# Are Simple Mechanisms Optimal when Agents are Unsophisticated?\*

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#### Abstract

We study the design of mechanisms involving agents that have limited strategic sophistication. The literature has identified several notions of *simple* mechanisms in which agents can determine their optimal strategy even if they lack cognitive skills such as predicting other agents' strategies (strategy-proof mechanisms), contingent reasoning (obviously strategy-proof mechanisms), or foresight (strongly obviously strategy-proof mechanisms). We examine whether it is *optimal* for the mechanism designer who faces strategically unsophisticated agents to offer a mechanism from the corresponding class of simple mechanisms. We show that when the designer uses a mechanism that is not simple, while she loses the ability to predict play, she may nevertheless be better off no matter how agents resolve their strategic confusion.

Keywords: Simple mechanisms, complex mechanisms, robust mechanism design, dominant-strategy mechanisms, obviously strategy-proof mechanisms, strongly obviously strategy-proof mechanisms

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# 1 Introduction

It is widely accepted that "real-life" economic agents are not as rational as their counterparts in economic models. When agents have limited strategic sophistication, economists naturally lose confidence in the performance of mechanisms that require the participants to engage in complicated mental tasks. For example, achieving a Bayesian Nash equilibrium in a mechanism requires each agent to know the distribution of the other agents' private information and correctly forecast the other agents' play; this is why strategy-proof (SP) mechanisms are generally perceived as being superior for practical purposes. Following the mounting evidence that even dominant strategies are difficult to identify for real-life agents, several recent papers have identified mechanisms in which agents can determine their optimal strategy under even weaker assumptions about their strategic sophistication. Li (2017) proposes the notion of obviously strategy-proof (OSP) mechanisms in which agents can determine their optimal strategy even if they cannot engage in contingent reasoning. Pycia and Troyan (2019) strengthen the notion of simplicity even further by relaxing the assumption that agents can predict their own future moves, and define (among other intermediate concepts) strongly obviously strategy-proof (SOSP) mechanisms.

For the purpose of this paper, we call a mechanism *simple* if, given the assumed level of strategic sophistication, agents can determine their optimal strategy in the mechanism. For example, if we are only comfortable assuming that agents do not play weakly dominated strategies, then a SP mechanism is simple because a dominant strategy can be identified as the unique strategy (up to payoff equivalence) that is not weakly dominated for such agents. If the designer instead offers a mechanism that is not SP, she can no longer predict how agents will behave. More generally, we call a mechanism *complex* if it creates *strategic confusion* for the agents, understood as the inability to determine their optimal strategy in the mechanism.

The key observation of this paper is that the inability of the designer to predict the outcome of a complex mechanism need not be a sufficient reason for the use of simple mechanisms. As long as the designer is ultimately concerned with maximizing her own payoff —which is typically assumed in mechanism design—in many cases complex

<sup>&</sup>lt;sup>1</sup>In mechanism design, it is more common to use the terminology "dominant-strategy mechanisms." We use the term "strategy-proof mechanisms" in this paper to draw a parallel to the notions of obviously strategy-proof mechanisms and strongly obviously strategy-proof mechanisms.

mechanisms are unambiguously preferred by the designer to simple ones.

Since a complex mechanism, by definition, leads to a set of possible outcomes, we need to specify what we mean by the designer preferring a complex mechanism to a simple one. We analyze two notions. Under *weak dominance*, the complex mechanism generates a weakly higher expected payoff to the designer, no matter how agents resolve their strategic confusion (that is, no matter which strategy they choose from the set of strategies that they can identify as potentially optimal), and generates a strictly higher expected payoff in some cases. Under *strong dominance*, the designer obtains a strictly higher expected payoff in all cases, regardless of how agents behave when they are "confused."

To understand these notions, it is instructive to consider some examples. We use the notion of OSP for illustration; however, the ideas are robust to the particular choice of the notion of simplicity. In the paper, we also analyze SP—the least demanding notion—and SOSP—the most demanding notion.

Example 1. Consider a single-unit auction with N bidders, with independent private values distributed according to a regular and symmetric distribution. Suppose that the bidders cannot engage in contingent reasoning. As formalized and shown by Li (2017), bidders will not play an obviously dominated strategy, and thus the agents' behavior (up to payoff equivalence) is pinned down if and only if the designer uses an OSP mechanism. The revenue-maximizing mechanism—which requires implementing the outcome in which the object is allocated to the highest type as long as that type is above a distribution-dependent reserve price—can be OSP-implemented by the ascending clock auction. In the ascending clock auction, active bidders choose whether to exit as the clock price increases, and bidders who exit remain inactive thereafter. The auction stops when all but one bidder exit. The remaining bidder wins the object and pays the clock price.

However, consider the following modified mechanism, which we call the ascending clock auction with jump bidding, that differs from the ascending clock auction only in one aspect: Each bidder is allowed to speed up the clock by jump bidding, that is, making a higher bid than the current clock price.<sup>3</sup> This mechanism is not OSP because making

<sup>&</sup>lt;sup>2</sup>A strategy is obviously dominant if, for any deviation, at any information set where the two strategies first diverge, the best outcome under the deviation is no better than the worst outcome under the dominant strategy. A mechanism is OSP if it has an equilibrium in obviously dominant strategies. See Section 2 for the formal definition.

<sup>&</sup>lt;sup>3</sup>Jump bidding is a prevalent feature of real-world ascending auctions. Avery (1998) studies a common-value auction and shows that jump bidding may be employed to intimidate one's opponents. This signaling incentive is irrelevant in the private-value setting.

a jump bid (to a bid b) is not obviously dominated for a bidder with value v > b at the clock price p < b. Indeed, making a jump bid to b yields the best-case payoff of v - b to the bidder, while following the default strategy (of exiting when the clock price reaches v) yields a payoff of 0 in the worst case.<sup>4</sup> Agents are strategically confused as they now have multiple strategies that are not obviously dominated—the mechanism is complex.

Given the assumed strategic sophistication of the bidders, the designer could not predict whether jump bidding will occur or not. Nonetheless, a revenue-maximizing auctioneer might prefer the ascending clock auction with jump bidding to the ascending clock auction: If none of the bidders jump bids, then the performance of the ascending clock auction with jump bidding is the same as that of the ascending clock auction; in the event that some bidder (say bidder i) jump bids, the expected revenue of the ascending clock auction with jump bidding is strictly higher than that of the ascending clock auction. This is because there is positive probability that the highest valuation among the other bidders is between the current clock price and the jump bid of bidder i.

The key idea behind the above example is that agents are offered an additional option in the mechanism that—if taken—benefits the designer. We generalize this idea to a wide variety of settings, and show that it applies even when there is a single agent.

When a complex mechanism weakly dominates the best simple mechanism, the designer has a reason to purposefully introduce strategic confusion. However, since weak dominance only requires that the designer obtain a strictly higher payoff in some but not all cases, the difference between a simple mechanism and the complex mechanism that weakly dominates it may seem irrelevant to a sufficiently pessimistic designer. The pessimism of the designer may be well-founded if the contingency in which her payoff is strictly higher under the complex mechanism seems implausible—even if not formally ruled out by the assumed rationality of agents.

<sup>&</sup>lt;sup>4</sup>Of course, bidders would not jump bid if they could engage in contingent reasoning.

<sup>&</sup>lt;sup>5</sup>Although we consider the single-unit auction in this example, the logic immediately carries over to the class of binary allocation problems. Li (2017) shows that any OSP mechanism in the binary allocation problem is essentially a personal-clock auction. If the designer is maximizing revenue, then for any personal-clock auction, by allowing jump bidding, we obtain a complex mechanism that weakly dominates it.

<sup>&</sup>lt;sup>6</sup>It may be useful to draw an analogy to the notion of weak dominance between two strategies in game theory. The arguments for and against the weakly dominated strategy carry over to the weakly dominated mechanism. In particular, the designer could still perceive a weakly dominated mechanism to be optimal if she *believes with certainty* that agents choose strategies that are worst possible for her whenever they are confused, just as a weakly dominated strategy could be perceived to be optimal as it could be a best response to a *degenerate* belief about her opponent's strategies.

However, this reservation is mute under the notion of strong dominance. We emphasize that the notion of strong dominance is remarkably strong, as it requires that the superior mechanism generate a strictly higher expected payoff to the designer, regardless of how agents behave when they are confused. The following example illustrates.

Example 2. Consider the problem of a trading platform that intermediates trade between two dealers and maximizes intermediation profits. Each dealer starts with no inventory, and can buy or (short) sell one unit of the asset. The platform cannot hold any inventory (ex-post market-clearing is imposed). In contrast to the single-unit auction example above, each dealer may become either a buyer or a seller, depending on the realization of the privately observed valuation and the choice of the mechanism. Dealer A's valuation for the asset is either 0 or 2/3. Dealer B's valuation for the asset is either 1/3 or 1. The designer of the trading platform believes individual types to be equally likely but correlated across dealers:  $\pi((0, 1/3)) = \pi((2/3, 1)) = \kappa > 1/4.$ 

The optimal OSP mechanism for  $\kappa = 2/5$  yields an expected profit of 1/5 for the platform and can be implemented by the following extensive-form game, which can be seen as a version of a personal-clock auction (see Li (2017)):

- 1. Dealer A is asked whether she would like to sell the asset at the price 0; if she says "yes," then that trade is implemented; if she says "no," then:
- 2. Dealer B is asked whether she would like to sell the asset at the price 1/3; if she says "yes," then that trade is implemented; if she says "no," then there is no trade.

In all cases in which trade takes place, the platform charges a fee of 1/3 to the buyer, that is, the buyer pays the buyer price plus 1/3.

It is obviously dominant for type 0 of dealer A to accept the initial offer, and for type 2/3 to reject it. Similarly, it is obviously dominant for type 1/3 of dealer B to accept the final offer, and for type 1 to reject it. It follows that the platform's profit is 1/3 except

<sup>&</sup>lt;sup>7</sup>Intuitively, because the agent's role as the buyer or the seller is endogenously determined, the binding incentive constraints cannot be pinned down ex-ante. The correlation of types plays no role in our analysis, except for ensuring that the type profile (0, 1) is relatively improbable. This leads to a particular structure of binding IC and IR constraints in the optimal mechanism. See Section 4 for further discussion. For related models, see for example Cramton et al. (1987), Lu and Robert (2001), Chen and Li (2018), and Loertscher and Marx (2020).

<sup>&</sup>lt;sup>8</sup>We show the optimality of this mechanism in Appendix A.1. The specific value of  $\kappa$  is not important for the result. For example, if  $\kappa = 1/3$  (resp.  $\kappa = 1/2$  (perfect correlation)), then the same OSP mechanism is optimal and generates an expected profit of 2/9 (resp. 1/6), leading to the same conclusion.

when the type profile is (2/3, 1). Intuitively, the inefficient no-trade outcome at the type profile (2/3, 1) is implemented so that type 0 has an obviously dominant strategy: If dealer B were buying the asset from dealer A conditional on the profile (2/3, 1), then the best possible outcome for type 0 from rejecting the initial offer would yield a strictly positive payoff, while her equilibrium strategy yields a payoff of 0. For comparison, this inefficiency would be avoided if the solution concept were relaxed to the standard strategy-proofness. As we show in Appendix A.1, the optimal SP mechanism implements efficient trade and generates an expected profit of 4/15 for the platform.

However, consider an alternative mechanism, which can be seen as a descending personal-clock auction:

- 1. Dealer B is asked whether she would like to buy the asset at the price 1; if she says "yes," then that trade is implemented; if she says "no," then:
- 2. Dealer A is asked whether she would like to buy the asset at the price 2/3; if she says "yes," then that trade is implemented; if she says "no," then:
- 3. Dealer B is asked whether she would like to buy the asset at the price 1/3; if she says "yes," then that trade is implemented; if she says "no," then there is no trade.

Conditional on trade, the platform charges a fee of 1/3 to the seller. This mechanism is not OSP: Type 1 of dealer B is confused between accepting the initial offer (which gives her 0) and rejecting it while accepting the second offer (which gives her -2/3 or 2/3, depending on the behavior of dealer A). However, regardless of how dealer B resolves this confusion, trade always happens, and the platform is guaranteed a profit of 1/3 (hence it also receives 1/3 in expectation, in fact, for any prior distribution of types). Finally, for each type, non-participation is obviously dominated. Thus, as long as dealers do not play strategies that are obviously dominated, by adopting a complex mechanism, the platform beats not only the optimal OSP mechanism but also the optimal SP mechanism.

While being dominated may be seen as an argument against simple mechanisms, it is not our point to criticize simplicity in general. For one thing, we do not take into account additional (mental or financial) costs that agents may incur when taking part in a complex mechanism relative to the costs of participation in a simple mechanism. Moreover, the

<sup>&</sup>lt;sup>9</sup>The platform could ensure that non-participation is obviously *strictly* dominated by adjusting the fee and the prices by an arbitrarily small  $\epsilon > 0$ .

flip side of our analysis is that we identify environments in which simple mechanisms are not weakly or strongly dominated. This may be seen as an optimality foundation for the use of simple mechanisms, complementary to existing reasons. For example, we show that, under some additional conditions, single-agent posted price mechanisms are not weakly dominated for the notions of SP and OSP (interestingly, this is not true under SOSP). We also show that the optimal simple mechanism is not strongly dominated when the designer's maximized objective function (under the chosen solution concept) is the same as the value of a relaxed problem in which the incentives constraints are only imposed on pairs of types that form a tree. <sup>10</sup> A notable instance of such a setting for the notion of SP is when the uniform shortest-path tree condition holds; such environments include cases in which types are one-dimensional and single-crossing holds, e.g., single-unit auctions with private values. <sup>11</sup>

Overall, the message of the paper is that one should not take the use of simple mechanisms for granted when agents are strategically unsophisticated; rather, their optimality should be carefully established for each environment in question.

#### 1.1 Related literature

Simple mechanisms: This paper contributes to the design of mechanisms involving strategically unsophisticated agents. While Li (2017), Börgers and Li (2019), and Pycia and Troyan (2019) provide notions of simplicity and the characterizations of simple mechanisms according to these notions, our focus is on the tradeoff between simplicity and optimality, and we examine whether there is a foundation for the use of simple mechanisms from an optimality perspective. <sup>12</sup> Indeed, we show that in many cases, the designer might prefer a mechanism that is not simple.

Robust mechanisms design: Traditional models in mechanism design make strong assumptions about the detailed knowledge of the designer about the inputs to the

<sup>&</sup>lt;sup>10</sup>This result generalizes the insight of Yamashita (2015).

 $<sup>^{11}</sup>$ See Chen and Li (2018).

<sup>&</sup>lt;sup>12</sup>Li (2017) and Pycia and Troyan (2019) formulate solution concepts that are stronger than the standard strategy proofness. In contrast, motivated by the observation that for many mechanism design problems the class of SP mechanisms is quite small and only includes mechanisms that are rather unattractive for the designer, Börgers and Li (2019) propose a class of mechanisms—strategically simple mechanisms—that includes, but is strictly larger than, the set of dominant strategy mechanisms. There are, of course, many dimensions to simplicity. Our paper and the papers cited here primarily concern the strategic dimension.

mechanism design model. The literature of robust mechanism design seeks to relax these assumptions; see Carroll (2019) for a recent survey. While the leading interpretation of our exercise is that agents have limited strategic sophistication, an alternative interpretation—tying our work to the burgeoning literature of robust mechanism design—is that we relax the assumption about the designer's knowledge of the strategic reasoning process of the agents (beyond some minimal rationality assumptions).

