# A Crash Course in Implementation Theory

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December 1997, revised July 1999

#### Abstract

These lectures are meant to familiarize the audience with some of the fundamental results in the theory of implementation and provide a quick progression to some open questions in the literature.

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# 1 Introduction

There are many economic, social, and political situations where individuals interact to make decisions that affect them collectively. Examples range from voting to elect representatives or choose a public policy, to trading in a market. Based on their preferences over the possible outcomes of the interaction, individuals may act strategically in order to influence the outcome to their advantage. For instance, in an election a voter might vote for his or her second ranked candidate if the voter's favorite candidate has no chance of being elected; or in an auction a buyer may select a bid considering trade-offs between the probability of winning the auction and the price to be paid. The specific design of the institution through which individuals interact, for instance the rules of the election or auction, can have a profound impact on the strategic behavior of the members of the society and on the outcomes of the process. Implementation theory is a study of the relationship between the structure of the institution through which individuals interact and the outcome of that interaction.

Game theory plays a central role in the modeling of the strategic interaction studied in implementation theory. In many applications of game theory, the game modeling interaction is taken as given and analyzed to predict the actions of individuals and the resulting outcome. In implementation theory, instead of taking the game as given, it is something to be designed. Often, one thinks of the desired outcomes as the given and analyses whether there exist game forms for which the strategic properties induce individuals to (always) choose actions that lead to the desired outcomes. An example of an implementation question is: how can we design an auction to be sure that the individual who most highly values an object is sure to be the winner of the auction? In this view, implementation theory is a normative branch and game theory is a positive branch of the same tree, and implementation theory is the design or reverse engineering process associated with game theory. Of course, this view is a bit caricatured, but indicates that there is a close relationship between the tools and understandings developed in implementation theory and game theory.

To get a feeling for the type of questions that are analyzed in implementation theory let us start by looking at a classic example. Consider a society or committee holding an election to select one out of a set of candidates. Each member of the society has a preference ranking over the candidates. The society may have certain aspirations

<sup>&</sup>lt;sup>1</sup>For an analysis of this particular problem from a mechanism design point of view, see Dasgupta and Maskin (1997). I will discuss the relationship and difference between mechanism design and implementation.

regarding which candidate should be selected as a function of the preferences of the members of the society. For instance, it may wish to avoid selecting a candidate who is Pareto dominated by another candidate (i.e., a candidate ranked lower than another candidate by all members of society). It may also wish to select a Condorcet winner (a candidate who defeats any other candidate in a pairwise comparison according to a majority of voters' preferences) if such a candidate exists. If these were the goals of the society then the implementation question would be, "Does there exist an election procedure for which for each possible profile of preference rankings of the voters, each equilibrium outcome of the election procedure would be Pareto optimal and Condorcet consistent?"

In order to answer this question one has to make precise what an election procedure is and what equilibrium outcomes are. This is the point at which game theoretic tools are used. The election procedure is modeled as a game form or what is commonly referred to as a mechanism in the literature. It specifies a set of possible actions or messages that each member of society can use, and then the outcome (in this case the candidate elected) as a function of the actions or messages sent by the members of society. For instance one could have each member of society submit their ranking of the candidates. If there are m candidates, then one could award a candidate mpoints for each voter whose submitted ranking places them highest, m-1 points for each voter's submitted ranking places them second highest, and so on. The elected candidate is the one who has the most points, with ties broken according to some pre-specified rule. This is the mechanism corresponding to Borda's (1781) scoring method. Of course, it may not be in a society member's best interest to report their true preference ranking. This is where equilibrium concepts from game theory are used to make predictions concerning strategic behavior. A solution concept such as Nash equilibrium can be used to predict the preference rankings that will be reported by voters as a function of the voters' true preference rankings. Depending on the class of mechanisms that are admitted (e.g., how complicated we allow the message spaces to be) and which equilibrium concept that is used, we can end up with different answers concerning the possibility of selecting from the Pareto correspondence and being Condorcet consistent.<sup>2</sup>

<sup>&</sup>lt;sup>2</sup>The Borda scoring mechanism will not satisfy Condorcet consistency. Moreover, as we shall see in Example 3 there is no Nash implementable social choice correspondence that selects from the Pareto correspondence and be Concorcet consistent. See Dutta and Sen (1993) and Jackson, Palfrey, and Srivastava (1994) to find examples of social choice correspondences that satisfy these properties and are implementable via backwards induction or undominated Nash equilibrium, respectively.

In the above example a very concrete question was posed. We asked whether it was possible to design election procedures that possess specific properties, or in the language of the theory, whether it is possible to implement correspondences with specific properties. Also, we focused our attention on a specific setting. While this is one way to proceed in analyzing implementation, it does not directly<sup>3</sup> provide a general understanding of implementation that moves across different problems. Another way to proceed, is to take a more abstract approach to the implementation problem and attempt to fully characterize the class of the correspondences that can be implemented. That is, we can search for properties that precisely identify which correspondences are implementable and which are not, and also identify implementing mechanisms. These properties can then be applied to specific settings to check whether a given correspondence can be implemented. Such general characterization results have been produced with remarkably little in terms of assumptions on the structure of the set of alternatives or the feasible preferences of individuals. As we shall see, the theory has alternated between fairly general and abstract theorems that cover a wide variety of potential applications, and more focused and detailed theorems that apply to particular settings or correspondences.

In what follows, I concentrate on a specific progression in the literature and in doing so provide a biased view that often reflects my own perspective on the literature. These lectures are meant to be an introduction to the theory rather than a survey,<sup>4</sup> and so I do this without apology. At points I provide opinions concerning assumptions and results, which are quite critical. This is meant to constructively point out limitations of some of the existing results and suggest potential directions for future research.

In what follows I assume that the reader has an introductory level knowledge of game theory (and thus has seen notions such as Nash equilibrium) and is also familiar with some concepts from microeconomics such as preference relations and Walrasian equilibrium.

<sup>&</sup>lt;sup>3</sup>Nevertheless, I will come back to discuss why an approach of cataloging the answers to such narrower questions may turn out to be a useful approach to developing the theory.

<sup>&</sup>lt;sup>4</sup>Surveys of various aspects of the literature may be found in Moulin (1982), Moore (1992), Palfrey (1992), Palfrey and Srivastava (1993), Allen (1997), and Corchon (1998). While these lectures are not meant to survey the literature, the Bibliography that I include here is fairly comprehensive. The exception is that I do not include references to the large literature related to dominant strategy implementation as Salvador Barberà (1998) offers lectures on strategy-proofness in this same volume.

# 2 Definitions and an Example

#### Individuals

A finite group of *individuals* interact. N denotes both the set of individuals and its cardinality. Generic individuals are represented as i, j, and k.

#### Outcomes

The set of *outcomes* is denoted A, and generic elements are represented as a, b, c, d.

The set of outcomes may be finite or infinite depending on the application. For example, consider the design of a voting procedure to elect one of a finite number of candidates. In that case, N is the set of voters and A is the finite set of candidates. As another example, consider the design of a market where individuals interact to exchange  $\ell$  different goods. In that case N is the set of economic agents, and  $A \subset \mathbb{R}_+^{N\ell}$  represents the final allocation of goods (including labor, leisure, consumption goods, etc.) that are possible given the endowments and production possibilities.

#### Preferences

Individual i's preferences are represented by a binary relation  $R_i$  over A that is complete and transitive. The notation  $aR_ib$  indicates that i weakly prefers alternative a to b. The strict preference relation associated with  $R_i$  is denoted  $P_i$  (where  $aP_ib$  if and only if it is not the case that  $bR_ia$ ). The notation R denotes a profile  $R = (R_1, \ldots, R_N)$ , and  $(R_{-i}, \overline{R_i})$  denotes the profile where the i-th entry of R is replaced with  $\overline{R_i}$ .

The set of admissible profiles of preferences is the set  $\mathcal{P}$ . Depending on the application,  $\mathcal{P}$  may impose restrictions on the preferences. For instance, in the context of the exchange of private goods it may be assumed that preferences are convex, continuous, and non-decreasing. I will sometimes refer to a profile of preferences as being the *state* of the environment.

#### Social Choice Correspondences

A social choice correspondence, F, maps profiles of preferences into subsets of alternatives. For any  $R \in \mathcal{P}$ ,  $F(R) \subset A$  represents the set of socially desirable alternatives when preferences are given by R. It will be assumed throughout that F is non-empty. When F is single-valued it is referred to as a social choice function.

In many applications, F will be a well-known correspondence, such as the Walrasian, Lindahl, or top-cycle correspondence, or will be a social choice correspondence derived from some normative axioms, such as the correspondence of Pareto optimal, individually rational, and envy-free allocations in a private good exchange setting.

Generally, implementation theory seeks to characterize the set of social choice correspondences that are obtainable as equilibrium outcomes when individuals interact through some game form making strategic use of their knowledge of the preference profile R. There are several perspectives that one can take on this problem. One perspective is to begin with a specific correspondence and setting, such as the Walrasian correspondence in a private-goods economic setting, and ask whether that specific correspondence can be implemented and if so by what mechanism. A second perspective is to work more abstractly and characterize the set of correspondences that are implementable, by identifying conditions that they must satisfy. Both of these (and some other) perspectives have been taken in the literature, and we shall see examples of each.

#### Mechanisms

A mechanism is a pair M, g, where  $M = M_1 \times \cdots \times M_N$  is a cross product of message spaces and  $g: M \to A$  is an outcome function. Thus, for each profile of messages  $m = (m_1, \ldots, m_N), g(m) \in A$  represents the resulting outcome or allocation.

A mechanism is often also referred to in the literature as a game form. The terminology game form distinguishes it from a game, as the consequence of a profile of messages (or actions) is an outcome rather than a vector of utility payoffs. Once the preferences of the individuals are specified, then a game form induces a game. Since in the implementation analysis the preferences of individuals vary from state to state, this distinction between game forms and games is critical.

### Solution Concepts

A solution concept<sup>5</sup> specifies the strategic behavior of individuals faced with a mechanism (M,g) given a preference profile R. Thus, it is a correspondence S that identifies a subset of M for any given (M,g,R) specification. For the question of what a mechanism implements, the specific messages that are predicted by the solution concept are only of intermediate interest as the corresponding set of outcomes that result is the important concept. Thus, we pay attention to the outcome correspondence associated with a solution S represented by  $O_S(M,g,R) = \{a \in A \mid \exists m \in S(M,g,R) \text{ s.t. } g(m) = a\}$ .

For example, for any given (M, g, R) a pure strategy Nash equilibrium is a profile

<sup>&</sup>lt;sup>5</sup>I use the terminology "solution concept" rather than "equilibrium concept", as some of the concepts employed in the literature (such as single or iterative removal of dominated strategies) do not make explicit use of "equilibrium" ideas, and can predict vectors of messages that are not stable in an equilibrium sense.

 $m \in M$  such that  $g(m)R_ig(m_{-i},\overline{m_i})$  for all i and  $\overline{m_i} \in M_i$ . Denote this set by NE(M,g,R). The set of associated outcomes is  $O_{NE}(M,g,R) = \{a \in A \mid \exists m \in NE(M,g,R) \text{ s.t. } g(m) = a\}$ .

I define other solutions concepts as they arise and similarly defer definitions of mixed strategies until arise.

## Implementation

A social choice correspondence F is implemented by the mechanism (M, g) via the solution S, if  $O_S(M, g, R) = F(R)$  for all  $R \in P$ . F is said to be implementable via the solution S if there exists a mechanism (M, g) which implements it.

The above form of implementation is sometimes referred to as *full* implementation as it requires the exact coincidence of the outcomes of a mechanism with the social choice correspondence.

One can also reasonably argue for a weaker form of implementation where one only requires that  $O_S(M, g, R)$  be a non-empty subset of F(R) for every R.<sup>6</sup> This takes the point of view that any outcome in F(R) is socially desirable and so any selection is fine. Note, however, that F is weakly implementable if and only if some sub-correspondence of F is implementable. The literature has thus proceeded in characterizing what is implementable, which then provides an indirect answer to the question of weak implementability.<sup>7</sup>

One key aspect of implementation (and weak implementation) is the requirement that all equilibrium outcomes lie in the given social choice correspondence. This is different from designing a mechanism that has one desired outcome as an equilibrium outcome, as there may also be undesired equilibrium outcomes that are not accounted for. This points to the important distinction between the "implementation" literature and the "mechanism design" literature as being one of worrying about multiple equilibria. The mechanism design literature focuses on incentive compatibility issues, asking whether a given outcome can be induced as an equilibrium of some mechanism and generally ignores whether there are other equilibria. In situations where this leads to a negative result (e.g., Myerson and Satterthwaite (1983)) showing that certain outcomes cannot be sustained as the equilibrium of any mechanism this approach is fine. However, in situations where it leads to positive results so that one identifies a mechanism

<sup>&</sup>lt;sup>6</sup>See Thomson (1996) for an argument supporting full implementation over weak.

