta^2, \delta + \delta^2 + 4\delta^3\} < c < \delta + 3\delta^2$: $\{g^e\} \cup PM1 = \hat{G}(\hat{\mathcal{K}})$.
- -in the interval $\delta < c < \min\{\delta + 2\delta^2, \delta + \delta^2 + 4\delta^3\}$: $\{g^e\} \cup PM1 \cup PM2 = \hat{G}(\mathcal{K})$.

Thus, the set of stochastically stable K-networks in the example considered is characterized for any δ (0 < δ < 1) and any $c > \delta$.

²⁶We omit the detailed calculations along with the exhaustive discussion case by case which the proofs consist of.

5.3 Efficiency and stability with decay

As we have seen in section 3, efficiency (i.e., maximal aggregate utility) and stability (in the sense of Nash equilibrium) without decay are equivalent conditions: they are satisfied by all \mathcal{K} -networks minimally connected and only by them. As we have seen, this is no longer the case in the presence of decay, where non-efficient architectures may be strict Nash. Nevertheless, what seems to be a general conclusion when the societal hub is not empty arises from the preceding discussion. In the presence of decay, efficiency and stability go hand in hand in a sense: the greatest stability in the sense of a widest interval where an architecture remains stable (i.e., strict Nash) or stochastically stable, and the greatest efficiency (i.e., the greatest aggregate utility), are obtained for all-encompassing stars when the societal hub is not empty.

This is illustrated by Example 3. As the reader may easily check, in the interval where $\delta - \delta^2 < c < \delta$, within each of the four sets of mixed hierarchical networks that contain the stochastically stable \mathcal{K} -networks, M1 (all-encompassing stars centered in the societal hub), M2, M3 and M4, the aggregate utility is the same for any two networks in the same set, and with respect to each other, we have the same order: M1 > M2 > M3 > M4 both for the degree of efficiency (i.e., the aggregate utility is maximized in M1 and decreases down to M4), and for the range within which those sets of networks are stable and stochastically stable, this interval is the largest for M1 and narrows down till the smallest interval for M4.

In the second interval, where $c > \delta$, given that $PM1 \subsetneq M1$ and $PM2 \subsetneq M2$, we have the order $PM1 \succ PM2$ for the degree of efficiency, and again the same order relative stability's robustness. Now a periphery-sponsored star centered at the societal hub is the most efficient architecture and the non-empty architecture with a widest interval where it remains stable or stochastically stable.

When the societal hub is empty the architectures that allow for a greatest "concentration" would achieve the greatest efficiency. Such optimal architectures do obviously exist for each δ and each c, but we have failed to obtain any general result in this respect. This seems to be a difficult task given the variety of societal covers.

6 Concluding remarks

We have studied the impact of institutional constraints as modeled by a societal cover on Bala and Goyal's (2000a) benchmark two-way flow model. The notion of societal cover seems suitable for capturing in a formal and tractable way many factual constraints to which we refer generically as "institutional" that can often be observed in real world situations. Such constraints emerge due to social, cultural, linguistic, economic, geographic, etcetera reasons and cannot be ignored in many contexts. Moreover, any symmetric link-constraining system is proved to be interpretable as the result of a societal cover.

In this paper, we characterize and study in some detail the structure of stable and

efficient networks under these constraints by extending Bala and Goyal's approach and results. In a nutshell, the conclusions when there is no decay can be synthesized by the equation:

 $Institutional\ constraints + Strict\ stability = Hierarchical\ organization.$

Namely, if there is no decay, the all-encompassing center-sponsored star (when feasible) is no longer the only stable (in the strict Nash sense) architecture, but center-sponsored stars continue to be the basic building blocks of stable networks. Moreover, the architecture of such stable networks embodies a formal hierarchical principle that yields oriented diverging trees, the paradigm of hierarchical organization, or "grafted" oriented trees adapted to the constraints imposed by the cover. It is also proved that simple best response dynamics "work" basically well in this more complicated setting. They may fail to reach a strict Nash network if incompatible "incomplete" and "almost stable" hierarchical networks form, but a stable configuration of payoffs associated with an absorbing set of miscoordination proof networks is sure to be reached. Finally, the impact of decay on the stable architectures and stochastic stability is studied. Although friction blurs the equation above, it is shown that when the societal hub is not empty, the star is the most robust architecture, although other stable and stochastically stable architectures emerge. Moreover, efficiency and stability are shown to go basically in the same direction at least when the societal hub is not empty, the all-encompassing star centered at the societal hub being the architecture with the most robust stability (though second to the empty network when $c > \delta$) and most efficient.