SP mechanisms: The robustness to the agents' hierarchies of beliefs about each other is a central topic of robust mechanism design; see, for example, Bergemann and Morris (2005) and Chung and Ely (2007). A number of papers have examined whether there is a foundation for the use of dominant-strategy mechanisms when the designer does not have any reliable information about the agents' hierarchies of beliefs. In this approach, the agents can have arbitrary beliefs, while they are still assumed to play a Bayesian equilibrium. Chung and Ely (2007) study this question in the single-unit auction setting, and establish conditions under which the use of dominant-strategy mechanisms has a maxmin foundation.<sup>13</sup> Chen and Li (2018) generalize the analysis to social choice environments with quasi-linear preferences and private values. Yamashita and Zhu (2020) generalize the analysis to the interdependent-value setting and ask whether there is a foundation for the use of ex post incentive-compatible mechanisms. Börgers (2017) raises a criticism of the notion of the maxmin foundation: The optimal dominant-strategy mechanism—even if there exists a maxmin foundation—could still be weakly dominated. Our approach is different. While our analysis for the solution concept of SP also asks whether there is a foundation for the use of dominant-strategy mechanisms, we are not motivated by the robustness to the agents' hierarchies of beliefs, but driven by simplicity concerns. We impose a minimal rationality assumption that agents do not play weakly dominated strategies; agents are not assumed to play a Bayesian equilibrium.

Implementation in undominated strategies: Our analysis for the solution concept of SP is closely related to the strand of the mechanism design literature that studies implementation in undominated strategies; see, for example, Börgers (1991), Jackson (1992), Börgers and Smith (2012), Carroll (2014), Yamashita (2015), and Mukherjee et al. (2019). It is known from these papers that the optimal SP mechanism could be weakly or strongly dominated by complex mechanisms; we provide new examples and additional

<sup>&</sup>lt;sup>13</sup>The use of dominant-strategy mechanisms has a maxmin foundation if the optimal dominant-strategy mechanism generates the highest worst-case expected revenue, where the worst case is taken over all possible agents' beliefs.

structural insights. For voting, Börgers (1991) shows that there are non-dictatorial procedures which ensure that collection decisions are Pareto efficient if all agents choose strategies that are not weakly dominated, and Mukherjee et al. (2019) show that the Pareto correspondence can be implemented in weakly dominated strategies by bounded mechanisms (that require an infinite number of messages for each agent). Börgers and Smith (2012) show that, for bilateral trade and voting, there exist mechanisms that weakly dominate the optimal SP mechanism if all agents choose strategies that are not weakly dominated. Yamashita (2015) develops a novel methodology of establishing an upper bound of the highest worst-case payoff for the designer, and applies the methodology to several settings, including the private-value auction and bilateral trade, and interdependent-value auction. Our results in Section 4.3 extend the insight of Yamashita (2015) to a larger class of environments and other solution concepts such as OSP and SOSP.

In an independent paper, Mukherjee et al. (2020) provide sufficient conditions for a social choice correspondence to be implemented in weakly undominated strategies. They apply their results to several economic environments (including auctions, public good provision, and matching) and show that the optimal SP mechanisms can be weakly dominated. In their construction, agents are entitled to choose outcomes that are inferior to them but superior to the designer. This is accomplished by expanding the message spaces and making these agent-inferior strategies undominated by specifying good outcomes for an agent when her opponents choose weakly dominated strategies (these good outcomes never materialize as all agents avoid weakly dominated strategies in the course of play). This underlying idea is similar to the logic behind our Proposition 1, but the two papers differ in the detailed construction and neither result implies the other. The result of Mukherjee et al. (2020) has the advantage of providing primitive conditions for the full implementation of a social choice correspondence, while our Proposition 1 identifies conditions under which a given simple mechanism can be weakly dominated, in line with the focus of our paper. Mukherjee et al. (2020) do not cover the solution concepts of OSP and SOSP and the criterion of strong dominance.

Complex mechanisms: In terms of understanding complex mechanisms with

<sup>&</sup>lt;sup>14</sup>We are aware of two other papers that study questions different from ours but contain examples that could be used to show instances of strong dominance of an SP mechanism: Bergemann and Morris (2005)[Example 2] who study robust implementation of correspondences in settings in which the designer does not have information about agents' belief and Carroll (2014) who proves a complexity result for undominated-strategy implementation. Also see Footnote 39 for the discussion of interdependent-value settings.

cognitively limited agents, Jakobsen (2020) is similar in spirit to our paper. He studies a mechanism design problem involving a principal and a boundedly rational agent who has both imperfect memory and limited deductive (computational) ability. Thus, the agent's comprehension of a game form—the mapping from strategy profiles to outcomes—is subject to complexity constraints. He shows that by expressing a mechanism as a complex contract, the principle could manipulate the agent into believing that truthful reporting is optimal. This paper differs from ours in that it imposes specific assumptions about how the agent resolves uncertainty in the mapping from strategy profiles to outcomes for any given complex contract. Since the agent associates a set of outcomes to any given strategy profile, to model how she evaluates those sets, the agent is assumed to be a maxmin decision maker. In contrast, we take a robust approach, and do not impose any assumption about how agents resolve their strategic confusion for complex mechanisms.<sup>15</sup>

Glazer and Rubinstein (2012) and Glazer and Rubinstein (2014) study persuasion/mechanism design models with boundedly rational agents and show that the listener could benefit from using complex mechanisms that make it difficult for dishonest agents to cheat. These papers impose specific assumptions about the reasoning procedures of the speaker.

# 2 Preliminaries

**Environment.** There is a finite set of N agents,  $\mathcal{N} = \{1, 2, ..., N\}$ , and an arbitrary (possibly infinite) set of alternatives  $\mathcal{X}$ . Each agent i has payoff-relevant information indexed by  $\theta_i \in \Theta_i$ , where  $\Theta_i$  is finite. We refer to  $\theta_i$  as agent i's type. The set of possible type profiles is  $\Theta = \times_{i \in \mathcal{N}} \Theta_i$  with representative element  $\theta = (\theta_1, \theta_2, ..., \theta_N)$ . The type profile is distributed according to a prior probability distribution  $\pi \in \Delta\Theta$ . As is standard, we write  $\theta_{-i} \in \Theta_{-i} = \times_{j \neq i} \Theta_j$  for a type profile of agents other than agent i.

Each agent i is endowed with a utility function  $u_i: \mathcal{X} \times \Theta_i \to \mathbb{R}$  (we assume private values). The designer has a utility function  $v: \mathcal{X} \times \Theta \to \mathbb{R}$ . That is,  $u_i(x, \theta_i)$  and  $v(x, \theta)$  denote type  $\theta_i$ 's utility and the designer's utility, respectively, when the type profile is  $\theta$  and the implemented alternative is x. We assume that the designer is an expected utility maximizer with respect to the distribution  $\pi$  of types. We make no such assumption about the agents because how they form beliefs about other agents' types is irrelevant

<sup>&</sup>lt;sup>15</sup>Of course, the source of uncertainty is different in these two papers. There is no strategic uncertainty in Jakobsen (2020), and the uncertainty in the mapping from strategic profiles to outcomes stems from the bounded rationality of the agent.

given the solution concepts we consider.

The designer may wish to use randomization in the mechanism. To incorporate this possibility, we introduce a "dummy" agent i=0 with no preferences, called Nature. The game form is allowed to feature nodes at which Nature is called to play, and the distribution over strategies is picked by the designer as part of the mechanism. We use "bar" to denote the extended profiles that include Nature, for example,  $\bar{\mathcal{N}} = \mathcal{N} \cup \{0\}$ .

Mechanisms. We consider finite mechanisms that are imperfect-information, extensiveform games with perfect recall and consequences in  $\mathcal{X}$ .<sup>16</sup> The definition is standard; to shorten the exposition, we only introduce notation associated with a generic game  $\Gamma$  that we are going to use:

- (1)  $\mathcal{H}$  is a (finite) set of histories, with representative element h;
- (2)  $h_{\emptyset}$  is the initial (empty) history;
- $(2) \subset$ is the precedence relation over histories;
- (3)  $\mathcal{Z}$  is the set of terminal histories, with representative element z;
- (4)  $g(z) \in \mathcal{X}$  is the outcome resulting from z;
- (5)  $I_i$  denotes an information set of agent i;
- (6)  $A(I_i)$  is the set of actions available at information set  $I_i$ ;
- (7) A (pure) strategy  $S_i$  chooses an action  $a \in A(I_i)$  at every information set  $I_i$  of agent  $i \in \bar{\mathcal{N}}$ , and  $S_i$  is the collection of all (pure) strategies for player i;<sup>17</sup>
- (8) A strategy profile  $\bar{S} = (S_0, S_1, ..., S_N)$  specifies a strategy for each player;
- (9)  $z(h, \bar{S})$  denotes the terminal history that results when we start at history h and play proceeds according to the strategy profile  $\bar{S}$ ;
- (10)  $\pi_0 \in \Delta(\mathcal{S}_0)$  is a full-support probability distribution over Nature's strategies.<sup>18</sup>

<sup>&</sup>lt;sup>16</sup>Finiteness is an important assumption: Jackson (1992) shows that inifinite mechanisms may implement virtually any decision rule in undominated strategies, relying on an infinite hierarchy of weakly dominated strategies with no dominant strategy "at the top."

<sup>&</sup>lt;sup>17</sup>We focus on pure strategies. This does not affect our negative results that simple mechanisms are (weakly or strongly) dominated. Since a strategy that is not weakly dominated by a pure strategy could nevertheless be dominated by a mixed strategy, allowing mixed strategies gives a weakly smaller set of undominated strategies and thus makes it easier to show that simple mechanisms are dominated.

<sup>&</sup>lt;sup>18</sup>That  $\pi_0$  has full support over Nature's strategies is equivalent to assuming that agents ignore zero-probability events as possible contingencies; in the opposite case, certain paradoxical results can be obtained (e.g., a strategy that gives an agent the worst possible outcome with probability one is weakly undominated if it offers the best possible outcome following a zero-probability event).

We say that the information set  $I_i$  is on the path of play of strategy  $S_i$  if there exists  $\bar{S}_{-i}$  and  $h \in I_i$  such that  $h \subset z(h_\emptyset, S_i, \bar{S}_{-i})$ . Given two strategies  $S_i$  and  $S_i'$ , we define  $\beta(S_i, S_i')$  to be the set of information sets that are on the path of play of both  $S_i$  and  $S_i'$ . Under perfect recall,  $I_i \in \beta(S_i, S_i')$  implies that  $S_i$  and  $S_i'$  choose the same actions at all information sets preceding  $I_i$ . If  $I_i \in \beta(S_i, S_i')$  but  $S_i$  and  $S_i'$  choose different actions at  $I_i$ , then we call  $I_i$  an earliest point of departure for these two strategies. Following Li (2017), we let  $\alpha(S_i, S_i')$  denote the set of all earliest points of departure for these two strategies. Finally, we let  $\Phi(S_i, I_i) = \{S_i' : I_i \in \beta(S_i, S_i'), S_i(I_i) = S_i'(I_i)\}$  be the set of player i's strategies that agree with  $S_i$  at  $I_i$  and all information sets that precede it.

**Solution concepts.** We now define three solution concepts that we use throughout this paper.

**Definition 1** (SP).  $S_i$  is dominated (or SP-dominated) for type  $\theta_i$  of agent i if there exists another strategy  $S'_i$  such that for all  $\bar{S}_{-i}$ ,

$$u_i(g(z(h_\emptyset, S_i, \bar{S}_{-i})), \theta_i) \leq u_i(g(z(h_\emptyset, S_i', \bar{S}_{-i})), \theta_i),$$

with the inequality being strict for some  $\bar{S}_{-i}$ .

**Definition 2** (OSP).  $S_i$  is obviously dominated (or OSP-dominated) for type  $\theta_i$  of agent i if there exists another strategy  $S'_i$  such that for all  $I_i \in \alpha(S_i, S'_i)$ ,

$$\sup_{h \in I_i, \bar{S}_{-i}} u_i(g(z(h, S_i, \bar{S}_{-i})), \theta_i) \le \inf_{h \in I_i, \bar{S}_{-i}} u_i(g(z(h, S_i', \bar{S}_{-i})), \theta_i),$$

with the inequality being strict for some  $I_i \in \alpha(S_i, S_i')$ .

**Definition 3** (SOSP).  $S_i$  is strongly obviously dominated (or SOSP-dominated) for type  $\theta_i$  of player i if there exists another strategy  $S'_i$  such that for all  $I_i \in \alpha(S_i, S'_i)$ ,

$$\sup_{h \in I_i, \bar{S}_{-i}, R_i \in \Phi(S_i, I_i)} u_i(g(z(h, R_i, \bar{S}_{-i})), \theta_i) \le \inf_{h \in I_i, \bar{S}_{-i}, R'_i \in \Phi(S'_i, I_i)} u_i(g(z(h, R'_i, \bar{S}_{-i})), \theta_i),$$

with the inequality being strict for some  $I_i \in \alpha(S_i, S_i')$ .

In words, a strategy  $S_i$  is dominated for type  $\theta_i$  if there exists another strategy  $S'_i$  that yields a higher payoff for type  $\theta_i$  for any fixed strategy profile for other players

and Nature. A strategy  $S_i$  is obviously dominated for type  $\theta_i$  if there exists another strategy  $S_i'$  such that, starting at any earliest point of departure, the worst possible payoff under  $S_i'$  for type  $\theta_i$  across all strategies of other players and Nature is higher than the best possible payoff under  $S_i$  for type  $\theta_i$  across all strategies of other players and Nature. Finally, a strategy  $S_i$  is strongly obviously dominated for type  $\theta_i$  if there exists another strategy  $S_i'$  such that, starting at any earliest point of departure, the worst possible payoff under  $S_i'$  for type  $\theta_i$  across all strategies of other players, Nature, and moves of player i at future information sets is higher than the best possible payoff under  $S_i$  for type  $\theta_i$  across all strategies of other players, Nature, and moves of player i at future information sets. The three dominance concepts are nested: Strongly obviously dominated strategies are obviously dominated, and obviously dominated strategies are dominance. From now on, we fix a dominance concept  $K \in \{SP, OSP, SOSP\}$ ; unless explicitly stated otherwise, all statements involving a generic dominance concept K apply to any K in that set.

Remark 1 (On randomization). Under the solution concepts analyzed in this paper, one has to take a stance on how agents reason about randomization: When evaluating a strategy, they could either (i) take expectations with respect to designer's randomization within the mechanism, or (ii) condition on each outcome of the randomization device. Our definitions capture the second possibility. This implies that Definition 1 of dominance for strategy-proof mechanisms is somewhat non-standard. However, this convention keeps the three solution concepts more analogous, since in OSP (see Li (2017)) and SOSP (see Pycia and Troyan (2019)), dominance is defined with respect to Nature's moves. Such an approach to randomization seems natural given the focus on simplicity, since randomization may plausibly be seen as making reasoning in the mechanism more difficult for players; an opposite view would implicitly assume that—in the mind of a player—there is a distinction between the moves of Nature and the moves of a strategic player with a constant utility function. That being said, since we imposed no a priori restrictions on the space of primitive outcomes  $\mathcal{X}$ , it is possible that  $\mathcal{X}$  already contains lotteries over deterministic decisions (and the utilities  $u_i(x, \theta_i)$  are expected utilities derived from some primitive utility for deterministic decisions); in that case, randomization via Nature's

<sup>&</sup>lt;sup>19</sup>We are not first to consider this extension of the standard notion. A (randomized) mechanism is called a universally-truthful mechanism—a common solution concept in the computer science literature, see for example Nisan and Ronen (2001)—if every mechanism in the support of the randomized mechanism is a dominant-strategy mechanism. The mechanism is truthful even when the realization of the random coins is known.

moves is redundant and our definition of strategy-proof mechanisms essentially reduces to a standard one. Thus, our stronger notion of strategy-proofness only has bite when we explicitly assume that  $\mathcal{X}$  does not contain lotteries (which we will do for some applications, most notably in Section 4.2).