<sup>&</sup>lt;sup>7</sup>This may not be an entirely satisfactory approach, as there may be conditions for weak implementability that are easier to verify than checking whether some sub-correspondence satisfies the conditions for implementability.

and one of its equilibrium as satisfying some desired criteria, then one should be very careful in interpreting the result. Can we be sure that the given equilibrium will be played and not some other equilibrium of the mechanism?<sup>8</sup> Are there other mechanisms that are better from the perspective of maintaining the desired equilibrium, but not having other undesired ones? This point is well illustrated in an example of Demski and Sappington (1984)<sup>9</sup>, where the "optimal" mechanism to a principal-multiple agent problem has a second equilibrium which makes all the agents better off and the principal worse off.<sup>10</sup>

The multiple equilibrium issue is why the implementation problem is still non-trivial in environments with complete information, where each individual knows the other individuals' preferences. As an example, suppose that we consider trying to implement the Walrasian correspondence in a classical Edgeworth setting. If we only want to make sure that Walrasian outcomes are Nash equilibrium outcomes, and do not care about what other equilibrium outcomes may arise, there is a simple mechanism that works. Individuals simultaneously announce a full vector of feasible allocations. If they all announce the same vector of allocations then that is the outcome, and otherwise the outcome is that they each keep their endowment. Clearly everyone announcing the same Walrasian allocation is a Nash equilibrium of this mechanism. Unfortunately, there are many other equilibria of this mechanism which are not Walrasian allocations. The question implementation question is there exists a mechanism whose entire set of Nash equilibrium outcomes coincides with the set of Walrasian allocations for each preference profile.

### On the Timing and Information Structure

Much of the implementation literature uses an idiom that refers to a social planner, who is benevolent and selects the mechanism to implement a social choice correspondence with a society's best interest at heart. A question that then naturally comes to mind when thinking about the implementation problem is why doesn't the social planner adjust the mechanism once the preference profile is realized.<sup>11</sup> Alternatively,

<sup>&</sup>lt;sup>8</sup>If so, why was this not built into the solutoin concept to begin with?

<sup>&</sup>lt;sup>9</sup>For further examples and a pointed discussion of this issue, see Palfrey and Srivastava (1993).

<sup>&</sup>lt;sup>10</sup>A defense that is often offered for focusing a single equilibrium is that society can direct its members to play the desired equilibrium and then they should have no reason to deviate. This argument loses some power when there are alternative equilibria that are preferred by some (or even all) of the members of society, especially if there is any possibility for the members to directly or indirectly coordinate on an equilibrium.

<sup>&</sup>lt;sup>11</sup>See Baliga, Corchon and Sjöström (1997) for the possibility of having the planner be a player who

why do the individuals in society have complete information concerning each others' preferences (or at least enough information to arrive at an equilibrium) and the social planner not? An answer is that mechanisms represent institutions (or in some cases even constitutions), that are meant to be long-lived. These may be costly to adjust, or it even may be better to commit to fixing the institutions not to adjust to the specifics of each realized setting. The rules for a securities market are fixed and then traders arrive with their desired trades, and similarly the rules for an election are (usually) set before preferences of the voters are realized. Thus, mechanisms can be thought of as representing institutions, and the implementation problem is to characterize institutions in terms of the correspondence of outcomes they produce as a function of the realized state of individual preferences.

Finally, while incomplete information environments, where for instance individuals know their own preferences and hold beliefs over the preferences of others, are arguably more realistic than complete information environments, it has proven useful to attack the problem one piece at a time. Understanding implementation in the complete information setting has helped significantly in developing characterizations of implementation in Bayesian settings.

#### An Example:

Hurwicz laid much of the foundation of the implementation problem, and presented a simple example that is a very good one for a first analysis of some of the issues.

## **Example 1.** (Hurwicz (1972))

Consider a two person, two good exchange economy, that lies in the Edgeworth box. Individual 1 has an endowment  $e^1 = (0,1)$  and individual 2 has an endowment  $e^2 = (1,0)$ . Let  $x_\ell^i$  denote individual i's allocation of the  $\ell$ -th good. So here our space of feasible allocations is  $A = \{(x^1, x^2) \in \mathbb{R}_+^4 \mid x_1^1 + x_1^2 = x_2^1 + x_2^2 = 1\}$ .

Consider two states of the world. In the first state  $(R^1, R^2)$ , the preference relation  $R^i$  of each individual is represented by a Cobb-Douglas utility function  $u_i(x) = x_1^i x_2^i$ . In the second state,  $(\overline{R}^1, R^2)$ , the preferences of agent 1,  $\overline{R}^1$ , are represented by the utility function  $\overline{u}_1(x) = x_2^1 - \frac{1}{1+x_1^1}$ .

Suppose that we are interested in implementing the Walrasian correspondence. The unique Walrasian equilibrium allocation at  $R^1$ ,  $R^2$  is  $x^1 = x^2 = (1/2, 1/2)$ , and at  $\overline{R}^1$ ,  $R^2$  is  $x^1 = (1/2, 7/9)$  and  $x^2 = (1/2, 2/9)$ .

has preferences and can affect the outcome function as part of equilibrium play.

Clearly, in either state agent 1 prefers to have the allocation associated with  $(\overline{R}^1, R^2)$  to that associated with  $(R^1, R^2)$ . This is seen in Figure 1.

[Insert Figure 1 here]

There are a few important conclusions to draw from this example. The first is that a direct mechanism, or the classic one associated with a "Walrasian auctioneer" who asks individuals to report their demand functions, will not implement the Walrasian correspondence. Individual 1 is better off acting as if he had preferences  $\overline{R}^1$  instead of  $R^1$  when the state is actually  $(R^1, R^2)$ . This also implies that any sort of incentive compatibility condition will be violated by the Walrasian correspondence (or any selection from it) when agents' preferences are private information.

Hurwicz points out another consequence of this line of reasoning. A mechanism that implements<sup>13</sup> the Walrasian correspondence must make use of information of agent 2 concerning the preferences of agent 1, as agent 1 can otherwise pretend to be of type  $\overline{R}^1$ . Thus, Hurwicz argues that no "privacy preserving" mechanism can implement the Walrasian correspondence, where privacy preserving is an appropriate formalization of the idea that the mechanism only incorporates knowledge of an individual about their own preferences.

Let us now explore a related question in the context of the same problem in order to get a better feeling for the implementation problem. We know that a mechanism that implements the Walrasian correspondence in this example must make some use of individual 2's knowledge of individual 1's preferences. So we might ask, is that enough? Is there a simple mechanism that Nash implements the Walrasian correspondence in this two state example?

The following is the direct mechanism associated with simply asking each individual to announce their preferences. The first entry in each row is individual 1's allocation and the second is individual 2's allocation.

#### Table 1

Thurwicz actually makes a stronger point. Every allocation that is Pareto efficient and individually rational for both individuals at  $\overline{R}^1$ ,  $R^2$ , is preferred under  $R^1$  (and  $\overline{R}^1$ ) to the Walrasian equilibrium allocation at  $R^1$ ,  $R^2$ .

<sup>&</sup>lt;sup>13</sup>I am being vague about the solution concept at the moment, but the statement is true for most solutions concepts.

Individual 1 
$$R^1$$
  $x^1 = (\frac{1}{2}, \frac{1}{2}), x^2 = (\frac{1}{2}, \frac{1}{2})$   $x^1 = (\frac{1}{2}, \frac{7}{9}), x^2 = (\frac{1}{2}, \frac{2}{9})$ 

Clearly, there is a unique strictly dominant strategy equilibrium in either state for individual 1 to say  $\overline{R}^1$ , and so such a direct mechanism cannot Nash implement the Walrasian correspondence. This is just an illustration of Hurwicz's point.

Let us now expand individual 2's strategies to include two possible announcements "Left" and "Right". We will design the mechanism so that it is a strictly dominant strategy for individual 1 to say  $R^1$  when the state is  $R^1$ , and  $\overline{R}^1$  when it is  $\overline{R}^1$ . Moreover, this can be done so that it is a strict best response for individual 2 to say "Left" if individual 1 is playing  $R^1$ , and to say "Right" if individual 1 is saying  $\overline{R}^1$ .

Table 2

# Individual 2 Left Right Individual 1 $R^1$ $x^1 = (\frac{1}{2}, \frac{1}{2}), x^2 = (\frac{1}{2}, \frac{1}{2})$ $x^1 = (\frac{11}{18}, \frac{2}{3}), x^2 = (\frac{7}{18}, \frac{1}{3})$ $\overline{R}^1$ $x^1 = (0, 1), x^2 = (1, 0)$ $x^1 = (\frac{1}{2}, \frac{7}{9}), x^2 = (\frac{1}{2}, \frac{2}{9})$

For the mechanism in Table 2, the unique Nash equilibrium in state  $(R^1, R^2)$  is  $(R^1, \text{Left})$  which results in the Walrasian allocation for that state, and similarly for the state  $(\overline{R}^1, R^2)$  the unique Nash equilibrium is  $(\overline{R}^1, \text{Right})$ . This mechanism thus implements the Walrasian correspondence (for this simple two state environment) in Nash equilibrium. The mechanism also implements the desired correspondence in the iterative elimination of strictly dominated strategies, and most other solution concepts.

As is consistent with Hurwicz's privacy preserving point, it was necessary for us to have individual 2 play a role even though only 1's preferences vary. One thing to note about the above mechanism, is that individual 2 does not simply "report" what she knows about individual 1. Individual 2 would have an incentive to say that it was state  $R^1$ , even if it was state  $\overline{R}^1$ . Thus, the agents' incentives in this regard are opposed. Instead, allowing individual 2 to have a non-trivial message space allows us to create a richer mechanism; and in particular to exploit switches in individual 1's preferences

between the two states. For instance, the " $\overline{R}^1$ , Left" entry is one that individual 1 prefers to  $R^1$ , Left" in state  $\overline{R}^1$  but not in state  $R^1$ . Thus, the off-diagonal entries are critical to the working of the mechanism and were not chosen by chance. This begins to hint at an important necessary condition for implementation that I discuss next.

The contrast between the workings of the two mechanisms above points out the importance of considering a large class of mechanisms for the implementation problem, and most notably to include mechanisms that do more than simply ask individuals to report their preferences. Although the mechanism in Table 2 can be regarded as a direct mechanism if one thinks of asking each individual to report the state, the entries in the off-diagonals are still critical to successful implementation. Moreover, there are problems where implementation can only be achieved by mechanisms that are more complicated. In order to develop a deeper understanding of this, let us now analyze Nash implementation.

# 3 Nash Implementation

The seminal work on Nash implementation by Maskin (1977), not only provides us with an understanding of what is implementable in Nash equilibrium, but it also provides a blueprint for the techniques and approach that underlie many of the general characterization results in the literature. Thus, it is useful to study Nash implementation in some detail.

# Monotonicity Two Ways

Maskin identified an intuitive necessary condition for Nash implementation that he called monotonicity.<sup>14</sup> This condition may be expressed in two different ways. It is a trivial exercise to see that the statements are equivalent. Nevertheless, I present each of them separately as these expressions correspond to different expressions in the implementation problem, and it is useful to emphasize each of these points of view.

Suppose that a social choice correspondence F is Nash implementable. What can we deduce about F? Its implementability implies that there exists an implementing mechanism (M,g). So consider a preference profile R and an alternative  $a \in F(R)$ . Since F is Nash implementable there exists a profile of actions  $m \in M$  such that m is a Nash equilibrium at R and g(m) = a. Next, suppose that there exists another preference profile  $\overline{R}$  such that  $a \notin F(\overline{R})$ . The fact that (M,g) Nash implements F

<sup>&</sup>lt;sup>14</sup>This condition previously appeared in the social choice literature under the name strong positive association (e.g., see Muller and Satterthwaite (1977)). The name monotonicity, however, stuck.

then implies that m cannot be a Nash equilibrium at  $\overline{R}$ . Thus, there must exist an agent i and a deviation  $\overline{m}_i$  that i prefers to  $m_i$  at  $\overline{R}_i$ . That is, there must exist i and  $\overline{m}_i$  such that  $g(m_{-i}, \overline{m}_i)\overline{P}_ig(m)$ . Since m was a Nash equilibrium at R, it must be that  $g(m)R_ig(m_{-i}, \overline{m}_i)$ . Letting  $b = g(m_{-i}, \overline{m}_i)$ , we have reasoned that F must satisfy the following condition.

A social choice correspondence F is monotonic if for any  $R \in \mathcal{P}$ ,  $\overline{R} \in \mathcal{P}$ , and  $a \in F(R)$  such that  $a \notin F(\overline{R})$ , there exists i and b such that  $aR_ib$  and  $b\overline{P}_ia$ .

This condition is represented in the following figure.

[Insert Figure 2 here]

In Figure 2, the set of allocations is in  $\mathbb{R}^2_+$  for individual i. The monotonicity condition states that if  $a \in F(R)$  but  $a \notin F(\overline{R})$ , then there exists some i for whom either the indifference curves through a corresponding to  $R_i$  and  $\overline{R}_i$  cross (Figure 2.1)<sup>15</sup> or the upper contour set of  $\overline{R}_i$  through a is a superset of the upper contour set of  $R_i$  through a (figure 2.2).

We have reasoned the following result.