The results obtained with this approach suggest several lines of further research. In fact, this paper is a first step of a research project to explore the effects of institutional constraints. It may be interesting to further study: (i) an extension of the one-way flow model of Bala and Goyal (2000a) similar to the one achieved here for the two-way flow model; (ii) the impact of asymmetric link-constraining systems, which make sense for the one-way and two-way flow models; (iii) alternative assumptions about knowledge: here we have assumed that players within each component of the societal cover have common knowledge of the part of the network within that component, but it may be interesting to study the effects of further restricting information, which suggests an interesting scenario for interaction between network and knowledge; (iv) the effects of heterogeneity combined with institutional constraints. Finally, it could be interesting to see the impact of institutional constraints as modeled here on Jackson and Wolinsky's (1996) model and variants of it based on pairwise stability, given that in the context of bilateral link formation the societal cover notion provides the most general link-constraining system.

References

[1] Akerlof, G. A., and R. E. Kranton, 2000. Economics and identity, Quarterly Journal of Economics, 115 (3), 715–753.

- [2] Bala, V., 1996, Dynamics of network formation, unpublished notes, McGill University.
- [3] Bala, V., and S. Goyal, 2000a, A noncooperative model of network formation, *Econometrica* 68, 1181-1229.
- [4] Bala, V., and S. Goyal, 2000b, A strategic analysis of network reliability, *Review of Economic Design* 5, 205-228.
- [5] Bloch, F., and B. Dutta, 2009, Communication networks with endogenous link strength, *Games and Economic Behavior* 66, 39-56.
- [6] Brewer, M. B., 1991, The social self: On being the same and different at the same time, *Personality and Social Psychology Bulletin*, 17, 475-482.
- [7] Brewer, M. B., and W. Gardner, 1996, Who is this "we"? Levels of collective identity and self representations. *Journal of Personality and Social Psychology*, 71, 83-93.
- [8] Chen, Y., and S. X. Li., 2009, Group identity and social preference, *American Economic Review* 99(1) 431-457.
- [9] Dev, P., 2010, Choosing 'me' and 'my friends'. Identity in a non-cooperative network formation game with cost sharing, mimeo.
- [10] Feri, F., 2007, Stochastic stability in networks with decay, *Journal of Economic Theory* 135, 442-457
- [11] Feri, F., and M.A. Meléndez, 2009, Coordination in evolving networks with endogenous decay. University of Innsbruck, Working Papers in Economics and Statistics 2009-19.
- [12] Galeotti, A., S. Goyal and J. Kamphorst, 2006, Network formation with heterogeneous players, *Games and Economic Behavior* 54, 353-372.
- [13] Goyal, S., 1993, Sustainable communication networks, Tinbergen Institute Discussion Paper, 93-250.
- [14] Goyal, S., 2007, Connections. An Introduction to the Economics of Networks, Princeton University Press. Princeton.
- [15] Goyal, S., and F. Vega-Redondo, 2005, Network formation and social coordination, Games and Economic Behavior 50, 178-207.
- [16] Hojman, D.A., and A. Szeidl, 2008, Core and periphery in networks, *Journal of Economic Theory* 139, 295-309.

- [17] Jackson, M., 2008, Social and Economic Networks, Princeton University Press. Princeton.
- [18] Jackson, M., 2009, "An overview of social networks and economic applications," forthcoming in the *The Handbook of Social Economics*, edited by J. Benhabib, A. Bisin, and M.O. Jackson, Elsevier Press.
- [19] Jackson, M., and A. Watts, 2002, The evolution of social and economic networks, Journal of Economic Theory 106, 265-295.
- [20] Jackson, M., and A. Wolinsky, 1996, A strategic model of social and economic networks, *Journal of Economic Theory* 71, 44-74.
- [21] McBride, M., 2006, Imperfect monitoring in communication networks, *Journal of Economic Theory* 126, 97-119.
- [22] Samuelson, L. 1997, Evolutionary games and equilibrium selection, MIT Press.
- [23] Tajfel, H., and J. Turner, 1979, An Integrative Theory of Intergroup Conflict. In Stephen Worchel and William Austin, eds., *The Social Psychology of Intergroup Relations*, Monterey, CA: Brooks/Cole.Brewer, M. B
- [24] Tutte, W. T., 1984, *Graph Theory*, Addison-Wesley (also in Cambridge University Press, 2001).
- [25] Vega-Redondo, F., 2007, *Complex Social Networks*, Econometric Society Monographs, Cambridge University Press.
- [26] Watts, A., 2001, A dynamic model of network formation, Games and Economic Behavior 34, 331-341.