Fixing a game  $\Gamma$  and type  $\theta_i$  of agent  $i \in \mathcal{N}$ , we can think of the dominance relation as defining a partial order  $\prec_{\theta_i}^K$  on the set of player i's strategies:  $S_i \prec_{\theta_i}^K S_i'$  if  $S_i$  is K-dominated by  $S_i'$  according to  $\theta_i$ . We call two strategies  $S_i$  and  $S_i'$  payoff-equivalent for type  $\theta_i$  if  $u_i(g(z(h_{\emptyset}, S_i, \bar{S}_{-i})), \theta_i) = u_i(g(z(h_{\emptyset}, S_i', \bar{S}_{-i})), \theta_i)$  for all  $\bar{S}_{-i}$ . A strategy  $S_i$  is K-dominant if all non-payoff-equivalent strategies  $S_i'$  are K-dominated by it.

Strategic confusion, simple and complex mechanisms. Throughout, we adopt the following assumption about the rationality of players.

**Assumption 1** (Strategic sophistication). For any  $i \in \mathcal{N}$ , no type  $\theta_i$  of player i plays a K-dominated strategy.

Assumption 1 is a relatively weak assumption on behavior; we do not assume any degree of knowledge of rationality—players are not assumed to engage in iterative elimination of dominated strategies.

For mechanism  $\Gamma$  with the corresponding set of possible strategies  $S_i$  of player i, we define the set of strategies that type  $\theta_i$  can possibly play under Assumption 1:

$$U_i^K(\theta_i) = \{ S_i \in \mathcal{S}_i : \nexists S_i' \in \mathcal{S}_i, \ S_i \prec_{\theta_i}^K S_i' \}.$$

That is,  $U_i^K(\theta_i)$  is the set of K-undominated strategies for type  $\theta_i$ . Given the finiteness of the mechanism, that set is non-empty.

If type  $\theta_i$  has a K-dominant strategy, then the set  $U_i^K(\theta_i)$  is not necessarily a singleton; however, all strategies in  $U_i^K(\theta_i)$  must be payoff-equivalent for  $\theta_i$ . In this case, the player is truly indifferent between these dominant strategies, and hence we do not want to label this as "strategic confusion" (otherwise, no solution concept could avoid strategic confusion). However, these dominant strategies need not be payoff-equivalent for the designer. It is customary in mechanism design to let the designer select which

dominant strategy the player should play, and we follow the same convention here.<sup>20</sup> Formally, we will treat  $U_i^K(\theta_i)$  as consisting of equivalence classes of strategies that are payoff-equivalent for  $\theta_i$ , and we let the designer pick the representative of each equivalence class (we leave this description verbal in order not to further complicate our notation).

**Definition 4** (Strategic confusion and complex mechanism). Fixing a mechanism  $\Gamma$ , type  $\theta_i$  of player  $i \in \mathcal{N}$  is said to be strategically confused (under solution concept K) if  $U_i^K(\theta_i)$  contains at least two (not payoff-equivalent) strategies. In such case, we call mechanism  $\Gamma$  complex (for type  $\theta_i$  of agent i).

Strategic confusion means that at least one player has more than one K-undominated strategy in the mechanism, and therefore, in the absence of further assumptions on behavior or strategic reasoning, it is impossible to determine which strategy she will select. Of course, a valid interpretation is that player i "knows" which strategy to choose but the designer is not willing to make an assumption about that choice.

The literature has identified classes of "simple" mechanisms that can be played even if agents are strategically unsophisticated, in the sense of only satisfying Assumption 1. When players cannot forecast their opponents' play, they will nevertheless know how to behave if they have a dominant strategy (a defining property of SP mechanisms). If, moreover, players cannot engage in contingent reasoning, they should be offered an obviously dominant strategy (leading to the notion of OSP mechanisms, see Li (2017)). Finally, if players lack foresight and cannot even predict their own future moves, they should have a strongly obviously dominant strategy (leading to the notion of SOSP mechanisms, see Pycia and Troyan (2019)). This motivates our definition of a simple mechanism.<sup>21</sup>

**Definition 5** (Simple mechanism). A mechanism  $\Gamma$  is simple if for any agent  $i \in \mathcal{N}$ , no type  $\theta_i$  is strategically confused.

<sup>&</sup>lt;sup>20</sup>Various justifications can be offered for this assumption. One is that the mechanism is paired with "recommended" strategies for the players, and the players follow the recommendation as long as it constitutes a dominant strategy. Another one is that—under some permissive conditions—it is possible to perturb the mechanism slightly to guarantee that the dominant strategy preferred by the designer is the unique dominant strategy for each type. A pragmatic justification is that optimal mechanism would often fail to exist otherwise.

<sup>&</sup>lt;sup>21</sup>We emphasize that we only view this definition as being appropriate in the context of the question that we study. There are various other notions of simplicity in mechanism design that are orthogonal to the issue at hand.

Weak and strong dominance of mechanisms. An advantage of a simple mechanism from the point of view of the designer is that she can predict how agents will behave. In contrast, if any agent is strategically confused, the designer—based only on Assumption 1—cannot determine the path of play. This seems to provide a strong argument in favor of simple mechanisms. However, that benefit is diminished if the designer can achieve better outcomes using a mechanism that confuses some types. In this work, we study two notions of "better outcomes" that we introduce below.

Let  $S_i$  denote a type-strategy for player i, that is,  $S_i(\theta_i)$  is the strategy selected by type  $\theta_i$  of player  $i \in \mathcal{N}$ . We let  $S_i \subset U_i^K$  mean that  $S_i$  is a selection from the correspondence of K-undominated strategies, i.e.,  $S_i(\theta_i) \in U_i^K(\theta_i)$  for all  $\theta_i \in \Theta_i$ . Define a correspondence

$$V(\Gamma) = \operatorname{CH}\left(\left\{\mathbb{E}_{\theta \sim \pi, S_0 \sim \pi_0}\left[v(g(z(h_{\emptyset}, (S_0, \boldsymbol{S}_1(\theta_1), ..., \boldsymbol{S}_N(\theta_N)))), \theta)\right] : \left\{\boldsymbol{S}_i \subset U_i^K\right\}_{i \in \mathcal{N}}\right\}\right)$$

which is the range of the designer's expected payoffs over all possible ways in which confused types can resolve their strategic confusion. Note, however, that when computing the range of designer's payoffs, we assume that which undominated strategy a player selects cannot depend on the realization of other players' types. By definition,  $V(\Gamma)$  is a singleton when  $\Gamma$  is a simple mechanism but it may be an interval when  $\Gamma$  is complex.

**Definition 6** (Weak dominance). A mechanism  $\Gamma$  is weakly dominated if there exists a mechanism  $\Gamma'$  such that

$$\sup V(\Gamma) \le \inf V(\Gamma') \ and \ \sup V(\Gamma) < \sup V(\Gamma').$$

**Definition 7** (Strong dominance). A mechanism  $\Gamma$  is strongly dominated if there exists a mechanism  $\Gamma'$  such that

$$\sup V(\Gamma) < \inf V(\Gamma').$$

In words, a mechanism  $\Gamma$  is weakly dominated by a mechanism  $\Gamma'$  if the expected payoff for the designer under  $\Gamma'$  is at least as large as the expected payoff under  $\Gamma$ , regardless of how confused types select their strategies; moreover, the expected payoff under  $\Gamma'$  is strictly larger under some selection. A mechanism  $\Gamma$  is strongly dominated by a mechanism  $\Gamma'$  if the expected payoff for the designer under  $\Gamma'$  is strictly larger than the expected payoff under  $\Gamma$ , regardless of how confused types select their strategy.

Although the above definitions are general, we will only apply them to the case in which  $\Gamma$  is a simple mechanism. Moreover, we will focus on cases when  $\Gamma$  is an *optimal* simple mechanism (that is, it maximizes the designer's expected payoff among all simple mechanisms), in which case it can only be weakly or strongly dominated by a complex mechanism.

Participation constraints. Even when simple mechanisms are dominated, a possible argument in their favor is that agents may be discouraged from participation if they face a complex mechanism. However, we also analyze the case in which participation decisions are endogenous. In many settings (including the ones in which the designer's objective is to maximize her revenue), it is necessary to impose a participation constraint for the problem to be well defined. For a simple mechanism, under the solution concepts in question, it is natural to impose ex-post individual-rationality which requires that for any player i and type  $\theta_i \in \Theta_i$ , the chosen strategy  $S_i = S_i(\theta_i)$  yields a non-negative payoff in all possible cases:

$$u_i(g(z(h_{\emptyset}, S_i, \bar{S}_{-i})), \theta_i) \ge 0, \quad \forall \bar{S}_{-i}.^{22}$$
 (1)

We introduce two extensions of this condition to complex mechanisms. We say that a mechanism  $\Gamma$  provides partial incentives to participate if for all  $i \in \mathcal{N}$ , all  $\theta_i \in \Theta_i$ , there exists  $S_i \in U_i^K(\theta_i)$  such that condition (1) holds. We say that a mechanism  $\Gamma$  provides full incentives to participate if for all  $i \in \mathcal{N}$ , all  $\theta_i \in \Theta_i$ , for all  $S_i \in U_i^K(\theta_i)$  condition (1) holds. The notion of partial incentives to participate is more appropriate when non-participation is thought of as a strategy: The condition states that the non-participation strategy is (obviously) dominated, and hence is not chosen by a rational player. The notion of full incentives to participate is more appropriate if non-participation is thought of as the option for each player to walk away from the mechanism at any point, including after learning her final payoff.

<sup>&</sup>lt;sup>22</sup>This implies that strategy  $S_i$  obviously dominates non-participation, but not that it strongly obviously dominates non-participation. For SOSP, one may wish to require this condition also for all strategies  $R_i \in \Phi(S_i, I_i)$ , where  $I_i$  is the first information set of player i, for each possible history (this would not change our results in any substantial way).

#### 3 Weak dominance

In this section, we analyze the concept of weak dominance of mechanisms. We demonstrate that simple mechanisms are weakly dominated by complex mechanisms in many environments. We first consider a few economic examples, and then prove a more abstract result (Proposition 1) providing conditions under which a given simple mechanism is weakly dominated.<sup>23</sup> The key idea behind the construction of the superior complex mechanisms is that the designer augments the simple mechanism with an additional strategic option for some player that—if taken—benefits the designer. The option is made sufficiently attractive for the agent (so that it is not K-dominated) by specifying a good outcome for the agent in some contingency (that may or may not take place on the path of play). In Subsection 3.5, we provide one positive result—an example of a setting where the best simple mechanism is not weakly dominated.

Unless stated otherwise, all results hold for any  $K \in \{SP, OSP, SOSP\}$ . The claims stated in the context of the examples will follow as corollaries of Proposition 1 which is proven in Appendix A.2.

### 3.1 Efficiency in bilateral trade

We first consider the classical problem of designing an efficient mechanism that allows a seller of an indivisible object to trade with one potential buyer. Both agents have quasi-linear preferences and private information about their values (which are drawn from a non-degenerate distribution). It is known from Hagerty and Rogerson (1987) that the only SP mechanisms (and hence also OSP and SOSP mechanisms) that satisfy ex-post budget balance and individual rationality are posted price mechanisms. In a posted price mechanism, the designer chooses a (possibly random) price, without taking into account any of the agents' private information. Trade comes about only when both agents agree to trade at that price.

Claim 1. The best simple mechanism in the bilateral trade model is weakly dominated by a complex mechanism (that is ex-post budget-balanced and provides full incentives to participate).<sup>24</sup>

<sup>&</sup>lt;sup>23</sup>This message is reinforced by additional examples of weak dominance described in the independent work of Mukherjee et al. (2020), as discussed in Section 1.

<sup>&</sup>lt;sup>24</sup>Börgers and Smith (2012) show this result for the solution concept of SP.

The superior complex mechanism (that we formally construct based on Proposition 1 in Appendix A.2) can be viewed as a "price cap mechanism." The designer sets a price cap of p but gives the seller an additional strategic option to lower the price to some p' < p. This leads to strategic confusion of seller types below p'; indeed, these types may benefit from lowering the price when the buyer's value turns out to lie between p' and p. At the same time, no matter how these types behave, total surplus can only improve. Thus, this mechanism weakly dominates the posted-price mechanism with price p.

#### 3.2 Revenue maximization

Next, we turn our attention to a standard revenue-maximization problem with quasi-linear utilities. Let X be the space of possible allocations (which could involve randomization), and define  $\mathcal{X} = X \times \mathbb{R}^N$ , with  $(y, t_1, ..., t_N)$  interpreted as an outcome in which allocation y is implemented, and player i pays the designer  $t_i$ . We have  $u_i((y, t_1, ..., t_N), \theta_i) = \tilde{u}_i(y, \theta_i) - t_i$ , for some arbitrary  $\tilde{u}_i(y, \theta_i)$  assumed non-negative and non-constant in  $\theta_i$ . The designer maximizes expected revenue. We will consider two cases. In the first case, the designer is satisfied with a mechanism that provides partial incentives to participate; we will show that this leads to the best simple mechanism being weakly dominated in a particularly blatant way, with revenue that is unbounded in the best case for the designer. In the second case, the superior mechanism will provide full incentives to participate.

Claim 2. The revenue-maximizing simple mechanism is weakly dominated by a complex mechanism with partial incentives to participate.

The superior complex mechanism exploits—in a very stark way—the possibility that agents lack strategic sophistication. The designer approaches some agent i and proposes to her the following additional bet: Agent i gets a large amount of money M if a coin lands on heads but pays the designer M if the coin lands on tails. The designer biases the coin so that tails has probability  $1 - \epsilon$  for an arbitrarily small  $\epsilon$ . Under our assumed solution concepts, the agent finds accepting the bet K-undominated because she evaluates her outcomes conditional on each realization of the randomization device: When M is sufficiently large, taking the bet dominates all other strategies conditional on the coin landing on heads. If the agent refuses to take the bet, the designer is still guaranteed the same revenue as in the original simple mechanism; and if the agent accepts the bet, the designer's expected revenue is unbounded.

It is known (see for example Ashlagi and Gonczarowski (2018) and Pycia and Troyan (2019)) that randomization cannot increase the designer's payoff within the class of simple mechanisms.<sup>25</sup> Interestingly, the above example shows that this does not imply that the designer should never randomize when facing unsophisticated agents. On the contrary, randomization can be used to purposefully confuse the agents in order to obtain a superior outcome, at least in some cases.

Even if agents are assumed to compute expectations with respect to the designer's randomization, the designer can still achieve an unbounded revenue in the best case of a complex mechanism when  $N \geq 2$ . The additional option for agent i has the same two outcomes for i, but the choice between them is made by some other agents j who is paid  $\epsilon > 0$  to choose the outcome in which agent i pays M. Accepting this modified "bet" is K-undominated for i because agent i is not assumed to believe that agent j will never play a dominated strategy (agents do not engage in iterative elimination of dominated strategies).

The above weakly-dominating mechanisms may seem unlikely to "work" in practice, in the sense that the additional strategic option offered in the complex mechanism can be seen as clearly "unattractive" for the agent. We offer two comments: First, similarly to how many results are interpreted in mechanism design, we view the value of these examples as illustrating the possibility that a simple mechanism may be dominated. Our construction is optimized for making the mathematical argument concise; there may exist more "subtle" ways to weakly dominate a simple mechanism. Second, anecdotally, <sup>26</sup> sellers frequently offer seemingly unattractive options to customers hoping to exploit their potential inability to rank these options as inferior. And in any case, the designer never loses by switching to a superior complex mechanism, so she may prefer the complex mechanism even if she thinks that the agent is very unlikely to choose the additional option.