**Theorem 1** [Maskin (1998)] If a social choice correspondence F is Nash implementable, then F is monotonic.

To get some practice understanding monotonicity, the reader can return to the implementing mechanism in Example 1 (Table 2) and verify that player 1 and the off-diagonal entries satisfy the monotonicity conditions that are necessary for implementation.

To develop a fuller understanding of monotonicity, let us examine the condition from a different, but formally equivalent perspective.

Consider a preference profile R and alternative  $a \in F(R)$ . Suppose that  $\hat{R}$  is such that for each i if  $aR_ib$ , then  $a\hat{R}_ib$ . This says that a's standing in i's preference ranking has improved (or at least not fallen) from R to  $\hat{R}$ , so that a is still preferred under  $\hat{R}_i$  to each b it was preferred to under  $R_i$ . From Nash implementability we know that there

<sup>&</sup>lt;sup>15</sup>Although in the figure, the indifference curves cross at a, they can cross at any point and may cross more than once. As noted in Maskin (1998), the Spence-Mirrlees single-crossing condition is stronger than monotonicity. For a study of the relationship between monotonicity and single crossing properties see Arya, Glover, and Rajan (1998).

exists m which is a Nash equilibrium at R. This implies that  $g(m)R_ig(m_{-i},\widehat{m}_i)$  for any i and potential  $\widehat{m}_i$ . Given that  $aR_i(s)b$  implies  $a\widehat{R}_ib$ , it must be that  $g(m)\widehat{R}_ig(m_{-i},\widehat{m}_i)$  for any i and potential  $\widehat{m}_i$ . Thus, m is also a Nash equilibrium at  $\widehat{R}$  and so  $a \in F(\widehat{R})$ . This leads to the following statement of monotonicity.

A social choice correspondence F is monotonic if for any R,  $a \in F(R)$ , and  $\widehat{R}$ , such that for each i and b  $aR_ib$  implies  $a\widehat{R}_ib$ ,  $a \in F(\widehat{R})$ .

Thus, monotonicity requires that if  $a \in F(R)$  and for each i the upper contour set of  $\hat{R}_i$  through a is a subset of the upper contour set of  $R_i$  through a, then  $a \in F(\hat{R})$ . This condition is represented in the following figure.

## [Insert Figure 3 here]

One statement of monotonicity follows the reasoning that if an alternative is to be implemented at one profile but not another, then it must have fallen in someone's rankings in order to break the Nash equilibrium via some deviation. The other statement of monotonicity follows the reasoning that if an alternative is implemented at one profile and rises in each individual's rankings at another preference profile, then profile of actions leading to the alternative which form a Nash equilibrium at the first profile must still be a Nash equilibrium profile at the second profile. These conditions are obviously equivalent as one is simply the contra-positive of the other. Nevertheless, it is still useful to consider both statements. The first emphasizes that there must exist some preference reversal if an equilibrium at one profile is to be broken at another. This suggests natural relationships with various preference crossing properties. The second emphasizes that if the standing of an equilibrium alternative improves it must remain an equilibrium outcome, which is often a useful way of checking whether monotonicity is satisfied and provides useful bridges to understanding the connection to conditions such as strategy-proofness.

# Sufficient Conditions for Nash Implementation

Monotonicity alone is not a sufficient condition for Nash implementation, but it is sufficient together with an auxiliary condition called no-veto power when there are at least three individuals.

A social choice correspondence F satisfies no veto power if whenever i, R, and a are such that  $aR_jb$  for all  $j \neq i$  and all  $b \in A$ , then  $a \in F(R)$ .

No veto power is a condition that is quite weak in some contexts, such as environments with some private goods when there are at least three (non-satiated) individuals. In such a context, each individual would prefer to have more of the private good and so there is never a single alternative that is most preferred by more than one individual. However, the condition is more restrictive with 2 individuals, or in contexts such as voting environments where there is no private good.

**Theorem 2** [Maskin (1998)] If  $N \geq 3$  a social choice correspondence F satisfies monotonicity and no veto power, then it is Nash implementable.

It is instructive to sketch a proof of this theorem, <sup>16</sup> as it provides insight into the approach used to many of the sufficiency theorems in the literature.

Generally, it is easy to design a mechanism that has the desired outcomes as Nash equilibria. It is more difficult to rule out undesired outcomes. To see this, consider the following trivial mechanism: if at least N-1 individuals name the same alternative then that is the outcome, otherwise some arbitrary b is the outcome. Notice that a unanimous announcement of any a is a Nash equilibrium for any preference profile. However, every alternative is an equilibrium outcome for such a mechanism regardless of the preference profile. This points to the importance of the multiple equilibrium problem. One way to view the mechanism below is to start with such a trivial mechanism and then modify it using monotonicity to rule out undesired equilibria.

Consider a social choice correspondence F which satisfies monotonicity and no veto power and assume that  $N \geq 3$ . Consider the following mechanism.

 $M_i = \mathcal{P} \times A \times I\!\!N$  where  $I\!\!N$  is the set of nonnegative integers. Define g as follows:

- (1) If  $m_1 = m_2 = \cdots = m_N = (R, a, n)$  and  $a \in F(R)$ , then g(m) = a.
- (2) If there exists i such that  $m_j = (R, a, n)$  for all  $j \neq i$ , where  $a \in F(R)$ , and  $m_i = (\cdot, b, \cdot)$  where  $b \neq a$ , then g(m) = b if  $aR_ib$  and g(m) = a if  $bP_ia$ ,
- (3) For any other m label  $m_i = (\cdot, a_i, n_i)$  and let  $i^*$  be the lowest indexed i such that  $n_i \geq n_j$  for all  $j \neq i$ , and then  $g(m) = a_{i^*}$ .

Let us verify that this mechanism Nash implements the desired F. Let R be the true preference profile.

<sup>&</sup>lt;sup>16</sup>Although the theorem was first stated in Maskin (1998) (and the manuscript dates to 1977), the first proof was by Williams (1986). William's proof required some additional assumptions on the setting, and the first complete proof of the theorem as stated is in Saijo (1988). The proof given here is adapted from Repullo (1987) and Moore and Repullo (1990).

First, let us check that for any  $a \in F(R)$  it is a Nash equilibrium for all agents to announce  $m_i = (R, a, 0)$ . A unilateral deviation by any i results in an  $m_{-i}, \overline{m}_i$  that falls either in (1) or (2), and then can only result in a b such that  $aR_ib$ . Thus, no i can gain by deviating and so m is an equilibrium.

Next, let us check that every Nash equilibrium results in some  $a \in F(R)$ . If m is a Nash equilibrium that falls into (3), then it must be that g(m) is the most preferred outcome of all agents, since otherwise some agent i could deviate and announce an integer higher than the other agents and select any outcome  $a_i$ . Thus, by no veto power it must be that  $g(m) \in F(R)$ . If m is a Nash equilibrium that falls into (2), then any agent  $j \neq i$  (where i is as defined in (2)) could unilaterally deviate and choose an action such that g would be determined by (3) and  $j = i^*$  (simply by announcing an integer higher than any other agent and any desired  $a_i$ ). Thus, for such an m to be an equilibrium, it must be that g(m) is most preferred by all agents  $j \neq i$ , and again no veto power ensures that  $g(m) \in F(R)$ . Finally, consider the case where m is a Nash equilibrium and q is determined by (1). If the preference profile R is announced truthfully, then the outcome must be in F(R). So consider the case where  $m_1 = m_2 = \cdots = m_N = (\tilde{R}, a, n)$  and  $a \in F(\tilde{R})$  where  $\tilde{R} \neq R$ . Any individual i could deviate to obtain any b such that  $a\widetilde{R}_i b$  (by simply announcing  $(\cdot, b, \cdot)$  which puts  $m_{-i}, \widetilde{m}_i$  under (2)). Thus, it must be that if  $a\widetilde{R}_i b$  then  $aR_i b$ . Thus, by monotonicity  $a \in F(R)$ .

This basic structure of this mechanism underlies the construction of mechanisms in many of the constructive proofs for other solution concepts too. The basic idea is that there is a possibility for complete agreement which falls under (1). This allows outcomes in F(R) to be sustained as equilibrium outcomes. As it is possible for the individuals all to announce the same (R, a, n) even when the state is  $\overline{R}$  and  $a \notin F(\overline{R})$ , part (2) of the definition of g allows monotonicity to work so that some i can deviate and announce  $(\overline{R}, b, n)$  and obtain b. Part (3) then allows any individual other than i to obtain any outcome they like, which rules out equilibria that fall under (2), unless b is most preferred by all  $j \neq i$  in which case by no veto power,  $b \in F(\overline{R})$ .

As discussed previously, no veto power is not a necessary condition and can be restrictive. So it is worthwhile to identify a set of conditions that is both necessary and sufficient for Nash implementation. Such conditions have been obtained by Moore and Repullo (1990). Although these conditions are more complicated, they do provide additional insight and I refer the reader to the Moore and Repullo (1990) paper for

more detail.<sup>17</sup>

Theorem 2 requires that  $N \geq 3$ . The case of N=2 is of obvious importance as there are many bilateral interactions that one would like the theory to handle. Interestingly, there are non-trivial differences between the case of N=2 and  $N\geq 3$ . To get a rough idea of the additional considerations that appear for the case of N=2, notice that the mechanism used to prove Theorem 2 makes use of the fact that when N-1 agents announce the same thing, then one can identify an i who is demanding a different alternative as in (2) of the definition of g. With 2 agents this is not possible and an additional necessary condition appears. Characterizations for the case of N=2 appear in Dutta and Sen (1991b) and Moore and Repullo (1990). While the full characterization is complex, an intuitive sufficient condition called the "non-empty lower intersection condition" appears in Dutta and Sen (1991b), and I refer the interested reader there for details.

## The Restrictiveness of Monotonicity

To better understand what is Nash implementable, let us now explore whether some well-known social choice correspondences satisfy monotonicity.

Let us begin with the classical exchange environment referred to in Hurwicz (1972) and consider whether the Walrasian correspondence satisfies monotonicity. In Example 1 monotonicity was satisfied. However, that was a very restrictive setting and in fact monotonicity is not satisfied by the Walrasian correspondence on the full classic domain of preferences. This was shown in the context of the following example by Hurwicz, Maskin, and Postlewaite (1995).

# Example 2. (Hurwicz, Maskin, and Postlewaite (1995))

Consider a two person, two good Edgeworth economy.<sup>18</sup> There are two states  $(R^1, R^2)$  and  $(\overline{R}^1, R^2)$ , with the preferences as pictured in Figure 4 below. The allocation a is a Walrasian equilibrium at  $R^1, R^2$ , but not at  $\overline{R}^1, R^2$ .

[Insert Figure 4 here]

The difficulties that appear in the figure above have to do with the boundary of the Edgeworth box. Thus in order to satisfy monotonicity, we need to find b such that  $aR^1b$  and  $b\overline{P}^1a$ . The allocation b necessary to satisfy this requires an amount of

<sup>&</sup>lt;sup>17</sup>See Danilov (1989) and Yamato (1992) for an elegant full characterization in some specific settings and Sjöström (1991) for an algorithm for verifying the necessary and sufficient conditions.

<sup>&</sup>lt;sup>18</sup>Although the figure is simply for 2 individuals, it is easily adapted for 3 or more individuals.

good 2 for player 1 that exceeds the total amount of good 2 available in the economy. The problem is that the crossing of preferences required by monotonicity takes place outside of the Edgeworth box, and outside of the set of allocations that are feasible for a mechanism to provide.

The way around this problem suggested by Hurwicz, Maskin and Postlewaite (1995) is to modify the Walrasian correspondence to include a as an equilibrium at  $\overline{R}^1, R^2$ . This new correspondence, called the "constrained Walrasian correspondence" satisfies monotonicity and is Nash implementable when there are 3 or more individuals.

To be precise let  $A = \{x \in R_+^{N\ell} | \sum_i x_k^i \leq \sum_i e_k^i \ \forall k \}$ . Say that x is a constrained Walrasian equilibrium allocation if there exists  $p \in \mathbb{R}_+^{\ell}$  such that  $p \cdot x^i \leq p \cdot e^i$  for each i and  $xR_iy$  for all  $y \in A$  such that  $p \cdot y^i \leq p \cdot e^i$ .

The constraint in the definition is in the requirement that  $y \in A$ . In the usual definition of a demand correspondence, one requires that a demanded point be weakly preferred to all other points in the budget set. In this constrained definition, it is only required that a demanded point be weakly preferred to the points in the budget set that are also feasible given the resources in the economy. Thus,  $a^1$  is not in the demand correspondence of player 1 at  $\overline{R}^1$ , but it is in the constrained demand correspondence. So, the allocation a is a constrained Walrasian equilibrium at  $\overline{R}^1, R^2$ , and so the difficulty with monotonicity is overcome. Hurwicz, Maskin, and Postlewaite (1995) show that the constrained Walrasian correspondence is monotonic on a classical domain of preferences, and it is contained in any upper-hemicontinuous social choice correspondence that is Pareto efficient, individually rational, and monotonic.

Next, let us examine monotonicity in a voting context.

#### Example 3.

Let A be a finite set of candidates, and consider the following preference profile.

 $R^1 = a, b, c, R^2 = c, a, b, \text{ and } R^3 = b, c, a.$ 

Also consider  $\overline{R}^3 = c, b, a$ .