A different criticism of the above complex mechanisms is that the agent will sometimes walk away with a negative payoff. We thus turn attention to the case when the complex mechanism is required to provide full incentives to participate. To simplify exposition, we consider the classical problem of allocating a single object to one of N ex-ante identical

<sup>&</sup>lt;sup>25</sup>For SP mechanisms, this is a consequence of our Definition 1, see Remark 1.

<sup>&</sup>lt;sup>26</sup>See, for example, Chernev et al. (2015) for a survey of results on choice overload.

bidders.<sup>27</sup>

Claim 3. Suppose that  $N \geq 2$ , and let  $\bar{u}$  be the highest possible valuation for the object. If it is not a revenue-maximizing simple mechanism to sequentially offer the object at a price of  $\bar{u}$  to all the players, then the best simple mechanism is weakly dominated by a complex mechanism with full incentives to participate.

The idea is that the designer can weakly dominate the best simple mechanism by approaching one player at the beginning of the game and offering her the best possible allocation at two potential prices: (i) the highest possible valuation for that allocation, or (ii) the highest possible valuation minus some  $\delta > 0$ ; which of the two prices is implemented depends on the choice of some other player who is given incentives to always choose the higher price (similarly as in the previous construction). Accepting the designer's offer is undominated for the highest type (and only the highest type if  $\delta$  is small enough) as long as it is possible that the she gets a payoff of 0 in some history in  $\Gamma$  (which is guaranteed by symmetry). At the same time, her payoff is non-negative in all possible histories no matter how she behaves, so full incentives to participate are provided. Finally, the assumption of Claim 3 guarantees that the designer was extracting less than  $\bar{u}$  from the highest type, so if the highest type accepts the offer, the designer receives a strictly higher revenue.

The assumption of Claim 3 cannot be completely relaxed. For a simple example, note that if all players have a value of  $\bar{u}$  for the object with probability one, then sequentially offering the object at a price of  $\bar{u}$  to all the players is an optimal simple mechanism that is *not* weakly dominated under the full incentives to participate (for it to be dominated, there would have to exist an on-path history in which some player is charged more than  $\bar{u}$  but that would be incompatible with full incentives to participate). In Subsection 3.5, we prove a general positive result for the case of N=1.

## 3.3 Inequity aversion in voting

Finally, we consider an environment without transfers. There are two agents and three alternatives:  $\mathcal{X} = \{a, b, c\}$ . Each agent's type can be represented as a ranking of the three alternatives. The distribution of types  $\pi$  is i.i.d. uniform. The designer is inequity

<sup>&</sup>lt;sup>27</sup>Note that the ascending clock auction with jump-bidding in Example 1 in the introduction provides full incentives to participate under OSP. This is because if type  $v \ge b$  makes a jump bid to b at price p < b (jump-bidding is dominated for all other types), then she gets a non-negative payoff after every possible history. Obviously, her payoff is also non-negative if she does not jump-bid.

averse in the following sense: the designer's payoff is 0 if one agent gets her best option and the other agent gets her worst option; it is 1 otherwise. By direct calculation, among simple mechanisms it is optimal to let the outcome be a without eliciting the preferences of the agents. For this mechanism, there are 8 type profiles (where one agent ranks a top and the other agent ranks a bottom) such that the designer obtains utility 0; thus, the designer obtains 7/9 in expectation.

Claim 4. The best simple mechanism in the above voting setting is weakly dominated.<sup>28</sup>

We construct the superior mechanism below. Starting from the simple mechanism of always implementing a, player i is given an additional option to let player -i choose from the menu  $\{b,c\}$ . In this new mechanism, (1) if player i ranks a at the top, player i will not choose the additional option; there are 4 type profiles (where agent i ranks a at the top and agent -i ranks a at the bottom) such that the designer obtains utility 0; (2) if agent i ranks a at the bottom, then agent i will take the additional option, in which case the designer obtains 1 regardless of agent -i's type; (3) if agent i's preference is bac, then agent i will be confused as to whether to take the additional option. If she does not, then the designer obtains utility 1 regardless of agent -i's type; if she does, then the designer obtains utility 0 if agent -i ranks c at the top; (4) similarly, if agent i's preference is cab, then agent i will be confused as to whether to take the additional option. If she does not, then the designer obtains utility 1 regardless of agent -i's type; if she does, the designer obtains utility 0 if agent -i ranks b at the top. Overall, in the worst-case scenario, there are 8 type profiles such that the designer obtains utility 0; if type bac or type cab does not take the additional option, the designer does strictly better than in the best simple mechanism.

#### 3.4 A general result

We now extract the key intuition from the examples to formulate a more abstract result providing sufficient conditions under which a given simple mechanism  $\Gamma$  is weakly dominated by a complex mechanism. Let  $\mathcal{Y} \subseteq \mathcal{X}$  and define

$$\Theta_i^{\mathcal{Y}} = \left\{ \theta_i \in \Theta_i : \max_{x \in \mathcal{Y}} u_i(x, \, \theta_i) > \min_{\bar{S}_{-i}} u_i(g(z(h_{\emptyset}, \, \boldsymbol{S}_i(\theta_i), \, \bar{S}_{-i})), \, \theta_i) \right\}.$$

<sup>&</sup>lt;sup>28</sup>This claim is proven directly without relying on Proposition 1.

That is,  $\Theta_i^{\mathcal{Y}}$  is the set of types of agent *i* that strictly prefer some outcome in  $\mathcal{Y}$  to the worst possible outcome in the simple mechanism  $\Gamma$ .

**Proposition 1.** Fix a simple mechanism  $\Gamma$ . Suppose that for any agent  $i \in \mathcal{N}$ , <sup>29</sup> there exists  $\mathcal{Y} \subseteq \mathcal{X}$  and a simple mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  played by agents -i with an outcome space  $\mathcal{Y}$  such that

- 1. Each outcome  $x \in \mathcal{Y}$  occurs at some terminal node in  $\Gamma^{\mathcal{Y}}_{-i}$ ;
- 2. For any  $\theta_i \in \Theta_i^{\mathcal{Y}} \neq \emptyset$ , the designer prefers (strictly for some  $\theta_i \in \Theta_i^{\mathcal{Y}}$ ) the conditional expected payoff from the mechanism  $\Gamma_{-i}^{\mathcal{Y}}$  to the conditional expected payoff from the mechanism  $\Gamma$ .

Then, the mechanism  $\Gamma$  is weakly dominated.

The proof can be found in Appendix A.2. The idea is straightforward: Given some initial simple mechanism  $\Gamma$ , agent i is offered an additional option that guarantees herself an outcome in  $\mathcal{Y}$  but at the cost of being excluded from further play. If this option is not chosen, play proceeds as in the original mechanism  $\Gamma$ . The key difference between a player and the designer when evaluating the additional option is that the player is only assumed to avoid K-dominated strategies while the designer is an expected-payoff maximizer. Therefore, the agent will not rule out a strategy that gives her a high enough payoff in some case, no matter how small the probability of that outcome. The designer exploits that and structures the set  $\mathcal{Y}$  and the mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  in a way that gives her a high payoff on average, while guaranteeing at least one contingency with a good outcome for player i.

### 3.5 An optimality foundation for posted-price mechanisms

While the message of this section is that weak dominance of the best simple mechanism is very common, we identify one environment in which it is not possible. Our result gives a strong optimality foundation for posted-price mechanisms, under the solution concepts of SP and OSP.

Claim 5. Suppose that the designer sells a single indivisible object to a single agent, attempting to maximize revenue. Assume that there exists a unique optimal simple

<sup>&</sup>lt;sup>29</sup>When  $K \in \{SP, OSP\}$ , it suffices that one such i exists.

mechanism (in which case it must be a posted price mechanism). Then, under SP and OSP, that mechanism is not weakly dominated by any complex mechanism with full incentives to participate.

The proof is relatively involved, so we relegate it to Appendix A.3. Both assumptions of Claim 5—that the optimal simple mechanism is unique (which holds generically) and that the solution concept is SP or OSP—are needed. In the Supplemental Material OA.1, we construct an example in which the optimal simple mechanism is not unique and we show that it is weakly dominated. Here, we show that the posted price mechanism is weakly dominated under SOSP, except in degenerate cases.

Let  $p^*$  be the revenue-maximizing price under  $\pi$  in the optimal SOSP mechanism. Suppose that  $p^*$  is not equal to the highest possible type under  $\pi$ . Then, a one-person descending clock auction with a minimum price  $p^*$  weakly dominates the posted price mechanism while providing full incentives to participate. This design is formally a sequential posted price mechanism in which the designer starts from a price equal to the highest type and drops the price by some sufficiently small  $\epsilon$  in every round, with the last price equal to  $p^*$ . In each round, the agent accepts or rejects an offer; rejecting the final offer  $p^*$  leads to no trade. All types  $\theta < p^*$  have an SOSP-dominant strategy to never buy (this strategy gives a non-negative payoff). For types  $\theta \geq p^*$ , it is SOSP-dominant to reject any price weakly above  $\theta$ , and SOSP-undominated to buy at any price strictly below  $\theta$  (again, in all cases, the payoff is non-negative). What makes that last choice undominated for the agent is that when she compares buying at a high price  $p \in (p^*, \theta)$ to rejecting p and waiting for a lower offer, she considers the worst case over her own future moves under SOSP; the worst case is that she will reject all offers and end up without the good, which is strictly worse than buying at p. The designer can only be better off, since trade prices are weakly above  $p^*$ ; she is strictly better off whenever the highest type decides to buy at a price strictly between  $p^*$  and her value. Thus, the posted price mechanism is weakly dominated.

# 4 Strong dominance

This section considers strong dominance of simple mechanisms. Section 4.1 discusses a sufficient condition for the best simple mechanism to be strongly dominated. Section 4.2 shows that strong dominance is possible even in single-agent mechanisms, via deliberate

use of randomization. Section 4.3 provides a condition under which the optimal simple mechanism is not strongly dominated. Throughout, we fix a solution concept  $K \in \{SP, OSP, SOSP\}$ . Unless stated otherwise, our results hold for any such K.

#### 4.1 Simple mechanisms can be overly restrictive

In this section, we discuss a certain weakness of simple mechanisms—they can be overly restrictive by requiring that no type should be confused. In some settings, the presence of certain preference types implies that the set of outcomes implementable by simple mechanisms is small. However, the behavior of some of these types could be insignificant for the designer, (i) either because they do not contribute to the designer's payoff, (ii) or because they have low probability. In such cases, the designer may want to impose simplicity only for a subset of types so that more outcomes could be implemented conditional on these types (with the remaining types being potentially confused). This subsection studies this tradeoff and shows that the designer might prefer a complex mechanism for either of these two reasons mentioned above.

To formalize this idea, we introduce a property that we call the accommodation of additional types (AAT). We show that if the AAT property is violated, then there exists either a payoff function for the designer or a distribution of types such that the best simple mechanism is strongly dominated.

Fixing the type space  $\Theta$  and players' preferences (the "implementation environment"), we say that an outcome  $\lambda: \Theta \to \Delta(\mathcal{X})$  is simply-implementable if there exists a simple mechanism  $\Gamma$  whose equilibrium leads to the outcome  $\lambda(\theta)$  whenever the realized type profile is  $\theta$ . We let  $\Lambda(\Theta)$  denote the set of simply-implementable outcomes on the type space  $\Theta$ . We denote by  $\Theta \setminus \{\theta_i\}$  the type space  $\Theta_1 \times \ldots \times (\Theta_i \setminus \{\theta_i\}) \times \ldots \times \Theta_N$ .

**Definition 8.** An implementation environment has the accommodation of additional types (AAT) property if for any i, any  $\theta_i \in \Theta_i$ , and any outcome  $\lambda \in \Lambda(\Theta \setminus \{\theta_i\})$ , there exists  $\bar{\lambda} \in \Lambda(\Theta)$  such that  $\bar{\lambda}|_{\Theta \setminus \{\theta_i\}} = \lambda$ .<sup>30</sup>

The AAT property says that given an arbitrary simple mechanism on the type space  $\Theta \setminus \{\theta_i\}$ , we can always "accommodate" an additional type  $\theta_i$  of agent i, that is, assign a K-dominant strategy to  $\theta_i$  while keeping the outcome of the mechanism for the remaining types unchanged.

 $<sup>^{30} \</sup>text{We write } \bar{\lambda}|_{\Theta \backslash \{\theta_i\}} \text{ for the outcome } \bar{\lambda} \text{ restricted to } \Theta \backslash \{\theta_i\}.$ 

By pairing an implementation environment with the designer's objective v (the "design environment"), we can formulate a weaker version of AAT that only applies to designer's payoffs.

**Definition 9.** A design environment has the accommodation of additional types (AAT) property if for any i, any  $\theta_i \in \Theta_i$ , the maximized value of v over  $\Lambda(\Theta \setminus \{\theta_i\})$  and over  $\Lambda(\Theta)$  is the same under any distribution  $\pi$  supported on  $\Theta \setminus \{\theta_i\}$ .

Clearly, when AAT fails in some design environment, then it must also fail in the underlying implementation environment. The opposite is not true: failure of AAT in an implementation environment only implies that certain outcomes are no longer simply-implementable when the incentive constraints of an additional type  $\theta_i$  must be satisfied, but if maximizing v does not require accessing these outcomes, then AAT will still hold for the design environment.

**Proposition 2.** Suppose that the AAT property fails for some (i) implementation environment or (ii) design environment. Then, respectively,

- (i) for any full-support distribution of types, there exists a payoff function for the designer such that the best simple mechanism is strongly dominated;
- (ii) there exists a full-support distribution of types such that the best simple mechanism is strongly dominated.

The intuition behind Proposition 2 is straightforward. Suppose that the AAT property fails in an implementation environment when some type  $\theta_i$  is "added" to the type space  $\Theta_i \setminus \{\theta_i\}$ . Then, there exist objective functions for the designer that are maximized at some outcome that is simply-implementable on  $\Theta \setminus \{\theta_i\}$  but not on  $\Theta$ , and that do not depend "too much" on the outcome implemented for type  $\theta_i$ . Under such objective functions, the designer can do strictly better by effectively ignoring type  $\theta_i$ : She offers the same mechanism  $\Gamma$  that she would have offered if type  $\theta_i$  were not present. The mechanism is complex on  $\Theta$  because  $\theta_i$  is strategically confused. However, when the designer's payoff is not very sensitive to the outcome that occurs conditional on  $\theta_i$ ,  $\Gamma$  will strongly dominate the optimal simple mechanism on  $\Theta$ . When AAT fails in a design environment, the insignificance of type  $\theta_i$  for the designer's overall payoff can be achieved by choosing a distribution of types  $\pi$  under which  $\theta_i$  is very improbable. The proof of Proposition 2—which formalizes these arguments—can be found in Appendix A.4.

**Example 3.** Consider a voting environment with two agents and three alternatives,  $\mathcal{X} = \{a, b, c\}$ . Each agent's type can be represented as a ranking of the three alternatives. More specifically, each agent gets utility 1 if her top choice is implemented, 1/2 if her second choice is implemented, and 0 otherwise. The distribution of types  $\pi$  is i.i.d. uniform. The designer would like to maximize welfare but is Rawlsian and risk-averse: If  $u_i$  is the ex-post utility of agent i, then the designer's payoff is  $v(\min(u_1, u_2))$  for some strictly concave and increasing function v.

The best simple mechanism (for any  $K \in \{SP, OSP, SOSP\}$ ) is dictatorship with full range.<sup>31</sup> The outcome of that mechanism (with the row player being a dictator) is illustrated in Table 1.

Table 1: The best simple mechanism

	abc	acb	bac	bca	cab	cba
abc	a	a	a	a	a	a
acb	a	a	a	a	a	a
bac	b	b	b	b	b	b
bca	b	b	b	b	b	b
cab	c	c	c	c	c	c
cba	c	c	c	c	c	c

Table 2: A complex mechanism

	abc	acb	bac	bca	cab	cba
abc	a	a	a	a	a	a
acb	a	a	a	a	a	a
bac	b	b	b	b	b	b
bca	b	b	b	b	b	b
cab	a	a	a	c	c	c
cba(1)	a	a	a	c	c	c
cba(2)	b	b	b	b	b	b

Consider instead a delegation mechanism in which the designer delegates the choice of the menu to the row player, who chooses a menu for the column player to choose from (from a given set of menus that the designer has specified): The row player can (i) choose alternative a—menu  $\{a\}$ , (ii) choose alternative b—menu  $\{b\}$ , or (iii) eliminate alternative b and leave the choice between a and c to the column player—menu  $\{a, c\}$ .

Types abc, acb, bac, bca of the row player retain their K-dominant strategies. Type cab has a K-dominant strategy to choose the menu  $\{a,c\}$ . However, type cba does not have a K-dominant strategy: Both menu  $\{b\}$  and menu  $\{a,c\}$  are not K-dominated—the mechanism is complex. This is illustrated in Table 2.

However, whichever strategy type cba chooses, the expected payoff to the designer is strictly higher than in the best simple mechanism. Indeed, consider first the case in which type cba chooses menu  $\{a, c\}$ . Then, the difference in expected payoffs to the designer

<sup>&</sup>lt;sup>31</sup>It suffices to show this for the concept of SP since it is the most permissive one (and because dictatorship is a simple mechanism under all notions). Due to our Definition 1 of SP, it is without loss of optimality to look at deterministic mechanisms, and thus only ordinal preferences of players matter. Therefore, dictatorship is the only feasible SP mechanism by the Gibbard–Satterthwaite theorem. Finally, we can directly verify that giving the dictator full range is optimal for our objective function.

between the complex mechanism and the best simple mechanism (which can be calculated by comparing the cells of the two tables with different outcomes) is

$$\frac{1}{36} \times \left[ v\left(\frac{1}{2}\right) - v(0) \right] > 0.$$

Now, consider the case in which type cba chooses menu b. The difference in the expected payoffs of the designer is

$$\frac{1}{36} \times \left[ -2v(1) + 4v(1/2) - 2v(0) \right] > 0,$$

by strict concavity of v. Thus, the complex mechanism is guaranteed to yield a strictly higher expected payoff to the designer regardless of how type cba resolves her confusion.

Note that the AAT property is violated in the above implementation environment: The simple mechanism defined by the first 5 rows of Table 2 by excluding type cba cannot be extended to a simple mechanism with type cba added back. To see that, note that for type cba to have a K-dominant strategy, she must be able to secure c conditional on  $\theta_2 = bca$ ; she must also be able to secure b or c conditional on  $\theta_2 = bac$ . If type cba gets c in any contingency conditional on  $\theta_2 = bac$ , then type cab of player 1 no longer has a K-dominant strategy. Thus, type cba must get b conditional on  $\theta_2 = bac$ . But in that case, type bca of player 2 no longer has a K-dominant strategy. While type cba influences the designer's payoff, the designer nevertheless prefers to "ignore" that type by implementing a mechanism that is simple for the remaining types and that makes cba strategically confused.

More generally, the AAT property fails in many classical social choice environments. It is well known that the only SP mechanisms whose range contains at least three alternatives are dictatorships; however, there are nontrivial strategy-proof social choice functions on restricted domains. Indeed, much of the research on strategy-proof social choice can be seen as establishing possibility results for (various) restricted domains. Thus, the AAT property fails. Proposition 2 then implies that in the social choice environment, it might be beneficial to "ignore" some types and employ a social choice rule that is SP-implementable on a smaller domain, rather than using a SP mechanism on a larger domain. In particular, this will hold if the "problematic" types occur with

 $<sup>^{32}</sup>$ We refer interested readers to Barberà (2010) for a survey on strategy-proof social choice.

sufficiently low probability. For a concrete example, it is known that a social choice function on profiles of single-peaked preferences over a totally ordered set is strategy-proof if and only if it is a generalized median voter scheme. If the designer finds the outcome of some generalized median voter scheme more desirable than that of a dictatorship, and the probability that the true type profile is contained in the set of single-peaked preferences is high enough, then the generalized median voter scheme strongly dominates the best simple mechanism on the full domain. Similar examples can be found for the notions of OSP and SOSP.<sup>33</sup>

We note that AAT holds in any environment with a single agent. The result is immediate: A simple mechanism for a single agent must effectively consist in the agent choosing her most preferred outcome from some (potentially stochastic) menu. Thus, we can always accommodate an additional type without adjusting the extensive-form mechanism.

Claim 6. The AAT property holds in any environment with a single agent.

#### 4.2 Strong dominance with a single agent

Claim 6 in the previous subsection showed that the best simple mechanism with a single agent cannot be strongly dominated due to failure of the AAT property. Moreover, in the absence of any opponents, it may seem that the agent's strategic problem is necessarily trivial. Nevertheless, we prove that strong dominance is possible even in that case.

Claim 7. There exist settings with a single agent in which the best simple mechanism is strongly dominated.

Clearly, the conclusion of Claim 7 is only possible when the agent is not assumed to be Bayesian; instead, as captured by our definition of SP, OSP, and SOSP, the agent compares different strategies by conditioning on every realization of the randomization device used by the designer. (We emphasize that Claim 7 relies on our non-standard definition of SP, see Remark 1.)

Here, we prove the claim for the solution concept of SP, since the example of strong dominance is particularly easy to construct. In Appendix A.6, we construct a more complicated example that works for all three solution concepts.

<sup>&</sup>lt;sup>33</sup>See Bade and Gonczarowski (2017) who characterize the class of OSP-implementable and unanimous social choice functions for single-peaked preferences, among other applications.

**Example 4** (Proof of Claim 7 for SP). The single agent has two possible types, u and d. Let  $\pi_u$  and  $\pi_d = 1 - \pi_u$  denote the respective probabilities of these two types. There are 4 alternatives;  $\mathcal{X} = \{U, U', D, D'\}$ . The preferences of the types are given by any cardinal utility with the following ordinal consequences:

- 1. type u: U' > D > U > D';
- 2. type d: D' > U' > D > U.

The designer receives a payoff of 1 if the type is  $j \in \{u, d\}$  and the outcome is J; she receives 1/2 when the type is j and the outcome is J'; in all other cases, she receives 0.

Consider the following mechanism  $\Gamma$  in which the designer uses a randomization device that has two equally likely outcomes "Heads" and "Tails":

	"Heads"	"Tails"
$s_u^H$	U	U'
$s_u^T$	U'	U
$s_d^H$	D	D'
$s_d^T$	D'	D

This mechanism has a simple interpretation: The player is asked to choose between a 50-50 lottery over U and U', and a 50-50 lottery over D and D'. However, the player must additionally choose the side of the coin leading to her preferred outcome.

The mechanism  $\Gamma$  is not SP according to Definition 1: type u is confused between strategies  $s_u^H$  and  $s_u^T$ , and type d is confused between strategies  $s_d^H$  and  $s_d^T$ . Put differently, the agent is able to recognize which lottery is better for which type, but she is confused about which side of the coin to "bet on." From the perspective of the designer, however, that confusion is irrelevant, since the choice of the side of the coin does not affect the marginal probabilities of the outcomes: The mechanism generates an expected payoff of 3/4 for the designer regardless of how the agent resolves her confusion, and regardless of the prior distribution of types.

It is not possible to implement the same outcome (a 50-50 lottery over U and U' conditional on u, and a 50-50 lottery over D and D' conditional on d) with a simple mechanism. We prove this by showing that when  $\pi_d = 2/3$ , the best SP mechanism is to always implement D which yields an expected payoff of only 2/3. This will also prove Claim 7 (for the case of SP).

We only have to prove that the designer cannot do better than 2/3 with a simple mechanism when  $\pi_d = 2/3$ . Note that randomization cannot increase the designer's payoff in the best simple mechanism. Indeed, for each SP mechanism in which the designer uses a randomization device, the designer can do weakly better by always selecting the same outcome of the randomization device; namely the one associated with the highest conditional expected payoff. Thus, it is without loss of generality to restrict attention to deterministic SP mechanisms. And since there is a single agent, any deterministic SP mechanism is equivalent to a menu of deterministic outcomes for the agent to choose from. To get an expected payoff of more than 2/3, the designer must offer D in the mechanism, and D must be chosen by type d (indeed, in the opposite case, the designer's expected payoff is upper bounded by  $1/3 + 2/3 \cdot 1/2 = 2/3$ ). However, in this case, neither D' nor U' can be offered, as then d would not choose D. Hence, either only D is offered, in which case the designer gets an expected payoff of 2/3, or D and U are offered, in which case type u also selects D, and the expected payoff to the designer is again 2/3.

Summarizing the example, the *only* way to implement a 50-50 lottery over U and U' conditional on u, and a 50-50 lottery over D and D' conditional on d is by creating strategic confusion (through the agent's choice of the side of the coin to bet on). To understand the construction of the complex mechanism, note that the dominance relationship forms a cycle:  $s_u^T$  dominates  $s_d^H$  for type u,  $s_d^H$  dominates  $s_u^H$  for type d,  $s_u^H$  dominates  $s_u^T$  for type u, and  $s_d^T$  dominates  $s_u^T$  for type d. However, no other pair of strategies are comparable, and thus no undominated strategy for any type can be dispensed with. For example, suppose that the designer uses a mechanism that only offers strategies  $s_u^H$  and  $s_d^H$ , that is, she predetermines the side of the coin leading to each given outcome. Then, type u will be confused, and hence she might play  $s_d^H$ , leading to the lottery over D and D' being implemented for both types.

The logic of this construction can be extended to the case of multiple players without relying on our assumption about how agents reason about randomization in the mechanism. In Supplemental Material OA.2, we construct an example with two players in which a similar cycle of dominance leads to the best simple mechanism being strongly dominated, even when  $\mathcal{X}$  is assumed to contain all possible lotteries over pure outcomes (so that, in line with Remark 1, it is as if agents evaluated all lotteries in the mechanism by their expected utility).<sup>34</sup>

 $<sup>^{34}</sup>$ See also Carroll (2014) for a construction involving a cycle of dominance with more than one player.

#### 4.3 An optimality foundation for simple mechanisms

In this subsection, we show that in a class of environments that we define below, the best simple mechanism is not strongly dominated. The key observation is that for any finite mechanism  $\Gamma$  (simple or complex), inf  $V(\Gamma)$  is weakly less than the maximum expected payoff the designer could obtain in a mechanism that only satisfies a subset of incentive constraints that correspond to the edges of an arbitrary tree in the type space. Thus, if the designer's expected payoff from the best simple mechanism is the same as that in the relaxed problem with incentive constraints that correspond to the edges of some tree in the type space, then the best simple mechanism is not strongly dominated.

Let G = (V, E) be a directed graph with vertex set V and edge set  $E \subseteq V \times V$ . A graph is called a (rooted) tree if it has exactly one vertex with no outgoing edges (called the "root") and exactly one path from every vertex to the root. For each agent i, consider a tree  $T_i = (\Theta_i, E_i)$  where  $E_i \subseteq \Theta_i \times \Theta_i$ . Each directed edge  $(\theta_i, \theta_i') \in E$ , also denoted  $\theta_i \to \theta_i'$ , corresponds to the incentive constraint that type  $\theta_i$  does not want to adopt the strategy of type  $\theta_i'$ . For each agent i, fix a tree  $T_i$ . The collection of trees  $\{T_i\}_{i\in\mathcal{N}}$  then defines a relaxed optimization problem in which the only incentive constraints are the ones that correspond to the edges on the trees. Formally, the IC-relaxed problem is to find a mechanism  $\Gamma$  that assigns a strategy  $S_i(\theta_i)$  to each type  $\theta_i$  of each player  $i \in \mathcal{N}$  and maximizes the designer's objective functions among all such mechanisms with the property that if  $\theta_i \to \theta_i'$ , then  $S_i(\theta_i') \prec_{\theta_i}^K S_i(\theta_i)$  (note that if  $T_i$  were not a tree but the complete graph, this would correspond to finding the optimal simple mechanism). We ignore participation constraints for now.

**Proposition 3.** Suppose that there exists a collection of trees  $\{T_i\}_{i\in\mathcal{N}}$  such that the designer's expected payoff from the IC-relaxed optimization problem corresponding to  $\{T_i\}_{i\in\mathcal{N}}$  is the same as from using the optimal simple mechanism. Then, the optimal simple mechanism is not strongly dominated.

We now explain how to incorporate participation constraints. In the IR-non-relaxed problem, the IR constraint (1) is imposed for every type of every player. In the IR-relaxed problem, the IR constraint (1) is only imposed for the root of each tree  $T_i$ .

**Proposition 3'.** Suppose that there exists a collection of trees  $\{T_i\}_{i\in\mathcal{N}}$  such that the designer's expected payoff from the (i) IR-relaxed and IC-relaxed or (ii) IR-non-relaxed and IC-relaxed optimization problem corresponding to  $\{T_i\}_{i\in\mathcal{N}}$  is the same as from using

the optimal simple mechanism with participation constraints. Then, the optimal simple mechanism is not strongly dominated by any mechanism with, respectively, (i) partial or (ii) full incentives to participate.

Proposition 3(3') is relatively abstract. Moreover, it does not offer any guidance on how to look for the "right" tree in the type space (for most choices of the trees, the relaxed problem will have a maximum that is not achievable by a simple mechanism, even if for some tree the maxima are the same). For illustration, we apply Proposition 3 to show that the optimal SP mechanism is not strongly dominated in many canonical settings in which the designer maximizes revenue. Since for any mechanism, a strategy that is not dominated is also not (S)OSP-dominated, whenever the optimal SP mechanism can be implemented via an (S)OSP mechanism, our analysis below implies that also the optimal (S)OSP mechanism is not strongly dominated. We also revisit Example 2 from the introduction.

We will show that the assumption (i) of Proposition 3' is satisfied when the uniform shortest-path tree condition holds and the distribution  $\pi$  is regular, as defined by Chen and Li (2018). Loosely speaking, these conditions ensure that, in the optimal SP mechanism, the set of binding constraints for agent i is independent of the types of agents other than i. To be rigorous and self contained, we formally define these terms in the Supplemental Material OA.3. Here, we note that the uniform shortest-path tree condition is of interest because a number of resource allocation problems satisfy it. First, it is satisfied in environments with one-dimensional types and single crossing. This fits many classical applications of mechanism design, including single-unit auctions (e.g., Myerson (1981)), public goods (e.g., Mailath and Postlewaite (1990)), and standard bilateral trade (e.g., Myerson and Satterthwaite (1983)). This covers Example 1 in the Introduction, showing that—under the assumptions we imposed there—the ascending clock auction cannot be strongly dominated. The uniform shortest-path tree condition also holds in multi-unit auctions with homogeneous or heterogeneous goods, as long as the agents' private values are one-dimensional. Second, the uniform shortest-path tree condition can also be satisfied in some multi-dimensional environments, such as the auction for capacity constrained bidders (see Malakhov and Vohra (2009)).

By the definition of the uniform shortest-path tree, for each agent, there exists a tree  $T_i$  such that the designer's expected payoff from using the best SP mechanism is the same as the IC-relaxed and IR-relaxed optimization problem corresponding to  $\{T_i\}_{i\in\mathcal{N}}$ .

Thus, Proposition 3' applies and we obtain the following corollary.

Corollary 1. In environments in which the uniform shortest-path tree condition holds and  $\pi$  is regular, the optimal SP mechanism is not strongly dominated by any mechanism with partial incentives to participate (hence, it is also not strongly dominated by any mechanism with full incentives to participate).

Example 2 in the Introduction shows that when the uniform shortest-path tree condition is violated, the conclusion of Corollary 1 can also fail.