Let  $F(R) = \{a, b, c\}$  and  $F(R^{-3}, \overline{R}^3) = \{c\}$ . F agrees exactly with the choice of most scoring rules (e.g., Borda), and most any rule that is anonymous and neutral (e.g., the top cycle correspondence, uncovered correspondence, Copeland rule, Simpson rule, etc.), as well as plurality rule. Unfortunately, F is not monotonic since the standing of a has not changed at all in anyone's preference ranking and yet a is in F(R), but not in  $F(R^{-3}, \overline{R}^3)$ .

This means there are no well-known voting correspondences that are Nash im-

plementable! This suggests that sequential rationality or other solution concepts are needed for the implementation of voting correspondences.

To see the restrictiveness of monotonicity in the voting context from another perspective, note that the Muller-Satterthwaite (1977) theorem states that in a voting context<sup>19</sup> if  $N \geq 3$  then any social choice—function that is monotonic is necessarily dictatorial.

As we have seen, although monotonicity can be satisfied, it is in general a strong condition. Many interesting and desirable social choice correspondences are not Nash implementable. In view of this, various alternatives to Nash implementation have been investigated in detail. One possibility is to use alternative equilibrium concepts, an idea we will turn to later. Generally, using stronger equilibrium concepts (i.e., more refined ones) allows for more things to be implemented. Usually the more difficult challenge in implementation comes from ruling out undesired equilibrium outcomes, rather than ensuring that desired outcomes are equilibrium outcomes. Stronger solution concepts aid in ruling out undesired equilibria. The second possibility that has been explored is to place additional structure on the set of alternatives and then to require some sort of approximate, or what has become known as *virtual* implementation. I discuss this next.

# 4 Virtual Implementation

Virtual implementation works under the assumption that if one cannot exactly implement a desired correspondence, then one should be willing to implement a correspondence that is arbitrarily close to the desired one. In order to define what is meant by "close", we need additional structure on the set of alternatives. The way in which this has been done in the virtual implementation literature is to let A be the set lotteries over the some primitive set of alternatives. Then we can say that we are implementing something "close" to a desired alternative if we end up with a lottery that places sufficiently high probability on the desired alternative.

If we cannot Nash implement a correspondence we can ask whether there is a correspondence sufficiently close to it, in the lottery sense, that can be Nash implemented. More pragmatically, if a correspondence is not monotonic, is there a correspondence close to it that is monotonic? There is no reason to expect that the answer to this

 $<sup>^{19}</sup>A$  is a finite set and  $\mathcal{P}$  includes all strict preference orderings on A.

question should be yes. However, the work on virtual implementation has coupled this approximation question together with additional conditions. The answer turns out to be yes if one restricts attention to certain types of correspondences called "ordinal" ones, or if one restricts attention to situations where individuals' preferences have von Neumann-Morgenstern representations. Both of these additional conditions place significant structure on the problem as we shall see and discuss below.

Following with the literature on virtual implementation, let us assume in this section that there is some underlying set of alternatives A' that is finite, and that the set alternatives A is the set of lotteries on A'. More formally, let K denote the number of alternatives in A'. Then  $A = \{x \in [0, 1]^K s.t. \sum_k x_k = 1\}$ .

This structure on the set of alternatives allows us to define distance among two elements of A through Euclidean distance. This induces a notion of closeness of social choice correspondences:

Two social choice correspondences F and H are  $\epsilon$ -close if for every  $R \in \mathcal{P}$  there exists a bijection  $\tau : F(R) \to H(R)$  such that  $|a - \tau(a)| < \epsilon$  for each  $a \in F(R)$ .

So, two correspondences are  $\epsilon$ -close if for each preference profile there is a one-to-one mapping so that each lottery in one correspondence is within  $\epsilon$  of its corresponding lottery in the other correspondence. While this may seem like an innocuous definition, it may be that two lotteries that are  $\epsilon$  close to each other are not even roughly equivalent to a society that cares about ex-post realizations. This is a discussion that we will return to after seeing how this definition is used.

A social choice correspondence F is virtually implementable if there exists a social choice correspondence G that is  $\epsilon$ -close to F and is Nash implementable.<sup>20</sup>

We can now define the ordinality condition mentioned above.

Given a preference relation  $R_i$  on A, based on the comparison on pure outcomes (i.e., lotteries that provide probability 1 to some alternative), there is an induced preference relation on the set of underlying alternatives A'. For any  $R^i$ , denote this preference relation by  $R_p^i$ . In what follows, assume that  $R_p^i$  is a strict ordering.<sup>21</sup>

Let us say that F is  $ordinal^{22}$  if  $F(R) = F(\overline{R})$  whenever  $R_p^i = \overline{R}_p^i$  for all i.

A preference relation  $R^i$  is monotone if there exists an ordering of A',  $a_1, \ldots, a_K$ 

<sup>&</sup>lt;sup>20</sup>One can define other notions of virtual implementation by substituting some other solution concept in the place of Nash equilibrium.

<sup>&</sup>lt;sup>21</sup>This simplifies the exposition. One can weaken this somewhat, as should be clear in what follows, although one cannot allow for complete indifference. Details can be found in Abreu and Sen (1991).

<sup>&</sup>lt;sup>22</sup>Ordinal is a bit of a misnomer, as information contained in how preferences vary on A rather than just on A' is not cardinal information in the usual sense of a specific cardinal utility representation.

under  $R_p^i$  such that

- (i)  $a_1 P_n^i a_2 \cdots P_n^i a_K$ , and
- (ii) for any  $x \in A$  and  $y \in A$  such that  $\sum_{k \leq M} x_k \geq \sum_{k \leq M} y_k$  for any  $M \leq K$  and  $x \neq y$  then  $xR^iy$ .

Thus,  $R^i$  is monotone (not to be confused with monotonic) if a lottery that puts more weight on more preferred alternatives is preferred to one that puts comparatively less weight on more preferred alternatives.

Now we are ready to state a result that contains the main insight of the virtual implementation literature.

## **Theorem 3** (Matsushima (1988), Abreu and Sen (1991))

- Any ordinal social choice correspondence defined on a domain of monotone preferences is  $\epsilon$ -close to a social choice correspondence that satisfies monotonicity.
- Any social choice correspondence defined on a domain of von Neumann-Morgenstern preferences<sup>23</sup> is ε-close to a social choice correspondence that satisfies monotonicity.

Let me outline a proof for each of these results, as the ideas are fairly straightforward. A formal proof, although notationally heavy, can be easily fleshed out by the reader.

First, let  $\hat{c}$  be the lottery that places equal weight  $\frac{1}{K}$  on every alternative in A'. We construct G as follows. For any  $a \in A$  consider the lottery  $(1 - \epsilon)a + \epsilon \hat{c}$ . Transforming any lottery to this corresponding lottery we are sure to have an "interior" lottery, or one that puts weight on each alternative. This mapping defines a G that is  $\epsilon$ -close to F. The proof is completed by showing that given either of the restrictions, such an interior  $G^{24}$  is necessarily monotonic. Consider any R, and  $\overline{R}$ , and  $(1 - \epsilon)a + \epsilon \hat{c} \in G(R)$  such that  $(1 - \epsilon)a + \epsilon \hat{c} \notin G(\overline{R})$ . First let us treat the case where F is ordinal and preferences are monotone. Since  $G(R) \neq G(\overline{R})$ , it follows from the ordinality of F that we can

<sup>&</sup>lt;sup>23</sup>Here the social choice correspondence is defined on the domain of preferences and not on the domain of utility functions. If one wants to use the set of von Neumann-Morgenstern utility functions as the domain, then the social choice correspondence must be constant across utility functions that are affine transformations of each other.

<sup>&</sup>lt;sup>24</sup>The reader can check that the following argument is easily adaptable to show that any interior social choice correspondence is monotonic on these domains.

find i such that  $R_i^p \neq \overline{R}_p^i$ . So there are alternatives  $d \in A'$  and  $\overline{d} \in A'$  such that  $dP_p^i\overline{d}$  and  $\overline{dP}_p^id$ . From the definition of  $\widehat{c}$ , the lottery  $b = (1 - \epsilon)a + \epsilon \widehat{c} + \frac{1}{2K}\overline{d} - \frac{1}{2K}d^{25}$  is well-defined and in fact interior. Since preferences are monotone, it follows that  $(1 - \epsilon)a + \epsilon \widehat{c} P^i$  b and  $b \overline{P}^i (1 - \epsilon) + \epsilon \widehat{c}$ . Thus, G is monotonic.

For the case where preferences satisfy the von Neumann-Morgenstern axioms, the proof is quite similar. Note that if  $G(R) \neq G(\overline{R})$ , then there is some i for whom  $R_i \neq \overline{R_i}$ . Then, given the linearity of von Neumann-Morgenstern preferences, we can find lotteries  $e \in A$  and  $\overline{e} \in A$  such that  $eP_i\overline{e}$  and  $\overline{e}P_ie$ . This is pictured in the following figure for the case where A' consists of three alternatives.

[insert Figure 5 here]

Letting  $b = (1 - \epsilon)a + \epsilon \hat{c} + \frac{1}{2K}\overline{e} - \frac{1}{2K}e$  again fulfills the requirements to ensure that G is monotonic.

In this setting, given that every social choice correspondence satisfying suitable conditions is close to one that is monotonic, is any such social choice correspondence virtually implementable? The answer is yes when  $N \geq 3.^{26}$  One can easily modify the environment so that no veto power is always satisfied. Simply take A to be the set of all lotteries on A', but omitting each pure lottery (that places weight one on some alternative). Then no veto power is satisfied trivially, as there is no best lottery for any individual since with monotone preferences their favorite lottery is a pure lottery. The above theorem then leads to the following corollary.

Corollary 1 (Matsushima (1988), Abreu and Sen (1991)) Let  $N \geq 3$ . Any ordinal social choice correspondence defined on a domain of monotone preferences is virtually implementable. Any social choice correspondence defined on a domain of von Neumann-Morgenstern monotone preferences is virtually implementable.

While virtual implementation provides for a remarkable conclusion, it comes at the expense of strong assumptions.

First, in considering virtual implementation, one is implicitly assuming that society is willing to settle for implementing something that is  $\epsilon$ -close to the desired

 $<sup>\</sup>overline{\phantom{a}^{25}}$ Here d and  $\overline{d}$  represent the lotteries given weight one to d and  $\overline{d}$ . These convex combinations can be made directly as A is a Euclidean simplex.

 $<sup>^{26}</sup>$ For the case of N=2 one needs to add a non-empty lower intersection condition which corresponds to the extra condition needed for two-person Nash implementation. Details appear in Abreu and Sen (1991).

social choice correspondence. This raises the question of the ex-post rationality of virtual implementation.<sup>27</sup> Virtual implementation requires that we play with small probabilities on lotteries that may have nothing to do with the desired social choice correspondence, but can be used to distinguish preferences (the d's and e's in the above proof). In particular, with small probabilities these may turn out to be the outcome of the mechanism. In order for the virtual implementation arguments to be valid, agents must take these small probabilities seriously and base decisions on them, with full expectations that these outcomes will be enforced if they happen to be selected by the lottery. It is perfectly possible that an outcome which is bad for all agents is randomly selected, and the arguments underlying virtual implementation require that the agents cannot change this outcome (for example, by renegotiating to some other outcome).

Second, the assumptions of ordinality or of von Neumann-Morgenstern preferences are strong ones and critical to the arguments. Von Neumann-Morgenstern preferences are assumed in many economics models because of their nice linearity with respect to probabilities, which allows for a very tractable analysis. However, we should always be cautious in interpreting results that rely critically on that linearity, rather than just using it for tractability. In other words, if our results are robust to variations in the set of preferences then working with von Neumann-Morgenstern preferences for tractability's sake is fine. However, if the results depend in a special way on a restriction to the domain of von Neumann-Morgenstern preferences, then we should be cautious in applying the results. Arguably, virtual implementation relies critically on the linearity (or ordinality<sup>28</sup>) of preferences because it implies that the crossing conditions needed for monotonicity will be satisfied at all interior points! Once one allows for slight amounts of non-linearity in preferences over lotteries, then the crossing conditions are not automatically satisfied, and monotonicity once again becomes restrictive.

<sup>&</sup>lt;sup>27</sup>Many mechanisms for implementation can be criticized for the same reason. This applies to the mechanisms for subgame perfect and undominated Nash implementation presented in Section 6, and is something I discuss in more detail in Section 7.

<sup>&</sup>lt;sup>28</sup>Ordinality coupled with the monotone preference condition plays a similar role to the linearity. If  $F(R) \neq F(\overline{R})$ , then some agent's preferences must differ over at least two underlying alternatives in A'. Then at any interior lottery there must be a crossing of this agent's indifference curves, as substituting a slight amount of one of these two underlying alternatives for the other will be ranked in opposite ways by the two preferences.

# 5 Refinements

Another avenue in the theory is implementation under various refinements of Nash equilibrium.<sup>29</sup> As we saw in the Nash implementation theorems, it is easy to ensure that a given desired outcome is an equilibrium outcome while it is difficult to rule out undesired equilibria. This is where the necessity of the monotonicity condition arises and what limits our ability to implement. Looking at refinements helps in ruling out undesired equilibria and leads to more permissive results. However, with such additional power will come some cautions about how the refinements are exploited.