Example 5 (Example 2 revisited). We consider the case of  $\kappa = 2/5$ . Recall that the best simple (OSP) mechanism gives the designer an expected profit of 1/5. It can be directly verified (by considering all possible trees for both players)<sup>35</sup> that the trees that yield the lowest value of the relaxed problem are  $T_A = \{\{0, 2/3\}, 0 \to 2/3\}$  and  $T_B = \{\{1/3, 1\}, 1 \to 1/3\}$ , that is, for dealer A we only impose the IC constraint that type 0 does not want to imitate type 2/3, and for dealer B that type 1 does not want to imitate type 1/3. The value of the IC-relaxed and IR-non-relaxed problem is 1/5. Thus, the best simple mechanism is *not* strongly dominated by any mechanism with full incentives to participate, by Proposition 3'.

However, we already know from Example 2 that the best simple mechanism is strongly dominated by a complex mechanism with partial incentives to participate. And indeed, the value of the IC-relaxed and IR-relaxed problem is 2/3 (under the relaxation that yields the minimal value). This is due to the failure of the uniform shortest-path tree condition: For dealer B, even when the low type's IR constraint holds, and the high type's IC constraint against deviation to the low type holds, this does not guarantee that the high type's IR constraint will be satisfied in the optimal mechanism for the relaxed problem.

The superior complex mechanism from Example 2 can be understood as partially capturing the benefits of the relaxed IR constraint of type 1 of dealer B. Indeed, if we removed the first offer to dealer B from the extensive-form mechanism, type 1/3's optimal choice would be unaffected (since accepting the first offer was obviously dominated for that type anyway), while type 1 would no longer be confused—she would follow the same strategy as type 1/3. However, type 1 would lose its (partial) incentives to participate

 $<sup>^{35}</sup>$ Here, we rely on the arguments developed in Appendix A.1 in order to use normal-form games in the analysis.

since following 1/3's strategy sometimes results in a strictly negative payoff for her. This reveals that the reason for making the first offer to dealer B in the complex mechanism is to ensure participation. By confusing type 1 of dealer B, the designer extracts more surplus with one undominated strategy ("reject the first offer but accept the next offer") while dominating non-participation with a second undominated strategy ("accept the first offer").

More generally, when the assumption of Proposition 3 or 3' fails, so that the relaxed problem has a higher value than the original one, it may sometimes be possible to move towards the value of the relaxed problem by letting some types be confused.  $\Box$ 

## 5 Conclusion

In mechanism design, it seems useful to distinguish (simple) mechanisms in which agents face a straightforward choice problem from (complex) mechanisms that require agents to engage in complex thinking if they want to determine their optimal strategy. The literature has made a great deal of progress in terms of formulating different notions of simplicity and characterizing mechanisms that are simple according to these notions. However, the understanding of the design of mechanisms with unsophisticated agents, as we argued in this paper, is far from complete. Indeed, in many cases, the designer might prefer mechanisms that are not simple, even under the adversarial selection that agents choose strategies that are the worst possible for the designer whenever agents cannot pin down their optimal strategy.

We suggest some directions for further research. An important avenue is the optimal design of mechanisms when agents are strategically unsophisticated. Our analysis indicates that the optimal design of mechanisms with unsophisticated agents could be challenging: One should not simply optimize over the class of simple mechanisms, at least not without a careful examination to establish their optimality; searching over all mechanisms present new challenges, as the designer has to take into account the worst-case scenario whenever agents are confused.

Relatedly, while we focused primarily on negative results throughout the paper, we expect that establishing optimality foundations for simple mechanisms—not being weakly or strongly dominated—might be a particularly promising research direction. This is because such a foundation can often be found by first solving an easier relaxed problem,

and then showing that the upper bound is achieved by a simple mechanism. In this paper, we extended the relaxation proposed first by Yamashita (2015) for SP mechanisms to show some instances in which such a strategy works.

Our analysis uses the intuitive criteria of weak dominance and strong dominance. For each solution concept K, the assumption about the agents' strategic sophistication is simply that each agent does not play a K-dominated strategy. It might also interesting to examine alternative notions of dominance of simple mechanisms; we could be more stringent in the requirement of a superior mechanism that dominates simple mechanisms. For example, when we assess the worst-case scenario of a complex mechanism, we make weak assumptions about how agents will behave; but when we assess the potential upside of the complex mechanism, we will only consider cases that involve agents acting "rationally enough." If we adopt this alternative notion, then for the solution concept of OSP, the ascending clock auction with jump bidding would no longer dominate the ascending clock auction (Example 1). Obviously, if a complex mechanism strongly dominated the best simple mechanism, the complex mechanism would still dominate the best simple mechanism under this alternative notion.

While we focused on the strategic dimension and worked with SP, OSP, and SOSP mechanisms in the private-value setting, the same exercise could be done for other notions of simplicity along the strategic dimension (such as the notion of "strategically simple mechanisms" defined by Börgers and Li (2019)), other dimensions of simplicity such as computational complexity (for example, the sheer size of the strategy space may make a mechanism difficult to understand), and interdependent-value settings.<sup>36</sup>

Finally, it would be interesting to conduct experimental tests of the best simple mechanism and the complex mechanism that weakly dominates it, such as the ascending-clock auction and the ascending-clock auction with jump bidding (in the private-value setting). Since the notion of weak dominance requires that the complex mechanism generates a strictly higher payoff to the designer in some but not all cases, it is useful

<sup>&</sup>lt;sup>36</sup>In the interdependent-value setting, Jehiel et al. (2006) and Yamashita and Zhu (2020) consider a designer who does not have realizable information about the agents' beliefs, while the agents are still assumed to play a Bayesian equilibrium. While the focus of these papers differs from ours, we note that Example 5.1 in Jehiel et al. (2006) and the analysis in Yamashita and Zhu (2020) could be used to show that the designer might prefer a mechanism that is not ex post incentive compatible to the optimal ex post incentive-compatible mechanism (and hence the optimal dominant-strategy mechanism) in the interdependent-value setting, under the assumption that agents do not play weakly dominated strategies. Yamashita (2015) shows that for revenue maximization in an interdependent-value auction, under certain conditions, a version of a second-price auction (which is neither dominant-strategy nor ex post incentive compatible) is optimal for implementation in weakly undominated strategies.

to find out whether and how often (and in which settings) these complex mechanisms do generate a strictly higher payoff. These findings could then be used to support or invalidate the superiority of these complex mechanisms.

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## A Appendix

## A.1 The optimal OSP mechanism for Example 2

Here, we show how to derive the optimal OSP mechanism in Example 2. It follows from Theorem 3.1 of Bade and Gonczarowski (2017) that it is without loss of optimality for OSP implementation to look at gradual revelation mechanisms (see Ashlagi and Gonczarowski (2018), Pycia and Troyan (2019) and Mackenzie (2019) for related revelation principles for OSP mechanisms). In our simple example with two players and two types, this means that we can assume that in the best OSP mechanism, at the first decision node, one of the players ("leader") makes a binary decision (with the two types choosing different actions—potentially leading to the same outcome—as part of their obviously dominant strategies), and then in each of the two possible histories, having observed the choice of the leader, the other player ("follower") makes a binary decision.

Therefore, an upper bound on the profit in the optimal OSP mechanism can be derived in the following way. When the follower chooses her optimal action, she already knows the action chosen by the leader. OSP requires that for any choice of the leader, each type of the follower must weakly prefer her equilibrium strategy (action) to choosing the alternative action. Thus, each type of the follower must have a standard dominant strategy in the normal-form representation of the game. In contrast, when the leader chooses her action at the initial decision node, it must be that the worst possible payoff from choosing her equilibrium action (over the two possible actions that can be selected by the follower in the subgame) is weakly higher than the best possible payoff from choosing the alternative action. In the normal-form representation of the game, this can be captured by requiring that the payoff from the equilibrium strategy of each type of the leader under any choice of the strategy  $S_f$  for the follower is weakly higher than the payoff from following the alternative strategy under any choice of the strategy  $S_f$  (where, importantly,  $S_f$  could be different from  $S_f'$ ).

Summarizing, an upper bound can be derived by using a normal-form game with the usual strategy-proof constraints, except that for the leader the constraints are strengthened in the way described above. Crucially, all these constraints are linear in the allocation and transfers, and so is the objective function of the designer (intuitively, we avoid taking the min and max in the definition of obvious dominance by iterating over all possible pairs of strategies  $(S_f, S'_f)$  for the follower when comparing two strategies of the leader). Thus, we obtain a linear program that can be numerically solved using a standard linear programming solver. For  $\kappa = 2/5$  (resp. 1/3 and 1/2), we obtain an upper bound of 1/5 (resp. 2/9 and 1/6), respectively. This upper bound is achieved by the OSP mechanism described in the example, proving its optimality.

The optimal SP mechanism can be derived by solving the standard linear-programming formulation numerically. For  $\kappa = 2/5$ , we obtain an optimal SP profit of 4/15. It can be achieved with the following direct mechanism, where the first entry in each cell indicates the direction of trade, the second entry is the seller price, and the third entry is the buyer price.

	$\theta_B = 1/3$	$\theta_B = 1$
$\theta_A = 0$	$A \to B, 0, \frac{1}{3}$	$A \rightarrow B, \frac{2}{3}, \frac{1}{3}$
$\theta_A = 2/3$	$B \to A, \frac{1}{3}, \frac{2}{3}$	$A \rightarrow B, \frac{2}{3}, 1$

The platform's profit is 1/3 conditional on all type profiles other than  $(\theta_A = 0, \theta_B = 1)$  for which the platform actually pays 1/3 to dealer B. Intuitively, this rebate to dealer B is an information rent for type  $\theta_B = 1$  that she must receive under strategy-proofness in order not to deviate to reporting  $\theta_B' = 1/3$  when dealer A's type is  $\theta_A = 0$ .

## A.2 Proof of Proposition 1 and Claims 1-3

We first prove Proposition 1. For each solution concept  $K \in \{\text{SP, OSP, SOSP}\}$ , we show that the simple mechanism is weakly dominated by explicitly constructing a complex mechanism that dominates it. The mechanism we construct can be interpreted as a delegation mechanism in which one agent is delegated to choose a simple mechanism (for the agents to play) from two simple mechanisms specified by the designer.<sup>37</sup> We present the proof for each solution concept separately.

**SP:** Fix a player *i*. We add a new node for player *i* from which play begins. Player *i* chooses from two options: "Choose  $\Gamma$ " or "Choose  $\Gamma_{-i}^{\mathcal{Y}}$ ." If she chooses  $\Gamma$ , the game tree is

 $<sup>^{37}</sup>$ These complex mechanisms are "type 1 strategically simple" according to the notion in Börgers and Li (2019).

the one associated with  $\Gamma$ . If she chooses  $\Gamma_{-i}^{\mathcal{Y}}$ , the game tree is the one associated with the game  $\Gamma_{-i}^{\mathcal{Y}}$ . We call this new composite game  $\Gamma'$ .

First, we claim that all players other than i have a dominant strategy in  $\Gamma'$ . This is immediate from the fact that each player -i has a dominant strategy in  $\Gamma$  and a dominant strategy in  $\Gamma^{\mathcal{Y}}_{-i}$ . Second, all types of player i not in  $\Theta^{\mathcal{Y}}_{i}$  also have a dominant strategy which is to choose  $\Gamma$ , and then follow the same strategy  $\mathbf{S}_{i}(\theta_{i})$  that was dominant for  $\Gamma$ . This is immediate from the fact that for these types, the best that can happen after choosing  $\Gamma^{\mathcal{Y}}_{-i}$  cannot be better than the worst possible outcome in  $\Gamma$  when they follow  $\mathbf{S}_{i}(\theta_{i})$ . Third, we claim that for all types  $\theta_{i} \in \Theta^{\mathcal{Y}}_{i}$ , the option to choose  $\Gamma^{\mathcal{Y}}_{-i}$  is SP-undominated. Indeed, fix the strategy profile  $\bar{S}_{-i}$  that yields the minimum in the definition of  $\Theta^{\mathcal{Y}}_{i}$ , and—using condition 1 in the proposition—let  $\bar{S}^{\mathcal{Y}}_{-i}$  be the profile that leads to the outcome  $x^{\star} \in \operatorname{argmax}_{x \in \mathcal{Y}} u_{i}(x, \theta_{i})$  in the game  $\Gamma^{\mathcal{Y}}_{-i}$ . Then, if players -i follow the strategy  $(\bar{S}_{-i}, \bar{S}^{\mathcal{Y}}_{-i})$  in  $\Gamma'$ , by definition of  $\Theta^{\mathcal{Y}}_{i}$ , the best response for type  $\theta_{i}$  is to choose the game  $\Gamma^{\mathcal{Y}}_{-i}$  at the first decision node.

Overall, it is an undominated strategy for types  $\theta_i \in \Theta_i^{\mathcal{Y}}$  to choose the game  $\Gamma_{-i}^{\mathcal{Y}}$  and when they do, play among players -i in that subgame proceeds as in the original game  $\Gamma_{-i}^{\mathcal{Y}}$ . By condition 1 in the proposition, the designer receives a higher (sometimes strictly) conditional expected payoff in that case, compared to the conditional expected payoff she would have received in the game  $\Gamma$ . Therefore, the game  $\Gamma$  is weakly dominated by  $\Gamma'$ .

**OSP:** The game  $\Gamma'$  is defined just as in the SP case. It suffices to prove that the three claims made in the second paragraph for the case of SP dominance continue to hold for OSP dominance. The first claim extends trivially. As for the second claim,  $\theta_i \notin \Theta_i^{\mathcal{Y}}$  is equivalent to saying that choosing the game  $\Gamma_{-i}^{\mathcal{Y}}$  is obviously dominated by the strategy "choose  $\Gamma$ " and then play according to  $\mathbf{S}_i(\theta_i)$ , since the unique point of departure for these two strategies is the first node for player i. Finally, the last claim follows from the fact that if a strategy is not SP-dominated for a type, then it is also not OSP-dominated.

**SOSP:** For this case, we modify the construction of the game  $\Gamma'$ . Pycia and Troyan (2019) prove that it is without loss of generality for the designer to choose a game form in which each player only moves once in every history, in the sense that for any SOSP mechanism, there exists a payoff equivalent SOSP mechanism (for all players and the designer) with that property. Thus, we can replace both  $\Gamma$  and  $\Gamma^{\mathcal{Y}}_{-i}$  with their payoff-equivalent versions in which each player moves at most once in every history. Moreover, Pycia and Troyan (2019) show that, without loss of generality, Nature's moves take place at the beginning of each history, if at all.

Let i be the player that moves first in the game  $\Gamma$  (if Nature moves first, i can depend on Nature's choice, and we apply the argument case-by-case, for every realization of Nature's choice). For that player, add a new potential action from the initial node which is to choose the game  $\Gamma^{\mathcal{Y}}_{-i}$ . If that action is taken by player i, play proceeds to the game tree  $\Gamma^{\mathcal{Y}}_{-i}$ . This defines a new game  $\Gamma'$ .

Note that in  $\Gamma'$  all players still move at most once in every history; player i has no moves in the game  $\Gamma^{\mathcal{Y}}_{-i}$ , while players -i either play the game  $\Gamma$  (in which they have at most one move) or the game  $\Gamma^{\mathcal{Y}}_{-i}$  (in which they have at most one move). Therefore, all the conclusions from the OSP case exceed to this case (since OSP and SOSP coincide if a player only moves once).

#### A.2.1 Proof of Claim 1

We will verify the assumptions of Proposition 1 with i being the seller (an analogous argument works for the buyer). Fixing  $\Gamma$ , let p be the posted price.<sup>38</sup> Let the set  $\mathcal{Y}$  contain two options: (1) No trade and (2) Trade at price  $p - \epsilon$  for some  $\epsilon > 0$ . The mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  consists in the buyer choosing one option from  $\mathcal{Y}$ . Clearly, that mechanism is simple for the buyer. Condition 1 in Proposition 1 is trivially satisfied.  $\Theta^{\mathcal{Y}}_i$  contains all types of the seller strictly below  $p - \epsilon$ . Finally, the second condition in Proposition 1 is satisfied as long as the buyer chooses option (2) with positive probability which is when her type is above  $p - \epsilon$ . Hence, as long as the type spaces for the buyer and the seller are not degenerate, we can find  $\epsilon$  for which the simple mechanism  $\Gamma$  is weakly dominated.

#### A.2.2 Proof of Claim 2

We first consider the construction for the case N=2 without relying on randomization. We then cover the case N=1.

Fix a simple mechanism  $\Gamma$ , with some expected revenue R. Suppose that  $N \geq 2$ . For any i, define  $\mathcal{Y} \subset \mathcal{X}$  to contain two outcomes: (1) Player i pays M to the designer while some player j receives  $\epsilon > 0$  from the designer, and (2) Player i receives M from the designer while player j receives 0 from the designer. The mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  is defined as having just one information node for player j who chooses between the two options in  $\mathcal{Y}$ . This satisfies condition 1 of Proposition 1. Moreover, this mechanism is simple because player j has a K-dominant strategy to select option (1). When M is large enough,  $\Theta^{\mathcal{Y}}_i = \Theta_i$ , and when additionally  $\epsilon$  is small enough, condition 2 of Proposition 1 holds, since the conditional expected payoff from the mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  is unbounded in M. Thus,

<sup>&</sup>lt;sup>38</sup>If that price is random, then we fix p to be the realization that yields the highest conditional expected payoff for the designer—this can only increase the expected surplus in the mechanism  $\Gamma$ .

by Proposition 1, the simple mechanism  $\Gamma$  is weakly dominated. It remains to check that the weakly-dominating complex mechanism provides partial incentives to participate. This is immediate from the proof of Proposition 1 that explicitly constructs the weakly-dominating complex mechanism  $\Gamma'$ : Intuitively, in  $\Gamma'$ , player i chooses between the games  $\Gamma$  and  $\Gamma^{\mathcal{Y}}_{-i}$ ; thus, since each type of player i had a K-dominant strategy satisfying (1) in  $\Gamma$ , each type continues to have at least one K-undominated strategy satisfying (1) in  $\Gamma'$ .

Consider the case N=1. Let  $\mathcal{Y}\subset\mathcal{X}$  contain two outcomes: (1) Player i pays M to the designer, and (2) Player i receives M from the designer. The mechanism  $\Gamma^{\mathcal{Y}}_{-i}$  is defined as having just one information node for Nature that chooses option (1) with probability  $1-\epsilon$  and option (2) with probability  $\epsilon$ . For  $\epsilon$  sufficiently small, by Proposition 1 and the same arguments as before, the mechanism  $\Gamma$  is weakly dominated. (Of course, this construction could also be used for general N.)

### A.2.3 Proof of Claim 3

Fix  $\Gamma$  that is a revenue-maximizing simple mechanism. Because of symmetry, we can assume without loss of optimality for the designer that  $\Gamma$  is symmetric as well, so we only have to check the assumptions of Proposition 1 for some player i. Define  $\mathcal{Y}$  to contain two options: (1) Player i wins the object and pays  $\bar{u}$  while some player j receives  $\epsilon > 0$ , and (2) Player i wins the object and pays  $\bar{u} - \delta$  while player j receives 0. In the game  $\Gamma_{-i}^{\mathcal{Y}}$ , player j selects one option from  $\mathcal{Y}$ .  $\Gamma_{-i}^{\mathcal{Y}}$  is thus simple, with player j always selecting option (1). Take  $\delta > 0$  small enough so that  $\Theta_i \cap (\bar{u} - \delta, \bar{u}) = \emptyset$  (using finiteness of the type space). Then, we have  $\Theta_i^{\mathcal{Y}} = \{\bar{u}\}\$ , because for all other types the payoff from  $\mathcal{Y}$  is strictly negative (while the original strategy in  $\Gamma$  guarantees a non-negative payoff).<sup>39</sup> Moreover, type  $\bar{u}$  always gets a non-negative payoff in  $\Gamma_{-i}^{\mathcal{Y}}$  so she has a full incentive to participate. Condition 1 of Proposition 1 holds, while condition 2 is satisfied as long as the mechanism  $\Gamma$  extracts less than  $\bar{u}$  from type  $\bar{u}$  of player i. Thus, by Proposition 1,  $\Gamma$  is weakly dominated as long as it is not a mechanism that offers a price  $\bar{u}$  to player i. By symmetry, the only case not covered by the argument is when  $\Gamma$  is payoff-equivalent to a mechanism that offers a price  $\bar{u}$  to all players in random order. However, such a mechanism is suboptimal by assumption.

### A.3 Proof of Claim 5

By assumption, the unique optimal simple mechanism is to offer some price  $p^*$ ; let  $\bar{v}$  denote the corresponding optimal expected revenue. Note that, by optimality, there must

 $<sup>^{39}\</sup>bar{u} \in \Theta_i^{\mathcal{Y}}$  as long as there is positive probability that she does not receive the object in  $\Gamma$  – that is guaranteed by the assumption that the players and  $\Gamma$  are symmetric.

exist a type  $\theta = p^*$  in  $\Theta$ .

Towards a contradiction, suppose that there exists a weakly dominating complex mechanism  $\Gamma$ . In particular, inf  $V(\Gamma) \geq \bar{v}$ . We claim that there exists a selection from the set of K-undominated strategies  $U_i^K(\cdot)$  in  $\Gamma$  such that (i) if every type plays the assigned strategy, the expected revenue for the designer is equal to at least inf  $V(\Gamma)$ , and (ii) local downward incentive constraints hold, that is, the strategy assigned to type  $\theta_i$  K-dominates (for  $\theta_i$ ) the strategy assigned to the highest type lower than  $\theta_i$ . Instead of proving this property directly, we refer the reader to Lemma 3 from Appendix A.7 that establishes a more general result. Moreover, it is well known that for revenue maximization with a single player under SP and OSP, only local downward incentive constraints bind in the optimal mechanism; hence, the expected revenue under the selection of undominated strategies described above is upper-bounded by  $\bar{v}$ . Since  $\bar{v} \leq \inf V(\Gamma)$ , we conclude that  $\inf V(\Gamma) = \bar{v}$  and there exists a selection from the set of undominated strategies which satisfies local downward incentive constraints and yields an expected revenue of  $\bar{v}$ .

By the assumption that the optimal simple mechanism is unique, the only way to generate the expected revenue of  $\bar{v}$  while satisfying local downward incentive constraints is for all types weakly above  $p^*$  to buy for sure at the expected price of  $p^*$ . By the full incentive to participate, type  $p^*$  must have a strategy under which she buys for sure at a price of  $p^*$  in every history. In particular,  $\Gamma$  must offer such a strategy. Moreover, again by the full incentive to participate, this strategy must be K-dominant for type  $p^*$ .

By the assumption that  $\Gamma$  weakly dominates the simple mechanism, there must exist a strategy  $S_1$  that is K-undominated for some type  $\theta$ , and a strategy for Nature  $S_0$  such that the agent pays  $q > p^*$  in the outcome  $g(z(h_{\emptyset}, S_0, S_1))$ . Because the strategy "buy for sure at a price of  $p^*$ " is available, for  $S_1$  to be K-undominated, it must sometimes (for some strategy of Nature) generate an outcome "buy with probability x at a price of r" that is strictly preferred by  $\theta$  to the outcome "buy for sure at a price of  $p^*$ ." At the same time, type  $p^*$  cannot derive positive utility from the outcome "buy with probability x at a price of r" as otherwise the strategy  $S_1$  would be undominated for type  $p^*$ , violating the full incentive to participate (since  $S_1$  sometimes leads to the agent paying  $q > p^*$ ). Moreover, note that  $\theta > p^*$ , by the full incentive to participate. We are ready to obtain a contradiction: By the above reasoning, we have  $\theta x - r > \theta - p^*$  and  $p^*x - r \le 0$ . This implies

$$\theta - p^* < \theta x - r < \theta x - p^* x = x(\theta - p^*) < \theta - p^*,$$

a contradiction.

<sup>&</sup>lt;sup>40</sup>Up to this point, the proof also works for SOSP. However, the next step does not.

## A.4 Proof of Proposition 2

Fix a solution concept K. If the AAT property fails in some implementation environment, then there exists a type  $\theta_i$  of agent i and an outcome  $\lambda \in \Lambda(\Theta \setminus \{\theta_i\})$  such that for all  $\bar{\lambda} \in \Lambda(\Theta)$ ,  $\bar{\lambda}|_{\Theta \setminus \{\theta_i\}} \neq \lambda$ . We can assume without loss of generality that there exists such  $\lambda$  that is deterministic for any  $\theta$ , since if the AAT property holds for all deterministic outcomes, then it also must hold for all stochastic outcomes. Define an objective function v of the designer by

$$v(x, \theta) = \mathbf{1}_{\{x = \lambda(\theta), \theta \in \Theta \setminus \{\theta_i\}\}}.$$

Clearly, the best simple mechanism on the type space  $\Theta \setminus \{\theta_i\}$  yields a payoff of 1 to the designer.

Fix an arbitrary full-support distribution of types  $\pi$ . With the objective function v on  $\Theta$ , the best simple mechanism on the type space  $\Theta$  must yield an optimal payoff strictly lower than 1-p, where p is the unconditional probability of type  $\theta_i$  under  $\pi$ , since it is not possible, by assumption, to implement the outcome  $\lambda$  on  $\Theta \setminus \{\theta_i\}$ . We denote the optimal payoff by b < 1-p.

We will show that there exists a complex mechanism that generates a strictly higher expected payoff on  $\Theta$  than b, regardless of how agents behave when they are confused. Let  $\Gamma$  be a mechanism that implements the outcome  $\lambda$  on  $\Theta \setminus \{\theta_i\}$ . Consider the same mechanism  $\Gamma$  on  $\Theta$ . By assumption,  $\Gamma$  is not simple on  $\Theta$  because type  $\theta_i$  is strategically confused. But because it is simple on  $\Theta \setminus \{\theta_i\}$ , all types in  $\Theta \setminus \{\theta_i\}$  still play the same (K-dominant) strategy. Therefore, no matter how type  $\theta_i$  behaves, the designer gets an expected payoff of at least 1 - p times 1, which is strictly higher than b, thereby strongly dominating the optimal simple mechanism.

Now suppose that the AAT property fails in some design environment. Then, there exists some distribution  $\pi'$  supported on  $\Theta \setminus \{\theta_i\}$  such that the best simple mechanism  $\Gamma$  on  $\Theta \setminus \{\theta_i\}$  gives an expected payoff b to the designer, while the best simple mechanism on  $\Theta$  (that is, with incentive constrains also imposed for type  $\theta_i$ ) gives some smaller expected payoff b' < b. Specify  $\pi$  on  $\Theta$  to coincide with  $\pi'$  conditional on  $\theta_i$  not realizing, and let  $\theta_i$  have prior probability  $\epsilon > 0$  under  $\pi$  (it does not matter for our argument how the types of remaining players are distributed conditional on  $\theta_i$ ). Then, the best simple mechanism under  $\pi$  can yield a payoff of at most  $(1 - \epsilon)b' + \epsilon \bar{v}$ , where  $\bar{v}$  is an upper bound on the designer's payoff when player i has type  $\theta_i$ . If the designer instead uses the same mechanism  $\Gamma$  that yields b on  $\Theta \setminus \{\theta_i\}$ , then her expected payoff is at least  $(1 - \epsilon)b + \epsilon v$ , where v is a lower bound on the designer's payoff when player v has type v. Thus, when v is small enough, v (which is complex on v) strongly dominates the best simple mechanism on v.

### A.5 Proof of Claim 6

We will explicitly construct a K-dominant strategy for the additional type  $\theta$  (we drop the subscript, since there is only one player) taking as given any simple mechanism  $\Gamma$  on  $\Theta \setminus \{\theta\}$ . Under our definitions of all three solution concepts, it is immediate (see Ashlagi and Gonczarowski (2018) and Pycia and Troyan (2019) for formal arguments) that we can obtain a mechanism  $\Gamma'$  that implements the same outcome as  $\Gamma$  by letting Nature move only once in the first node of the extensive form game. Moreover, the move by Nature is observed, and the agent has a single decision node at which she effectively selects an outcome x from some menu of choices  $\mathcal{M} \subset \mathcal{X}$ , where the menu  $\mathcal{M}$  may depend on Nature's choice. For any realized menu  $\mathcal{M}$ , specify that type  $\theta$  chooses her most preferred outcome from that menu. Clearly, this strategy is K-dominant for type  $\theta$ . At the same time, all remaining types preserve their K-dominant strategies since the extensive-form game  $\Gamma'$  has not been modified.

### A.6 Proof of Claim 7

We explicitly construct an example such that the best simple mechanism is strongly dominated for all  $K \in \{SP, OSP, SOSP\}$ . There is one player with three equally-likely types,  $\Theta = \{u, m, d\}, \mathcal{X} = \{U, U', M, M', D, D'\}$ , with the following preferences:

```
1. type u: M > U > D' > D > M' > U';
```

- 2. type m: D > M > U' > U > D' > M';
- 3. type d: U > D > M' > M > U' > D'.

The designer gets a utility of 1 if the type is  $j \in \{u, m, d\}$  and she implements outcome J or J'; she gets -1 otherwise.

**Lemma 1.** The best simple mechanism is to implement any fixed (possibly random) outcome; the expected payoff for the designer is -1/3.

It suffices to argue that this is true with SP as the solution concept. Recall that it is without loss of optimality for the designer to consider deterministic mechanisms when optimizing in the class of simple mechanisms. A deterministic SP mechanism for a single agent can be represented as a direct assignment of alternatives to types such that no type strictly prefers another type's assignment to her own. Suppose that there exists such an assignment that gives the designer an expected payoff strictly above -1/3. Then, at least two types  $j \in \{u, m, d\}$  must be assigned either J or J'. If any type j is assigned J', then no other alternative can be offered by the mechanism since j ranks J' last. Thus, the mechanism must offer J to two distinct types j. However, that's a contradiction because

at least one of these types would prefer the allocation of the other one, no matter which two types  $j \in \{u, m, d\}$  we choose.

To finish the proof, we construct a superior complex mechanism  $\Gamma$ .

**Lemma 2.** There exists a complex mechanism  $\Gamma$  that guarantees the designer an expected payoff of 0.

In the mechanism  $\Gamma$ , the designer uses a randomization device that has equally likely outcomes H and T, and offers three possible strategies to the agent, as represented by the following normal form:

	Н	T
$S_U$	U	D'
$S_M$	M	U'
$S_D$	D	M'

For any solution concept  $K \in \{\text{SP, OSP, SOSP}\}$ , type  $j \in \{u, m, d\}$  is confused between the two strategies offering J and J', respectively, with the former one (denoted  $S_J$ ) leading to the 2nd or 3rd alternative, and the latter to the 1st or 6th alternative. However, the remaining strategy is K-dominated for j by the strategy  $S_J$  as it leads to the 4th or 5th alternative. Regardless of how j resolves her strategic confusion, either Jor J' is implemented with probability 1/2, and thus the designer obtains 0 in expectation.

## A.7 Proof of Proposition 3 and 3'

We prove Proposition 3 first, and then explain how to modify the steps to obtain Proposition 3'. We start with a lemma that builds on the insight in Yamashita (2015, Theorem 1), and can be viewed as its generalization to a larger class of environments and the solution concepts of OSP and SOSP.