Let us begin with a discussion of implementation in undominated Nash equilibrium, as was first explored by Palfrey and Srivastava (1991). This is a simple and natural refinement of Nash equilibrium, that adds to Nash equilibrium the requirement that no individual play a weakly dominated strategy.<sup>30</sup> This solution concept is also useful for illustrating the power of implementation via a refinement of Nash implementation, and some of the cautions that go along with it.

Given a mechanism (M,g), an individual i, and a preference relation for i,  $R_i$ , a message  $m_i \in M_i$  is weakly dominated by  $\overline{m}_i \in M_i$  at  $R_i$  if  $g(\overline{m}_i, m_{-i})R_ig(m_i, m_{-i})$  for all  $m_{-i} \in M_{-i}$  and  $g(\overline{m}_i, m_{-i})P_ig(m_i, m_{-i})$  for some  $m_{-i} \in M_{-i}$ . A message  $m_i \in M_i$  is undominated at  $R_i$  if there is no other message which weakly dominates it. Let

$$UD(M, g, R) = \{m \mid m_i \text{ is undominated at } R_i \ \forall i\}.$$

A profile of messages  $m \in M$  is an undominated Nash equilibrium of (M, g) at  $R \in \mathcal{P}$  if  $m \in NE(M, g, R) \cap UD(M, g, R)$ . So let  $UNE(M, g, R) = NE(M, g, R) \cap UD(M, g, R)$ .

The definition of undominated Nash implementation is then that  $F(R) = O_{UNE}(M, g, R)$  for all  $R \in \mathcal{P}$ .

In order to keep the discussion of undominated Nash implementation relatively uncluttered, let us impose the following assumption on the domain of preferences. A

<sup>&</sup>lt;sup>29</sup>When I use the word refinements, I use it literally to mean a solution concept which always selects a subset of Nash equilibria, such as undominated Nash equilibrium, subgame perfect equilibrium, coalition-proof Nash equilibrium, strong equilibrium, and trembling hand perfect equilibrium. Implementation in other solution concepts that are not refinements of Nash equilibrium, such as protective equilibrium or iterative elimination of weakly dominated strategies also appear in the literature (e.g., Barbera and Dutta (1982) and Abreu and Matsushima (1994)), but are not discussed here.

<sup>&</sup>lt;sup>30</sup>Such equilibria are a superset of trembling hand perfect equilibria (except for N=2 where they coincide, see van Damme (1987)), and thus have nice existence properties, but also have the advantage being easier to define and work with in such abstract environments as arise in the implementation literature.

slightly weaker value distinction condition appears in Palfrey and Srivastava (1991), and the reader is referred there for details. This condition allows us to provide a unified exposition of a number of results.

Strict Value Distinction The domain  $\mathcal{P}$  satisfies strict value distinction if for every  $R \in \mathcal{P}$  and  $\overline{R} \in P$  with  $\overline{R} \neq R$ :

- (I) For all i, there exists  $a \in A$  and  $b \in A$  such that  $aP_ib$ ,
- (II) For all i, if  $R \neq \overline{R}_i$  there exists  $a \in A$  and  $b \in A$  such that  $aP_ib$  and  $b\overline{P}_ia$ .
- (I) simply rules out complete indifference, and (II) says that if an individual's preferences change, then they change in a non-trivial way so that some alternatives switch ranking (rather than just becoming indifferent). This preference restriction is satisfied on a domain of strict preferences (linear orders), but is also satisfied in settings where preferences are upper-semi continuous and locally non-satiated<sup>31</sup> and so applies to almost any setting of interest.

**Theorem 4** (Palfrey and Srivastava (1991)) If  $N \geq 3$  and strict value distinction is satisfied, then any social choice correspondence that satisfies no veto power is implementable in undominated Nash equilibrium.

The contrast of this theorem with Theorem 2 is dramatic, as any social choice correspondence in economic settings as well as most voting rules are admitted. The refinement to undominated Nash equilibrium has thus made a big difference in which social choice correspondences are implementable, completely eliminating the necessity of monotonicity. The main intuition is that any switch in preferences (one is guaranteed to exist by value distinction) can be used to change the set of strategies that are undominated from one state to another. The central difficulty in Nash implementation that is handled by the monotonicity condition is that there can be an alternative a that one wants to be a Nash equilibrium outcome in one state but not in another state. So one needs a preference reversal between a and some other alternative b that can be obtained through a deviation. When one considers undominated Nash implementation, one instead needs a to be supported as an undominated Nash equilibrium outcome in one state a but not in another a. Let a be an undominated Nash equilibrium message profile at a of some mechanism. In order to rule a out as an undominated Nash equilibrium or

 $<sup>^{31}\</sup>mathrm{See}$  Jackson (1992) for a proof.

some  $m^i$  is weakly dominated at  $\overline{R}^i$  (while it was undominated at  $R^i$ ). One can assure that  $m^i$  is weakly dominated at  $\overline{R}^i$  and not at  $R^i$ , simply by taking advantage of any difference in the preferences between  $R^i$  and  $\overline{R}^i$ . Of course, one has to be careful in working out the details so that such differences are accounted for in each state while still producing the desired undominated Nash equilibria in each state, which results in a complex mechanism.

The idea that domination arguments can take advantage of relatively slight differences in preferences,<sup>32</sup> can be pushed further. In fact an even more permissive theorem holds with a weaker solution concept. We can drop no veto power, weaken the solution concept to undominated strategies, and include the case of N = 2.

**Theorem 5** (Jackson (1992)) If strict value distinction is satisfied, then any social choice correspondence is implementable in undominated strategies.

The proof of each of these theorems involves mechanisms that are quite intricate. The underlying principles are similar to that of the mechanism used to prove Theorem 2: if there is agreement in the announcements then the outcome is implemented (as in (1) in the mechanism proving Theorem 2), there is a possibility for some individuals to deviate and allow for some "test" pair of alternatives which serve the role of changing which strategies are weakly dominated, and there is some use of an integer game (as in (3)) to rule out certain undesired configurations of strategies. However, the mechanisms are more complex in terms of how and when the test pairs apply in order to take advantage of weak dominance arguments. Rather than exhaust the reader with the details of the mechanisms, I present a simple example that illustrates an implementing mechanism for Theorem 5 in a specific case. The example is also useful for another purpose: it points out a serious caveat that we should have regarding implementing mechanisms.

# Example 4. (Jackson (1992))

Let N=2 and  $A=\{a,b\}$ .  $R_1=R_2$  is such that  $aP_ib$ , and  $\overline{R}_1$  is such that  $b\overline{P}_1a$ .

Consider  $F(R_1, R_2) = \{b\}$  and  $F(\overline{R}_1, R_2) = \{a\}$ . This is a peculiar social choice correspondence as it goes exactly against the preferences of the agents. But it is then convincing<sup>33</sup> that if we can implement this social choice correspondence then we can implement any social choice correspondence. The following mechanism does the trick.

<sup>&</sup>lt;sup>32</sup>You may notice some analogies to way in which slight differences in preferences over lotteries are expoited by virtual implementation. The same criticisms regarding the ex-post rationality of enforcing the outcomes can be made, and I discuss this in more detail below.

<sup>&</sup>lt;sup>33</sup>The hard-to-convince reader is referred to Jackson (1992) for the proof of Theorem 5.

```
m^1
           a
                a
                       a
                                        b
      b
           a
                a
           b
                                        b
      h
                a
                b
\overline{m}^1
                b
                                 a b b b
           a
                a
      a
                                  a a b b
      a
                a
                                       a b b
                                  a a
      a
```

In this table, the  $\cdots$  and  $\vdots$  indicate a countable continuation of the series of entries and corresponding strategies.<sup>34</sup> Let us check that the mechanism implements the stated social choice correspondence. First,  $m^2$  is undominated for 2 since it is the only strategy that results in a against  $\overline{m}^1$ . Second, any strategy in the right half of the mechanism for individual 2 is dominated by individual 2's strategy  $\widetilde{m}^2$ . Next,  $\widetilde{m}^2$  is dominated by  $\widehat{m}^2$ . Next,  $\widehat{m}^2$  is dominated by the strategy immediately to its right; and so forth. This leaves  $m^2$  as the only undominated strategy for individual 2. A similar analysis for player 1 leads to a unique undominated strategy of  $m^1$  at  $R^1$ , and of  $\overline{m}^1$  at  $\overline{R}^1$ . Thus, the mechanism implements the stated F.

The elimination of dominated strategies is a questionable practice in the above mechanism. For instance, in the sequence  $\widetilde{m}^2$ ,  $\widehat{m}^2$ , ..., each strategy is eliminated by the next, but there is no undominated or 'best' strategy in that string. We end up predicting that individual 2 will not play any of these strategies, but will play  $m^2$  instead, even though it does worse in some situations than any of the eliminated strategies. <sup>35</sup>

 $<sup>^{34}</sup>$ Each individual here has a message set that is divided into two sets that are both countably infinite. So for instance,  $m^2$  gets b against every message in 1's first set and a against every message in 1's second set.

<sup>&</sup>lt;sup>35</sup>As an aside, the use of the integer game in the mechanism used for Nash implementation (i.e., proving Theorem 2) may have bothered you. As no domination arguments were used there, the issues are slightly different than that in Example 4. However, the integer game used in proving Theorem 2 had a similar feature in that it could produce situations where agents have no best response (i.e.,

As shown in Jackson (1992) this is not simply a problem when dealing with implementation in undominated strategies, but also holds for undominated Nash implementation. This example can be modified to have three individuals and implement essentially the same social choice function in undominated Nash equilibrium, via a mechanism with similar difficulties. Moreover, in each of the examples the same is true of every implementing mechanism.

To address the questionable removal of dominated strategies in Example 4, we can rule out the use of such mechanisms by requiring that the implementing mechanism be bounded. This requires that when a strategy is dominated, it be dominated by some undominated strategy.<sup>36</sup>

#### **Bounded Mechanisms**

A mechanism (M, g) is bounded relative to  $\mathcal{P}$  if for every i and  $R \in P$ , whenever  $m_i \in M_i$  is dominated at  $R_i$ , then it is dominated by some message  $\overline{m}_i \in M_i$  that is undominated at  $R_i$ .

This definition makes reference to the preference domain, and so boundedness is a condition relative to an environment. A finite mechanism is bounded regardless of the environment due to the transitivity of the domination relation. However, an infinite mechanism's boundedness property may depend on the domain of preferences in question.

If we require implementation via a bounded mechanism, then Theorem 5 no longer holds and necessary conditions arise.

F is strategy-resistant if for all  $i, R \in \mathcal{P}$  and  $\overline{R}_i$  such that  $(\overline{R}_i, R_{-i}) \in \mathcal{P}$  and for each  $b \in F(\overline{R}_i, R_{-i})$ , there exists  $a \in F(R)$  (possibly a = b) such that  $aR_ib$ .

This condition has a flavor of strategy-proofness, but as defined for correspondences. If we think of i at R, considering a manipulation by acting in accordance with  $\overline{R}_i$ , we find that for whatever outcome i may hope for  $b \in F(\overline{R}_i, R_{-i})$ , there is some outcome  $a \in F(R)$  which is at least as good as b. This condition is very strong: it reduces to strategy-proofness when F is a function.

The following theorem illustrates the impact of requiring boundedness in implementation via undominated strategies.

if they have beliefs that have positive probability that some other individual will use any integer). I will return to discuss this issue after discussing the domination issues.

<sup>&</sup>lt;sup>36</sup>An alternative approach, would be to modify the concept of domination so weakly dominated strategies are eliminated only if they are dominated by some undominated strategy. (Timothy Van Zandt suggested this alternative approach in a discussion of Jackson (1992).) As is easily seen from the proof of Theorem 6, the same restrictions on implementation ensue with either approach.

**Theorem 6** (Jackson (1992)) If a social choice correspondence is implementable in undominated strategies via a bounded mechanism, then it is strategy-resistant.

The proof of this theorem is quite easy. Let F be implemented in undominated strategies via the bounded mechanism (M,g). Consider  $i, R \in \mathcal{P}$  and  $\overline{R}_i$  such that  $(\overline{R}_i, R_{-i}) \in \mathcal{P}$  and consider any  $b \in F(\overline{R}_i, R_{-i})$ . Since F is implemented, there exists  $\overline{m} \in UD(M, g, \overline{R}_i, R_{-i})$  such that  $g(\overline{m}) = b$ . Either  $b \in F(R)$ , in which case let a = b, or it must be that  $\overline{m}_i$  is dominated by some  $\widetilde{m}_i$  that is undominated at  $R_i$ . Let  $a = g(\widetilde{m}_i, \overline{m}_{-i})$ . Since  $(\widetilde{m}_i, \overline{m}_{-i})$  is undominated at R, it follows that  $a \in F(R)$ , and from the definition of domination, it follows that that  $aR_ib$ .

Thus, we end up with a stark contrast between what is implementable in undominated strategies when we can use any mechanism and when we can only use bounded mechanisms. This suggests it is very important to understand the restrictions imposed by considering only mechanisms for which a given solution concept is appropriate.

Boundedness ends up restricting the class of social choice correspondences that are implementable in undominated Nash equilibrium as well. That is studied in Jackson, Palfrey, and Srivastava (1994). It turns out to introduce a necessary condition (the chained condition) that is weaker than monotonicity and strategy-resistance, but nonetheless rules out some well-known correspondences. The reader is referred to that paper for details.

While boundedness is a condition that is natural to require when we examine elimination of dominated strategies, or solution concepts like undominated Nash equilibrium or iterative elimination of weakly dominated strategies, it is not an obvious condition to require when considering Nash equilibrium, or subgame perfect equilibrium, where the elimination of dominated strategies is never an issue. However, there are conditions that one might like to impose on mechanisms so that such solution concepts are reasonable.

#### Mixed Strategies

The definition of Nash equilibrium that we worked with in proving Theorem 2, does not consider mixed strategies. Even giving a proper definition of mixed strategy equilibrium requires additional structure as preferences have to be defined over lotteries on alternatives, and since message spaces may be uncountably infinite one has to take care. Without tackling these technical issues, let us consider an example that shows that worrying about the possibility of mixed-strategy equilibria makes a difference.

What we can show is that if one Nash implements a social choice correspondence by a finite mechanism, then there may still exist mixed strategy Nash equilibria that result in outcomes outside of the social choice correspondence and which may be preferable from the individuals' perspectives.

## Example 5. (Jackson (1992))

Let N=2 and  $A=\{a,b,c,d\}$ . Preferences are described by  $aP^1bP^1cI^1d$  (where  $I^1$  indicates indifference),  $aP^2bP^2cP^2d$  and  $b\overline{P}^2a\overline{P}^2c\overline{I}^2d$ .

Consider F such that  $F(R_1, R_2) = \{a\}$  and  $F(R_1, \overline{R}_2) = \{d\}$ . F is Nash implemented by the following mechanism.

$$m^2$$
  $\widehat{m}^2$   $\widetilde{m}^2$ 
 $m^1$   $d$   $c$   $c$ 
 $\widehat{m}^1$   $d$   $a$   $b$ 
 $\widetilde{m}^1$   $d$   $b$   $a$ 

Note however, that at  $(R^1, \overline{R}^2)$  for most definitions of preferences over lotteries, there also exists a mixed strategy equilibrium that results in a and b with positive probability. This is true for every finite implementing mechanism.

Claim 1. Suppose that players' preferences over lotteries on A are continuous, convex, and monotone. Any mechanism with a finite number of strategies for each player has a Nash equilibrium in mixed strategies at  $R^1, \overline{R}^2$  resulting in outcomes a or b with positive probability, and which strictly Pareto dominates the outcome d.

The proof of the claim is simple. Suppose that a mechanism (M,g) Nash implements F. Consider  $\widehat{M}^i \subset M^i$  such that  $\widehat{m}^i \in \widehat{M}^i$  implies that there exists  $\widehat{m}^{-i}$  such that  $g(\widehat{m}) \in \{a,b\}$ . Thus,  $\widehat{M}^i$  is found by eliminating strategies that can only ever lead to c or d. Since F is implemented, there must be some strategy profile  $\widehat{m}$  such that  $g(\widehat{m}) = a$ , and so  $\widehat{M}$  is non-empty. Given the assumptions on preferences and the finiteness of the mechanism, there exists a Nash equilibrium in mixed strategies to  $(\widehat{M},g)$  at  $R^1,\overline{R}^2$ . Given the definition of  $\widehat{M}$  and the fact that preferences on lotteries are monotone, it follows that this equilibrium must put positive probability on at least one of the outcomes a and b, as these are reachable by some strategy of 1 given any (mixed) strategy of 2, and are preferred by 1 to c and d over which 1 is indifferent. Note that  $\widehat{m}$  is then also a Nash equilibrium of (M,g) at  $R^1,\overline{R}^2$  since strategies in  $M^i\setminus\widehat{M}^i$  only lead to c or d and cannot provide improving deviations. This establishes the claim.

The above claim shows that the standard definition of Nash implementation that only considers pure strategies can be a problematic one. Let me make two remarks about the above example.

First, the social choice correspondence that is being implemented is a bit strange in that we are trying to implement d when it is a least preferred outcome for both of the individuals. However, this might be quite natural in the context of a problem such as a principal/multiple-agent problem, where the two individuals above represent the agents and the principal designs the mechanism and prefers that the agents take actions leading to outcome a in the first state and d in the second state.

Second, the finiteness of the mechanism is critical to the result. If we allowed for infinite mechanisms, then we could ensure that there are no mixed strategy equilibria, by employing an integer game.<sup>37</sup> Maskin (1999) shows that one can design a mechanism for Nash implementation that has no mixed strategy equilibria (see the appendix of his article); but his mechanism involves an integer game and thus an infinite message space. This example shows that there are correspondences in finite settings that are Nash implementable when one only considers pure strategies, but not Nash implementable (except by infinite mechanisms) when one allows for mixed strategies.

For this example, it is natural to require finite mechanisms as the setting is completely finite. However, many settings of interest are naturally infinite and so requiring implementation in finite mechanisms might not always make sense. So one might ask what the correct restriction on mechanisms is for Nash implementation if one accounts for mixed strategies. What is bothersome about integer games is that although there is no Nash equilibrium to them, players could very well try to announce higher integers than others in the hopes that they will get their most-preferred alternative. We have no prediction for how a player will act if he or she believed that the other players would be announcing integers. A player's best response correspondence is not well-defined when that player faces a mixed strategy of the others that places weight on an infinite set of integers. So, one way to rule this out is to look only at mechanisms for which best response correspondences are well-defined. Jackson, Palfrey, and Srivastava (1994) suggest such a requirement, calling it the "best response property." The best response property is satisfied by any finite mechanism and also by many infinite mechanism experience.

<sup>&</sup>lt;sup>37</sup>We saw such a construction in the mechanism used to prove Theorem 2. Under (3), the outcome was that announced by the agent who named the highest integer. Clearly as long as there is some disagreement over most preferred outcomes, then there is no equilibrium in (pure or) mixed strategies to the integer game.

anisms. Nevertheless, it is a strong condition and rules out some mechanisms that are well-behaved in the way that they either admit or rule out mixed strategy equilibria.

The same point regarding mixed strategies in this example that was made in Claim 1 above, can be made with regards to subgame perfect implementation.<sup>38</sup>

Claim 2. Suppose that players' preferences over lotteries on A are continuous, convex, and monotone. Any extensive form mechanism<sup>39</sup> that has a finite number of terminal nodes and that implements F, has a subgame perfect equilibrium in mixed strategies at  $R^1, \overline{R}^2$  which results in outcomes a or b with positive probability and which strictly Pareto dominates the outcome d.

The proof of Claim 2 is similar to that of Claim 1. We first need to trim the tree to obtain a game form like  $(\widehat{M}, g)$  in the previous proof. In the extensive form this is a bit trickier, but the finiteness allows us to do this inductively. Start with information sets that only precede terminal nodes, and eliminate actions that only lead to c or d at those information sets. If all actions are eliminated, the replace the information set with terminal nodes that lead to d. Next, proceed to information sets that lead to either terminal nodes or information sets considered in the first step, and perform the same trimming. Proceed inductively until the root is reached. Find a subgame perfect equilibrium of the remaining extensive form. It must lead to a or b with positive probability. Then construct a subgame perfect equilibrium of the original game form leading to the same outcomes, by picking any action at information sets that were completely eliminated in the trimming procedure. This then establishes the claim.

The difficulties with mixed strategies pointed out in the claims above, can be attacked from different directions. One approach to handling this problem is to examine virtual implementation to see if the difficulties can be avoided there. Abreu and Matsushima (1992a) have analyzed virtual implementation via the iterative elimination of strictly dominated strategies. Since the set of Nash equilibria (pure or mixed) has support in the set of strategies that survives the iterative elimination of strictly dominated strategies, if one obtains a unique profile of actions via the iterative elimination

<sup>&</sup>lt;sup>38</sup>Moore and Repullo (1988) provide a mechanism for subgame perfect implementation that has no mixed strategy equilibria. However their mechanism also employs an integer game and fails the best response property.

<sup>&</sup>lt;sup>39</sup>The definition of extensive form mechanism is the same as that of an extensive form game, except that there is an outcome associated with each terminal node rather than a payoff. As the definition is standard, available in most any game theory text, and notationally cumbersome, I omit it here.

of strictly dominated strategies, then there must be a unique Nash equilibrium (even considering mixed strategies). Abreu and Matsushima show that with three or more individuals, any social choice function is virtually implementable in iteratively undominated strategies by a finite mechanism. Their construction of an implementing mechanism is very clever and quite intuitive. I refer the reader to their paper for details. While they obtain a powerful result handling mixed strategies, it comes at the expense of the strength of the assumptions in the virtual implementation setting (as discussed above).<sup>40</sup>

# 6 Specific Environments

Another approach to accounting for mixed strategies, and also to providing implementation by mechanisms that are bounded/and or simple and natural in other ways, is to examine implementation in specific environments. Part of the reason that the mechanisms used in the sufficiency theorems are so abstract and complicated is that they implement a given social choice correspondence without using any detailed information about the specific restrictions on preferences that may be satisfied in an environment. If we take advantage of knowledge about the structure of the environment, the implementation problem can be simplified.

One important class of environments to be considered is that of economic environments where there is a private good. In such environments there is a disagreement between agents' preferences that avoids problems associated with unanimity - each agent prefers to have more of the private good. Also, there is some possibility of imposing "fines" or punishments that are agent specific. Let us examine two results on implementation in such settings that employ simple and intuitive mechanisms that are bounded and handle mixed strategies. The first such result applies to undominated Nash implementation and environments that are called separable.

### Separable Environments

- (1) there exists  $w \in A$  such that  $aP^iw$  for all  $i, R \in \mathcal{P}$ , and  $a \in F(R)$ ,
- (2) for any  $a \in A$ ,  $J \subset N$ , and  $R \in \mathcal{P}$ , there exists  $a^J$  such that  $a^J I^i w$  for any  $i \in J$  and  $a^J I^i a$  for  $i \notin J$ ,

<sup>&</sup>lt;sup>40</sup>Glazer and Rosenthal (1992) criticize the Abreu and Matsushima mechanisms on complexity grounds and Abreu and Matsushima (1992c) offer a reply.

- (3)  $R^i \neq \overline{R}^i$  implies that there exist a and b such that  $aP^ibP^iw$  and  $b\overline{P}^ia\overline{P}^iw$ .
- (1) is a requirement that there is an outcome that each agent considers to be worse than any alternative in the range of the social choice correspondence. (This means that the definition of a separable environment is relative to a given social choice correspondence.) For instance, in an exchange economy this would be satisfied by setting w to be the 0 allocation, provided the social choice correspondence leaves each agent with some minimal consumption in every state. (2) is the requirement that captures the separable nature of the environment. It states that it is possible to reduce the allocations of some set of individuals J while not affecting the remaining individuals. This is satisfied in exchange economies that satisfy free disposal, as well as other settings such as those with public goods and/or externalities provided there is at least one disposable private good that agents value sufficiently. (3) is a version of strict value distinction again, with the additional requirement that the test pair of alternatives (a and b) be preferred to the bad outcome. Again, it is satisfied in many economic settings.

**Theorem 7** (Jackson, Palfrey, and Srivastava (1994), Sjöström (1994)<sup>41</sup>) If the environment is separable relative to a social choice function F, then F is implementable in undominated Nash equilibrium by a bounded mechanism that has no mixed strategy equilibria.

Theorem 7 is proven using the following mechanism.

Each individual i announces either a pair of preference relations  $m^i = (R^i, R^{i+1})$  (interpreted as being an announcement i and i + 1's preferences respectively, letting N + 1 = 1), or a pair of alternatives  $m^i = (a, b)$ . There are three cases to consider.

- (I) All individuals announce pairs of preferences. In this case, let J be the set of i such that  $m_2^i = m_1^{i+1}$ . This is the set of i whose announcement about i+1 matched what i+1 announced about him or herself. The outcome is then  $[F(m_2)]^J$ . <sup>42</sup>
- (II) Some i announces  $m^i=(R^i,R^{i+1})$  and all other  $j\neq i$  announce  $m^j=(a,b)$  such that  $aR^iw$  and  $bR^iw$  (with all  $j\neq i$  announcing the same (a,b)). Then  $g(m)=a^{N-i}$  if  $aR^ib$  and  $g(m)=b^{N-i}$  otherwise.

<sup>&</sup>lt;sup>41</sup>The definition of separable environments is from Jackson, Palfrey, and Srivastava (1994). Although Sjöström's (1994) setting is slightly different, the intuition behind his mechanism is identical.

 $<sup>^{42}</sup>$ So this is the outcome where individuals in J get F evaluated at the R corresponding to that in the second entry of each agent's message (what they announced about their neighbor), and individuals outside of J get an outcome equivalent to the bad outcome w.

(III) For any other configuration of messages g(m) = w.