**Lemma 3.** For any mechanism  $\Gamma$ , inf  $V(\Gamma)$  is upper bounded by the value of the IC-relaxed problem corresponding to any fixed collection of trees  $\{T_i\}_{i\in\mathcal{N}}$  (as defined in Section 4.3).

Proof. Fix an arbitrary finite mechanism  $\Gamma$ , an agent i, and a tree  $T_i$ . Let  $T_i^+(\theta_i) = \{\theta_i': \theta_i' \to \theta_i\}$  be the set of types who point towards type  $\theta_i$  in the tree  $T_i$ . Consider the following procedure. Starting at the root of the tree  $T_i$ —which is some type  $\theta_i^0$  with no edges coming out of it—select any K-undominated strategy for  $\theta_i^0$ ,  $S_i^0 \in U_i^K(\theta_i^0)$ . Next, for any type  $\theta_i' \in T_i^+(\theta_i^0)$ , we can find an undominated strategy  $S_i' \in U_i^K(\theta_i')$  that either K-dominates  $S_i^0$  or is equal to  $S_i^0$  (this step uses finiteness of the mechanism; if  $S_i^0$  is not in  $U_i^K(\theta_i')$ , then there must exist a strategy in  $U_i^K(\theta_i')$  that K-dominates it). We proceed

inductively. Once some type  $\theta_i$  is assigned a strategy, we assign undominated strategies to all types  $T_i^+(\theta_i)$  that either equal or K-dominate the strategy assigned to  $\theta_i$ . Because  $T_i$  is a finite tree, this procedure must stop at some point, with every type being assigned a strategy. The same procedure is carried out for all other agents.

Because each type is assigned a strategy from  $U_i^K(\cdot)$  in the procedure, when all types execute their assigned strategies, the expected payoff  $\bar{v}$  to the designer must weakly exceed inf  $V(\Gamma)$  (which is the outcome of the designer-adversarial selection from  $U_i^K(\cdot)$ ). Moreover, the procedure guarantees that the mechanism—along with the assignment of strategies—is feasible for the IC-relaxed problem corresponding to the collection of trees  $\{T_i\}_{i\in\mathcal{N}}$ . Therefore,  $\bar{v}$ , and hence also inf  $V(\Gamma)$ , is weakly below the value of the IC-relaxed problem.

Proposition 3 follows immediately: By assumption, there exists a collection of trees  $\{T_i\}_{i\in\mathcal{N}}$  such that the value of the IC-relaxed problem corresponding to that collection is the same as the designer's expected payoff from the optimal simple mechanism. Hence, by applying Lemma 3 for the collection  $\{T_i\}_{i\in\mathcal{N}}$ , we conclude that there cannot exists a mechanism  $\Gamma$  with inf  $V(\Gamma)$  strictly above the expected payoff of the optimal simple mechanism, and hence the optimal simple mechanism is not strongly dominated.

We now explain how to incorporate participation constraints in the above procedure to obtain Proposition 3'. Suppose that the superior complex mechanism is required to provide partial incentives to participate. In that case, in the proof of Lemma 3, we can select an undominated strategy for type  $\theta_i^0$ —the root of the tree  $T_i$ —that satisfies the IR constraint (1) (such a strategy exits by the definition of partial incentives to participate). Thus, we can obtain a version of Lemma 3 that assumes that  $\Gamma$  provides partial incentives to participate and concludes that  $\inf V(\Gamma)$  is upper-bounded by the value of the IC-relaxed and IR-relaxed problem. If the superior complex mechanism is required to provide full incentives to participate, then we know that all undominated strategies must satisfy (1). Thus, we can obtain a version of Lemma 3 which assumes that  $\Gamma$  provides full incentives to participate and concludes that  $\inf V(\Gamma)$  is upper-bounded by the value of the IC-relaxed and IR-non-relaxed problem.

# Supplemental Material (Not For Publication)

## OA.1 Supplemental Material for Subsection 3.2

In this appendix, we show that the uniqueness assumption in Claim 5 is needed. We construct an example in which the optimal SP and OSP mechanism is not unique, and are weakly dominated.

The agent has value 1 or 2, with equal probabilities. The optimal SP and OSP mechanisms generate an expected revenue of 1 (which can be obtained by charging a price of 1, or a price of 2). The weakly dominating mechanism features Nature that plays H with some small probability  $\epsilon > 0$ , and T otherwise. The mechanism offers three strategies to the agent, where the first number in every cell is the probability of trade, and the second number is the payment to the designer.

	Н	T
$S_1$	(1, 3/2)	(1, 3/2)
$S_2$	(1,1)	(1, 2)
$S_3$	(1/2, 1/2)	(1/2, 1/2)

For type 2,  $S_1$  and  $S_2$  are undominated (playing  $S_3$  can be ruled out under the assumption that the designer can choose between strategies that are payoff equivalent, in this case  $S_1$  and  $S_3$ ). Type 1 has a dominant strategy  $S_3$ . Thus,  $\Gamma$  provides full incentives to participate. In the worst case, type 2 plays  $S_1$ , and the designer obtains an expected revenue of 1. In the best case, type 2 plays  $S_2$ , and the designer obtains an expected revenue of  $1/2 + 1/2 \cdot (2 - \epsilon)$  which can be arbitrarily close to 3/2.

# OA.2 Supplemental Material for Subsection 4.2

In this appendix, we extend the idea from Section 4.2 to a setting with multiple players who evaluate lotteries by expected utility.

Consider the example used in the proof of Claim 7 in Appendix A.6. We modify the example by introducing a second player who has two equally-likely types, H or T, and add an additional component to the designer's utility which makes it suboptimal to implement outcomes J' when the second player's type is H, and suboptimal to implement deterministic outcomes J when the second player's type is T, with  $J \in \{U, M, D\}$ . Then, we show that under a particular cardinal representation of player 1's ordinal preferences (as described in Appendix A.6), the optimal simple mechanism yields an expected payoff of approximately -1/6. The complex mechanism used in Appendix A.6 still guarantees an expected payoff of 0, and thus it strongly dominates the optimal simple mechanism.

Formally, assume that  $\mathcal{Y} = \{U, U', M, M', D, D'\}$  is the set of deterministic outcomes, and  $\mathcal{X}$  contains all possible lotteries over  $\mathcal{Y}$  (agents' cardinal utilities on  $\mathcal{Y}$  are extended to  $\mathcal{X}$  using expected utility). There are two players; Player 1 has the same ordinal preferences over  $\mathcal{Y}$  as before; Player 2 has two equally likely types, called H and T, but is indifferent between all alternatives in both cases (this particular choice suffices but is not necessary for our construction to work). To simplify the arguments, we will rely on payoffs from the extended real line. Consider the same objective function for the designer as in Appendix A.6 except that the designer's payoff is  $-\infty$  when (i) the second player's type is H and one of  $\{U', M', D'\}$  is implemented, or (ii) when the second player's type is T and one of  $\{U, M, D\}$  is implemented. Finally, for player 1 we choose any cardinal representation of her ordinal preferences with the best option yielding  $+\infty$  and the worst option yielding  $-\infty$ .

**Lemma 4.** The optimal simple mechanism gives the designer an expected payoff of at most -1/6.

As before, it suffices to show the claim for the optimal SP mechanism. By the revelation principle, the optimal SP mechanism is a direct mechanism in which it is incentive compatible for player 1 to report her type truthfully (player 2 always reports truthfully since she is indifferent between all possible outcomes). Let  $p_j^y$  be the probability of implementing outcome y for type j in the optimal mechanism when  $\theta_2 = H$ , and  $q_j^y$  be the probability of implementing outcome y for type j in the optimal mechanism when  $\theta_2 = T$ . By optimality of the mechanism, we must have  $p_j^y = 0$  for  $y \in \{U', M', D'\}$  and  $q_j^y = 0$  for  $k \in \{U, M, D\}$ . By incentive-compatibility, the following inequalities must hold:

$$\begin{aligned} p_u^M &\geq p_m^M, \\ p_m^D &\geq p_d^D, \\ p_d^U &\geq p_u^U. \end{aligned}$$

This implies that

$$p_u^U + p_d^D + p_m^M \le p_d^U + p_m^D + p_u^M \le 3 - (p_u^U + p_d^D + p_m^M) \implies p_u^U + p_d^D + p_m^M \le \frac{3}{2}.$$

Therefore, conditional on  $\theta_2 = H$ , the expected payoff for the designer cannot exceed 0.

Again by incentive-compatibility, we have

$$\begin{aligned} q_u^{U'} &\leq q_m^{U'}, \ q_d^{U'} \\ q_m^{M'} &\leq q_u^{M'}, \ q_d^{M'} \\ q_d^{D'} &\leq q_u^{D'}, \ q_m^{D'}. \end{aligned}$$

This implies that

$$\begin{split} 2(q_u^{U'} + q_m^{M'} + q_d^{D'}) & \leq q_m^{U'} + q_d^{U'} + q_u^{M'} + q_d^{M'} + q_u^{D'} + q_m^{D'} \leq 3 - (q_u^{U'} + q_m^{M'} + q_d^{D'}) \\ & \Longrightarrow q_u^{U'} + q_m^{M'} + q_d^{D'} \leq 1. \end{split}$$

Therefore, conditional on  $\theta_2 = T$ , the expected payoff for the designer cannot exceed -1/3. Overall, in expectation over  $\theta_2$ , the designer's payoff cannot exceed -1/6. (While not important for the proof, this upper bound is achieved by a mechanism that implements any of  $\{U', M', D'\}$  (regardless of the report of player 1), when  $\theta_2 = T$ ; and a 1/2 - 1/2 lottery between (i) M and U when  $\theta_1 = u$ , (ii) D and M when  $\theta_1 = m$ , and (iii) U and D when  $\theta_1 = d$ , when  $\theta_2 = H$ .)

**Lemma 5.** The complex mechanism  $\Gamma$  from Appendix A.6 guarantees the designer an expected payoff of 0, and thus strongly dominates the optimal simple mechanism.

The proof is immediate: Since we have not changed the ordinal preferences for player 1, the same set of strategies are K-undominated. Since player 2 is indifferent between all alternatives, the mechanism is simple for her and it is optimal to report her type truthfully.<sup>41</sup> Finally, the designer obtains the same payoff guarantee because her objective function is the same as in Appendix A.6 on the set of outcomes of  $\Gamma$ .

## OA.3 Supplemental Material for Subsection 4.3

In this appendix, we give a formal definition of the uniform shortest-path tree condition. We work in a quasi-linear setting as defined in Subsection 3.2, with X being the set of all (possibly random) physical allocations, and  $\mathcal{X} = X \times \mathbb{R}^N$ . We say that a decision rule  $g: \Theta \to X$  is strategy-proof if there exists a transfer scheme  $t = (t_1, ..., t_N)$  such that (g,t) is an SP mechanism (treated as a direct mechanism). The following standard lemma is due to Rochet (1987).

<sup>&</sup>lt;sup>41</sup>We could specify alternative preferences for player 2 that would make it a strict K-dominant strategy to report her type truthfully without affecting the previous claim. This is true, for example, if type H strictly prefers all outcomes in  $\{U, M, D\}$  to all outcomes in  $\{U', M', D'\}$ , and type T has the opposite preferences.

**Lemma 6.** A necessary and sufficient condition for a decision rule g to be strategy-proof is the following cyclical monotonicity condition:  $\forall i \in \mathcal{N}, \forall \theta_{-i} \in \Theta_{-i}, \text{ and for every sequence}$  of types  $(\theta_{i,1}, \theta_{i,2}, \dots, \theta_{i,m})$  with  $\theta_{i,m} = \theta_{i,1}$ , we have

$$\sum_{n=1}^{m-1} \left[ u_i(g(\theta_{i,n}, \theta_{-i}), \theta_{i,n+1}) - u_i(g(\theta_{i,n}, \theta_{-i}), \theta_{i,n}) \right] \le 0.$$
 (OA.2)

We first collect some graph-theoretic terminology in Definition 10. Instead of imposing an IR constraint (1) for the root of each tree, we introduce a "dummy" type  $\theta_0$  (which will be the new root) that corresponds to not participating in the mechanism.

**Definition 10.** Fix a strategy-proof decision rule g, agent  $i \in \mathcal{N}$ , and  $\theta_{-i}$ .

- (1) The set of nodes is  $\Theta_i \cup \{\theta_0\}$ ;
- (2) For any  $\theta_i \in \Theta_i$  and  $\theta_i' \in \{\Theta_i \setminus \{\theta_i\}\} \cup \{\theta_0\}, \ \theta_i \to \theta_i'$  is a directed edge with length

$$u_i(g(\theta_i, \theta_{-i}), \theta_i) - u_i(g(\theta_i', \theta_{-i}), \theta_i);$$

(3) A path from the dummy type  $\theta_0$  to  $\theta_{i,m} \in \Theta_i$  is a sequence of nodes  $P = (\theta_0, \theta_{i,1}, \theta_{i,2}, \dots, \theta_{i,m})$  where (i)  $\theta_{i,j} \in \Theta_i$ ,  $\forall j = 1, 2, \dots, m$ ; and (ii)  $j \neq j' \implies \theta_{i,j} \neq \theta_{i,j'}$ .

**Definition 11.** Fix a strategy-proof decision rule g, agent  $i \in \mathcal{N}$ , and  $\theta_{-i}$ . A shortest-path tree is the union of shortest paths from the root to all nodes such that if  $\theta'_i$  belongs to the shortest path from the root  $\theta_0$  to some  $\theta_i \in \Theta_i$ , then the truncation of the path from  $\theta_0$  to  $\theta'_i$  defines the shortest path from  $\theta_0$  to  $\theta'_i$ .

**Definition 12.** We say that the uniform shortest-path tree condition holds if, for each agent  $i \in \mathcal{N}$ , there is the same shortest-path tree for all strategy-proof decision rules g and other agents' reports  $\theta_{-i}$ .

When the uniform shortest-path tree condition is satisfied, we can drop the dependence of the shortest-path tree on g and  $\theta_{-i}$ . Let  $E_s$  denote the collection of the directed edges in the uniform shortest-path tree.

Suppose that the uniform shortest-path tree condition holds. In the optimal SP mechanism design problem, it suffices to consider constraints that correspond to the edges on the uniform shortest-path tree, subject to the decision rule g satisfying the cyclical monotonicity constraint (OA.2). As is standard in the mechanism design literature, we first consider the following relaxed problem, in which we ignore the cyclical monotonicity constraint. A regularity condition on  $\pi$  is then imposed to ensure that some optimal

decision rule  $g^*$  that solves the relaxed maximization problem automatically satisfies the cyclical monotonicity constraint.

$$\max_{g(\cdot) \in X, t_i(\cdot)} \sum_{\theta \in \Theta} \pi(\theta) \sum_{i \in \mathcal{N}} t_i(\theta)$$
 (SP-relaxed) subject to  $\forall i \in \mathcal{N}, \ \forall (\theta_i, \theta_i') \in E_s, \ \forall \theta_{-i} \in \Theta_{-i},$  
$$u_i(g(\theta_i, \theta_{-i}), \theta_i) - t_i(\theta_i, \theta_{-i}) \ge u_i(g(\theta_i', \theta_{-i}), \theta_i) - t_i(\theta_i', \theta_{-i}).$$

**Definition 13.** We say that  $\pi$  is regular if the cyclical monotonicity constraint (OA.2) is automatically satisfied for some  $g^*$  that solves the optimization problem (SP-relaxed).<sup>42</sup>

<sup>&</sup>lt;sup>42</sup>To the best of our knowledge, there is no formal definition of regularity in the general environments. Our definition of regularity captures how it has been used in the literature; see for example, Myerson (1981) and Chung and Ely (2007). See Chen and Li (2018) for the primitive condition for the regularity condition in a variety of settings.