Since an individual's announcement about his or her preferences can only affect his or her allocation in (II), it is clear that the only undominated announcement of preferences is to announce one's own preference truthfully. Also, since by announcing a pair of alternatives one always obtains an alternative equivalent to w, any announcement of a pair of alternatives is dominated by a truthful announcement of preferences. Finally, given that all individuals should be announcing pairs of preferences, and announcing their own truthfully, it then follows from (I) that each individual should announce their neighbor's preference truthfully. This is the unique undominated Nash equilibrium. The mechanism is bounded because the dominated actions were dominated by undominated actions.

Thus, in this separable class of environments we can obtain a strong implementation result with a relatively simple bounded mechanism. Before discussing some of the shortcomings of the mechanism above, let me discuss a closely related setting and mechanism for implementation in subgame perfect equilibrium.

A special case of separable environments is that of quasi-linear preferences. That setting allows for a simple, clean, and intuitive implementation in subgame perfect equilibrium.

Let us say that an environment has quasi-linear preferences that are representable by bounded utility functions if there exists A' such that

(1) 
$$A = \{(a, t^1, \dots, t^N) \in A' \times \mathbb{R}^N \mid \sum_i t^i \leq 0\}, \text{ and }$$

(2) each 
$$R^i$$
 is represented by a utility function  $u^i: A' \to [0,1]$  such that  $(a,t^1,\ldots,t^N)$   $R^i$   $(b,\overline{t}^1,\ldots,\overline{t}^N)$  if and only if  $u^i(a)+t^i\geq u^i(b)+\overline{t}^i$ .

Condition (1) says that allocations can be written as a product space of some primitive allocations as well as a vector of private transfers. Note that the transfers are freely disposable since  $\sum_i t^i \leq 0$ . Condition (2) states that preferences are representable by a bounded quasi-linear utility function.

Let us consider social choice functions for which F(R) = (a, 0, ..., 0) for every  $R \in \mathcal{P}$ . This is almost without loss of generality, since A' is arbitrary and if one wishes to specify transfers that do not sum to 0, for instance specifying the sharing of the cost of a public good as a function of R, then this can be included in the specification of A' and the  $t^i$ 's can be thought of as additional transfers. The only loss of generality

comes from condition (2) above, which implies that any transfers included in A' must be bounded in size. This bound is needed for the implementing mechanism below to function.

**Theorem 8** (Moore and Repullo (1988)) Consider an environment with a finite number of states, quasi-linear preferences represented by utility functions that are bounded, and N=2. Any social choice function is implementable in subgame perfect equilibrium by an extensive game form of perfect information of finite length that has no mixed strategy equilibria.

Although the theorem is stated for N=2, the mechanism below can be extended to N>2 (see Moore and Repullo (1988) and Moore (1992) for details).

Theorem 8 is established through the mechanism pictured below. To understand the mechanism we note two points. First, the reader can easily check that for any quasilinear utility functions on A',  $u^i$  and  $v^i$  that represent different preferences on A, we can find  $(a,t^i)$  and  $(b,\overline{t}^i)$  such that  $u^i(a)+t^i>u^i(b)+\overline{t}^i$  while  $v^i(a)+t^i< v^i(b)+\overline{t}^i$ . Thus, in the challenge phase of the mechanism pictured below, if agent i has announced  $v^i$  and is challenged by the other agent who counters with  $v^i$ , then such a pair is invoked. Second, we can rewrite the social choice function to be a map from profiles of bounded utility functions on A' into allocations. So, the implemented social choice function can be written to depend directly on the announcements of  $u^1$  and  $u^2$ .

# [Insert Figure 6 here.]

The intuition behind the mechanism is straightforward. Suppose that the true profile of preferences corresponds to  $(u^1, u^2)$ . If 1 announces a false preference  $v^1$  instead of  $u^1$ , then individual 2 can challenge 1 and say  $u^1$ . If 1 is challenged then 1 will end up paying a large fine no matter occurs in the sequel. 1 is then offered a choice between the  $(a, t^i)$  and  $(b, \overline{t}^i)$  that distinguish  $u^1$  and  $v^1$ . 1 will choose honestly, as this is the end of the tree and 1 pays a fine regardless of the choice. If 1 chooses  $(a, t^i)$  then this indicates that 1 was not truthful in the first stage, and so 2 is rewarded by receiving the fine that 1 pays. If 1 chooses  $(b, \overline{t}^i)$  then this indicates that 2 was not truthful ( either in challenging or in 2's announcement of  $u^1$ ) and then 2 also pays a fine. This fine is sufficiently large (outweighing any implemented allocation) that 2 would like to challenge 1 if 1 lies, and not otherwise. The same reasoning applies to the other section of the tree and so the unique subgame perfect equilibrium outcome is

for both individuals to announce utility functions that represent their true preferences and so the correct outcome is implemented.<sup>43</sup>

While the results in this section have very optimistic implications, they come at the expense of strong restrictions. Most importantly, one of the criticisms made of virtual implementation - that it may not be credible to believe that bad outcomes will stand - is also particularly important here. In both of the mechanisms above there is some "bad" outcome (w in the undominated Nash implementation and a fine large enough to outweigh all other considerations in the subgame perfect implementation) and the mechanisms need to commit to these bad outcomes in order to sustain the implementation. There are papers that address this shortcoming, which I discuss below.

Finally, while the mechanisms above are relatively simple and intuitive, bounded, and avoid mixed strategy equilibria; the mechanisms are still cumbersome in the sense that they require announcements of preferences (or utility functions). Thus, although they are well-behaved in a theoretical sense they are still far from "natural" in the sense that they could be easily used in practice. So, although they are useful in delineating the boundary of what can be implemented, we should want to push further to require implementation by a mechanism with a simple or natural message space. <sup>44</sup> By adding even more structure to the problem, one can obtain natural mechanisms with simple action spaces. The tractability of specific environments for obtaining intuitive simple mechanisms for implementation has been taken advantage of in allotment, bargaining, voting, principle agent, and public goods environments in a series of papers. <sup>45</sup> The implementing mechanisms that are obtained often have auction and voting like features that make them very simple and natural.

One specific environment that has received a great deal of attention in the imple-

<sup>&</sup>lt;sup>43</sup>The finiteness of the state space is important in guaranteeing existence of equilibrium, as it ensures that there exists a well-defined best response of the "challenging" agent in the challenging subgames.

<sup>&</sup>lt;sup>44</sup>One approach to addressing the complexity of announcements of the mechanism is to examine the dimensionality of the message spaces and look for mechanisms with minimal sized message spaces and to establish lower bounds on what is necessary for implementation in various environments. For explicit discussion of such considerations see the seminal paper of Mount and Reiter (1974), as well as papers focussing on this issue in implementation such as Reichelstein and Reiter (1988), Saijo (1988), and Hong and Page (1994).

<sup>&</sup>lt;sup>45</sup>See, for example, Glazer and Ma (1989), Jackson and Moulin (1992), Rubinstein and Wolinsky (1992), Dutta and Sen (1993), Glover (1993), Thomson (1994), Bag (1996, 1997), Jackson and Palfrey (1998a), and Brusco and Jackson (1999).

mentation literature is that of the exchange of private goods, and the implementability of the constrained Walrasian correspondence.<sup>46</sup> Within this context one can examine implementation with respect to certain message spaces. Can the constrained Walrasian correspondence be implemented by mechanisms that only involve announcements of prices and quantities or announcements of prices and allocations? These questions and others are addressed in recent papers by Saijo, Tatamitani and Yamato (1996), Dutta, Sen and Vohra (1995), and Sjöström (1995b), which map out exactly what sorts of message spaces are needed for Nash implementation of the Walrasian correspondence.

# 7 Other Topics and Open Questions

While the discussion of implementation theory above exposes the reader to some of the results, techniques, and themes in the literature, there is a substantial portion of the literature that I have not discussed. In this section I briefly discuss some of the issues that are addressed in the rest of the literature as well as some interesting open problems.

## Implementation under Incomplete Information

There is an extensive literature on implementation when individuals hold private information. Nash implementation has a natural analog in such settings which is referred to as Bayesian implementation.<sup>47</sup> The reasoning behind the necessity of monotonicity for Nash implementation extends to provide an analogous necessary condition for Bayesian implementation that has been called Bayesian monotonicity in the literature (e.g., see Postlewaite and Schmeidler (1986), Palfrey and Srivastava (1989a), and Jackson (1991)<sup>48</sup>). The incomplete information setting also introduces a necessary incentive compatibility condition. As we know from the mechanism design literature, incentive compatibility conditions can turn out to be quite restrictive, rendering many efficient

<sup>&</sup>lt;sup>46</sup>The large literature on this subject begins with Hurwicz (1972), and includes papers that provide increasingly well-behaved mechanisms worrying about auxiliary properties of the mechanism like continuity of the outcome function, individual rationality, and balance out of equilibrium. See for example, Schmeidler (1980), Hurwicz, Maskin and Postlewaite (1995), Wettstein (1992), Nakamura (1990), and Hurwicz (1996).

<sup>&</sup>lt;sup>47</sup>Bayesian implementation may be seen as a generalization of Nash implementation, as it reduces to Nash implementation in situations where agents are symmetrically informed.

<sup>&</sup>lt;sup>48</sup>How one defines the setting and the Bayesian monotonicity condition is important for identifying a condition which is both necessary and sufficient for implementation. See Jackson (1991) for a discussion of this point.

and desirable social choice functions non-implementable.<sup>49</sup> While the necessity of an incentive compatibility and a Bayesian monotonicity condition would be expected<sup>50</sup>, the Bayesian setting also introduces new considerations that render the task of finding sufficient conditions significantly more complex than in the complete information setting.<sup>51</sup> For instance, one cannot state a direct analog of Theorem 2 in a Bayesian environment. In particular, a no-veto style condition and Bayesian monotonicity need to be carefully intertwined respecting the information structure, as discussed in Jackson (1991).<sup>52</sup>

While progress has been made in understanding the conditions that characterize Bayesian implementation, the full implications of the Bayesian monotonicity condition and the extent to which it may be satisfied are still less well understood. Palfrey and Srivastava (1987, 1993) make significant headway in showing that many analyses in mechanism design and agency theory that use incentive compatibility and invoke the revelation principle suffer from multiple equilibrium problems and the identified social choice functions fail to satisfy Bayesian monotonicity condition. They also show that in environments with transferable utility the conditions for Bayesian implementation are more easily satisfied.<sup>53</sup> A recent paper by Serrano and Vohra (1999) sheds more light on the restrictiveness of Bayesian implementation by showing that Bayesian monotonicity is essentially an ordinal condition, and so implemented social choice correspondences must be constant across different cardinal representations of underlying ordinal preferences. What is left open is a detailed understanding of what can be implemented in non-transferable utility settings when we worry not only about incentive compatibility, but also about full implementation and thus the multiple equilibrium problem and Bayesian monotonicity.

While Nash implementation has an obvious generalization to environments with incomplete information,<sup>54</sup> subgame perfect implementation does not have a unique

<sup>&</sup>lt;sup>49</sup>See Palfrey and Srivastava (1987) and (1993) for a number of examples in the context of Bayesian implementation.

<sup>&</sup>lt;sup>50</sup>A closure condition which links play of different equilibrium strategies across the common knowledge partition is also necessary.

<sup>&</sup>lt;sup>51</sup>There are other interesting differences that arise in a Bayesian setting: Dutta and Sen (1994) demonstrate a simple social choice function in a finite setting that requires a mechanism with infinite message spaces for implementation.

<sup>&</sup>lt;sup>52</sup>See Dutta and Sen (1991c) for more on the necessary and sufficient conditions for Bayesian implementation.

<sup>&</sup>lt;sup>53</sup>See also Matsushima (1993).

<sup>&</sup>lt;sup>54</sup>Other natural extensions of complete information implementation to incomplete information set-

generalization, but instead several. This is due to the variety of alternative formulations of sequential rationality under incomplete information. In particular, varying assumptions about how individuals update beliefs off the equilibrium path results in alternative solution concepts to be used in implementation. The two incomplete information extensive form notions of implementation that have been analyzed are perfect Bayesian implementation (Brusco (1995, 1997, 1998)) and implementation via sequential equilibrium (Baliga (1999) and Bergin and Sen (1998)). The interesting new aspect that arises in these settings is that preference reversals can arise not only because of differences in the primitive underlying preferences, but also from the way in which information is revealed in equilibrium through the extensive form. This is the focus of the work of Bergin and Sen (1998). While various conditions for implementation have been identified, the role of information revelation through an extensive form is not yet fully understood.<sup>55</sup>

### Ex Post Individual Rationality, Renegotiation, and Credibility

At several points I have mentioned that various forms of implementation rely on the belief that the outcomes of the mechanism will be enforced, even if they are "bad" from society's point of view ex-post. This can be problematic, to the extent that the positive results depend on such outcomes being used by the mechanism and such beliefs holding.<sup>56</sup> If, for example, a mechanism is constructed to assist bargainers in reaching an efficient agreement, then it is questionable to assume that highly inefficient outcomes will be allowed to stand off (or on) the equilibrium path.

There are several papers that consider implementation in the face of individual rationality and/or renegotiation on and off the equilibrium path. Ma, Moore and Turnbull (1988) were the first to point out the importance of imposing an individual rationality constraint both in and out of equilibrium. They examined a principal-agent model where the usual individual rationality constraint (imposed only on the equilibrium path) was replaced by an "opt-out," where each player had the ability to decline the outcome of the mechanism and accept a status-quo outcome instead. Maskin and Moore (1998) examined a more general implementation problem, and changed the opt-

tings have been analyzed as well, such as implementation in undominated Bayesian equilibrium (Palfrey and Srivastava (1989)), virtual Bayesian implementation (Duggan (1997a)), and virtual implementation in iteratively undominated strategies with incomplete information (Abreu and Matsushima (1992).

<sup>&</sup>lt;sup>55</sup>For instance, see Brusco (1998) for a puzzle on the necessity of multi-stage mechanisms.

<sup>&</sup>lt;sup>56</sup>See Hurwicz (1994) for a discussion of some other, related issues related to enforceability in mechanism design.

ing out to a possibility of renegotiation. This takes the point of view that instead of settling for some outside option or status-quo, the individuals involved are likely to renegotiate to some efficient outcome. Maskin and Moore considered implementation where any outcome of a mechanism that suggests a Pareto dominated allocation is replaced by a Pareto efficient allocation according to an exogenous renegotiation function.<sup>57</sup> Given any such renegotiation function, Maskin and Moore obtain characterizations of Nash and subgame perfect implementation that have intuitive relationships to the standard characterizations. Although these two papers provide insight into ex-post individual rationality and renegotiation, much depends on the exogenous specification of the outside options or renegotiation function.

One would like to model the process that occurs when players opt out, rather than take as given a status quo or renegotiation function. Jackson and Palfrey (1998a) push in this direction, in the context of a dynamic bargaining and matching model, <sup>58</sup> by having a player be rematched with a new bargaining partner whenever he or she optsout of a prescribed alternative. They show that although such an endogenous individual rationality constraint is compatible with efficiency within individual matches, it can be incompatible with efficiency from society's point of view accounting for the overall evolution of the market which requires specific exercise of the rematching option. In other words, it can be impossible to implement the efficient rule in such a setting.

The above approaches are based on the idea that the individuals themselves are not bound to the mechanism, but have the ability to opt out of the prescribed outcome either to some status quo, renegotiated outcome, or replay of the mechanism. There might be other contexts where such an opt-out can be prevented and the outcome can be made legally binding. Nevertheless, one still has to worry about whether the planner (or society at large) will let inefficient outcomes stand ex-post. Studies which address such "credibility", or the ability of the mechanism designer or planner to commit to off-equilibrium-path outcomes that are known to be undesirable, include Chakravorti, Corchon, and Wilkie (1992), Baliga, Corchon, and Sjöström (1995) and Baliga and Sjöström (1995). These studies include the planner as a player in the mechanism, <sup>59</sup> in

<sup>&</sup>lt;sup>57</sup>See Rubinstein and Wolinsky (1992) for a different approach. Their notion of "renegotiation-proof" implementation requires that the possibility for renegotiation never arise on or off the equilibrium path.

<sup>&</sup>lt;sup>58</sup>See Jackson and Palfrey (1998b) for a unified approach to dealing with renegotiation, outside options, and replay of the mechanism, in more abstract settings, with some applications to exchange economies.

<sup>&</sup>lt;sup>59</sup>Including the planner as a player has an interesting theoretical byproduct: the planner is part of

which case one can explicitly account for the planner's preferences and behavior with regards to enforcing an outcome.

In all of the above work there are two forces at work. On the one hand, allowing for movement away from ex-post undesirable outcomes can be improving just by itself since truly undesirable outcomes are eliminated automatically. On the other hand, this limits out of equilibrium threats that (as we saw in the last section) can play a strong role in selecting which outcomes are implemented. Thus, although allowing for players or the planner to alter outcomes builds in some minimal individual rationality or efficiency, it can come at the expense of selectivity of the mechanism. While the above cited work makes progress in understanding enforceability and credibility issues, a complete understanding of these issues requires full modeling (endogeneity) of the process that occurs when an outcome is opted away from by the players or the planner. Often this process may be situation specific, and so it should be worthwhile to analyze this issue in a variety of specific environments, which is something this branch of the literature is just beginning to do.

#### Mixed Strategies

We do not yet have a good understanding of what is Nash or subgame perfect implementable when one accounts for mixed strategies (by mechanisms satisfying, say the best response property). I discussed one approach to addressing this problem which is to analyze specific environments where the additional structure can lead to simple implementing mechanisms that avoid mixed strategy equilibria and other difficulties altogether. Such an approach has been very successful leading to some of the most natural mechanisms for implementation to date. So it seems fruitful to simply break the implementation analysis into many subproblems by analyzing specific settings and developing a catalog of what is implementable setting by setting. However, a case can still be made for attacking the problem head-on in the general setting. The reason for complementing the setting-specific analyses with a general analysis is that it would generate insight to the additional necessary (and sufficient) conditions that come with the consideration of mixed strategies. Given how tailored the analyses are in specific environments, it is not clear that such an understanding will be obtained by piecing together a catalog of results.

A number of possible head-on approaches suggest themselves, even simply with respect to Nash implementation. One might ask what can be (exactly) Nash imple-

the equilibrium and can thus rule out undesired equilibria unilaterally.

mented in finite environments by a finite mechanism that has no mixed strategies.<sup>60</sup> Alternatively, one could allow for mixed strategies and consider implementing social choice correspondences that map into lotteries and ask what is implementable then.

#### Robustness of Mechanisms

In order to push the theory towards applied use, one has to worry about how sensitive a mechanism is to such obvious things as misspecification of the environment or 'irrational' behavior by the players.

Some work has been done on implementation allowing for variations in the behavior of the individuals. Some of the first work in this direction was on the implementation of the Walrasian correspondence by mechanisms with a continuous outcome function (e.g., see Postlewaite and Wettstein (1989)). Requiring continuity of a mechanism results in an outcome close to the desired one if some players deviate slightly from equilibrium strategies. More recent attention to robustness with respect to behavior appears in studies of double implementation (e.g., see Yamato (1993, 1994ab)). Double implementation requires implementation in more than one solution concept by the same mechanism. When allowing for combinations such as Nash and strong equilibrium, potentially unforeseen coalitional deviations are accounted for in implementation. One can also ask for robustness with regards to behavior that is completely unpredictable by some of the players. A new paper by Eliaz (1999) examines this sort of problem asking that a mechanism rely only on a majority of the individuals (not knowing exante which majority it will be), and using a solution concept that requires behavior of the players to be immune to arbitrary behavior by some subsets of other players.

While the work described above has examined robustness with regards to certain aspects of the behavior of players, there is almost no study of mechanisms that are immune to misspecifications of the environment. The only study in this direction that I am aware off is by Duggan and Roberts (1998), who study how continuity of a mechanism can result in robustness with respect to small errors in misspecification, due to corresponding upper-hemi continuity of equilibrium correspondences.<sup>61</sup> This suggests that an intuitive notion of requiring some continuity of a mechanism in order to guarantee some minimal robustness is well founded. Short of this, we are lacking

<sup>&</sup>lt;sup>60</sup>Again, Abreu and Matsushima (1992a) provide a good deal of insight into this question for virtual implementation. The reason for considering the exact setting would be to loosen assumptions on preferences and sensitivity to small probability events under the lotteries.

<sup>&</sup>lt;sup>61</sup>This holds provided one worries about mixed strategies, which Duggan and Roberts point to as another reason for accounting for mixed strategies in implementation.

even a basic understanding of the exact limitations that are imposed by requiring implementation by mechanisms that are robust to misspecifications of the domain of preferences, beliefs, allocations, or even the number or role of various individuals in a society.

## Comparisons Across Solution Concepts

As we have developed a deeper understanding of what is implementable in a variety of contexts and solution concepts, it has become clear that the choice of solution concept used to model behavior has an important bearing on what is implementable. The class of social choice correspondences that are implementable in undominated Nash or subgame perfect equilibrium is significantly larger than the class of Nash implementable social choice correspondences. What is it about solution concepts (or assumptions on individual behavior) that accounts for this difference? Jackson and Srivastava (1996) examine this issue in the context of a voting setting with a finite number of strictly rankable alternatives. They point to differences in consideration of off-equilibrium path behavior as the critical factor the affects how much is implementable via different solution concepts. While this works out cleanly in a voting context, it is still unkown if the same is true more generally or even in other specific contexts like exchange economies.

Tracing the characterizations of implementability back to assumptions concerning individual behavior should be quite important. As modelers, we often consider a solution concept as an object of choice; but ultimately it boils down to understand how people behave in a given context. If we understand how variations in behavior tie back to implementability, that we will eventually be well-equipped to make prescriptions in various contexts. We are still short of such an understanding.

#### Repeated Implementation

Perhaps one of the most interesting and relevant, and still least studied, questions in implementation theory is that of implementation in dynamic and repeated contexts. We know from results on folk theorems, reputation, and learning (as well as various experimental and applied studies), that behavior in repeated games can differ in important ways from behavior in one-shot games. As most applications of implementation are repeated ones, ranging from the design of voting procedure to markets, it is very important that we understand how mechanisms perform when used repeatedly by the same society. Work by Kalai and Ledyard (1998) is the only that I am aware of that takes this perspective.<sup>62</sup> They draw on intuition from the reputation and learning

<sup>&</sup>lt;sup>62</sup>Work on implementation with extensive forms is of course dynamic. In some cases can involve

literatures to note that if a mechanism designer is more patient than the underlying population, then the society's characteristics can be teased out and learned over time. Thus in the long run, a planner can avoid even incentive compatibility requirements in a Bayesian setting. While this takes an important first step towards modeling repeated implementation, the question of what is generally implementable in repeated contexts is wide open.

#### Choice of Mechanisms

The theory of implementation is agnostic on how a social choice correspondence is selected for implementation or how a society might choose a mechanism. These are critical questions in understanding the eventual outcome of the process. These are also difficult questions to formulate, since at some point one has to make an ad hoc assumption about the process of choice. Nonetheless one can ask for some sort of consistency properties in decision making. Koray (1998) (see also Barberà and Bevia (1998)), in a voting context, asks for consistency in that a social choice function chosen by a society should be consistent with the manner in which it is selected. That is, the selection of a social choice function can be formulated as a social choice problem, and the social choice function selected should be one that would be selected by itself. A clever formulation (see Koray (1998)) allows social choice functions to be both the objects of choice and the methods of choice at the same time. Although Koray's result is negative (he finds that only a dictatorial social choice function is self-consistent), one can think of addressing such issues on restricted domains and allowing for correspondences rather than functions. There are also alternative methods of modeling choice of objectives and mechanisms by a society that can be investigated in specific settings.

Another matter relating to the choice of mechanisms, is that an individual's preferences and behavior may depend on the mechanism itself. Glazer and Rubinstein (1998) present a context where individuals providing messages ("opinions") care explicitly about how their message ends up comparing to the ultimate social decision, as they would like to have their recommendation match the social choice. This introduces an added layer of feedback between the mechanism and equilibrium behavior, that presents interesting and challenging issues for implementation theory. Such issues

different agents allocations being realized at different times for a variety or reasons such as information revelation (as in Brusco (1997b)), random matching (as in Jackson and Palfrey (1998)), and different arrival times (as in Brusco and Jackson (1999)). Nonetheless, these analyses are still one-shot in that individuals cease to interact once an outcome is realized.

are generally unexplored in the theory, and one can think of any number of examples beyond the Glazer and Rubinstein context (for instance in principal-agent problems) where they are important.

### Testing Implementing Mechanisms

As the theory continues to generate mechanisms for implementation, we can begin to evaluate and compare them through testing, simulation, and experiments. For instance Chen (1997) compares behavior observed in a series of public goods mechanisms. She attributes differences in performance to supermodularity properties of the mechanisms, which then helps us appreciate another feature that we might consider in designing mechanisms. One can also test some of the canonical mechanisms directly as done by Sefton and Yavas (1996). They ran experiments on the Abreu and Matsushima (1992a) mechanism, and found relatively poor performance, which presents some formidable hurdles for the theory. These just touch the surface of what can be explored, and one can check whether various criticisms of unnatural features of mechanisms are supported by experimental evidence. Similarly, simulations can be used to study the same issues, as in Cabrales (1999). He studies adaptive learning by players in some of the canonical mechanisms for implementation. There is ample room for tests, simulations, and experiments on mechanisms to add valuable guidance and insight to the theory of implementation.

<sup>&</sup>lt;sup>63</sup>One interesting question is how a mechanism with an integer game would be played. Would players play equilibrium strategies? Would they end up trying to announce high integers? (I am sure that Caltech undergraduates could be very creative in announcing high integers.) How would behavior depend on the social choice correspondence being implemented? Are they more likely to coordinate on the equilibrium play when there is alignment of preferences?

<sup>&</sup>lt;sup>64</sup>The adaptive learning algorithm Cabrales analyzes has features that allow for complete randomization over best responses which can kick the process out of an integer game, and thus produce convergence to equilibrium in Nash mechanisms. Ultimately, one would like a mechanism to perform well under a variety of processes, and to offer fast convergence.

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