Credible Mechanisms^{*}

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Abstract

Consider an extensive-form mechanism, run by an auctioneer who communicates sequentially and privately with agents. Suppose the auctioneer can deviate from the rules provided that no single agent detects the deviation. A mechanism is *credible* if it is incentive-compatible for the auctioneer to follow the rules. We study the optimal auctions in which only winners pay, under symmetric independent private values. The first-price auction is the unique credible static mechanism. The ascending auction is the unique credible strategy-proof mechanism.

Keywords: Mechanism design, auction, credible, strategy-proof, sealed-bid.

JEL classification codes: D44, D47, D82

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1 Introduction

The standard mechanism design paradigm assumes that the auctioneer has full commitment. She binds herself to follow the rules, and cannot deviate after observing the bids, even when it is profitable *ex post* to renege (McAfee and McMillan, 1987). This contrasts starkly with the way we model participants; incentive compatibility "requires that no one should find it profitable to "cheat," where cheating is defined as behavior that can be made to look "legal" by a misrepresentation of a participant's preferences or endowment" (Hurwicz, 1972).

In this paper, we study incentive compatibility for the auctioneer. We require that the auctioneer, having promised in advance to abide by certain rules, should not find it profitable to "cheat", where cheating is defined as behavior that can be made to look "legal" to each participant by misrepresenting the preferences of the other participants. For instance, in a second-price auction, the auctioneer can profit by exaggerating the secondhighest bid. Thus, as Vickrey (1961) observes, the first-price auction is "automatically self-policing", while the second-price auction requires special arrangements that tie the auctioneer's hands.

To proceed, we must choose a communication structure for the bigger game played by the bidders and the auctioneer. Clearly, if the bidders simultaneously and publicly announce their bids, then the problem is trivial, and reduces to the case of full commitment. However, simultaneous public announcements are uncommon in real-world auctions. Most bidders at high-stakes auction houses do not place bids audibly, and instead use secret signals that other bidders cannot detect. These signals "may be in the form of a wink, a nod, scratching an ear, lifting a pencil, tugging the coat of the auctioneer, or even staring into the auctioneer's eyes – all of them perfectly legal" (Cassady, 1967). Recently, many bidders have ceased to be present in the auction room at all, preferring to communicate privately from a distance. The Wall Street Journal reports, "Many auction rooms are sparsely attended these days despite widespread interest in the items being sold, with most bids coming in online or, even more commonly, by phone".¹ Christie's and Sotheby's are legally permitted to call out fake ('chandelier') bids to give the impression of higher demand; the New York Times reports that, because of this practice, "bidders have no way of knowing which offers are real".²

There are several reasons why real-world auctioneers accommodate private communication. First, bidders frequently desire privacy for reasons both intrinsic and strategic. A mobile operator may be unwilling to publicize its value for a band of spectrum, because its rivals will take advantage of this information.³ Second, auctioneers want to prevent col-

 $^{^1} Why auction rooms seem empty these days, The Wall Street Journal, June 15 2014.$

 $^{^2\,}Genteel\ auction\ houses\ turning\ aggressive,$ The New York Times, April 24 2000.

³Dworczak (2017) studies how post-auction strategic interactions affect what information auctioneers should publicly release. A participant in a spectrum auction in India reported, "Those in the war room

lusion. Thus, in some auctions, bidders are forbidden from conferring - they must submit their bids only to the auctioneer. For instance, the 2017 US wireless spectrum auction's rules state that bidders "are prohibited from communicating directly or indirectly any incentive auction applicant's bids or bidding strategies".⁴ In auctions for art or wine, the auctioneer typically does not reveal the identity of the winner, since keeping this private gives bidders incentives to defect from collusive arrangements (Ashenfelter, 1989). Third, in auctions that take place over the Internet, bidders are anonymous to each other, which prevents them from sharing information. An industry newsletter⁵ for online advertising auctions reports:

In a second-price auction, raising the price floors after the bids come in allows [online auctioneers] to make extra cash off unsuspecting buyers [...] This practice persists because neither the publisher nor the ad buyer has complete access to all the data involved in the transaction, so unless they get together and compare their data, publishers and buyers won't know for sure who their vendor is ripping off.

The second-price auction is incentive-compatible for the auctioneer only under strong assumptions about the communication structure, such as simultaneous public communication. In this paper, we instead assume that the auctioneer engages in sequential private communication with the bidders. This enables us to represent auction rules using the tractable and familiar machinery of extensive game forms.

Consider any *protocol*; a pair consisting of an extensive-form mechanism and a strategy profile for the agents. The auctioneer runs the mechanism as follows: Starting from the initial history, she picks up the telephone and conveys a message to the agent who is called to play (an information set), along with a set of acceptable replies (actions). The agent chooses a reply. The auctioneer keeps making telephone calls, sending messages and receiving replies, until she reaches a terminal history, whereupon she chooses the corresponding outcome and the game ends.

Suppose some utility function for the auctioneer. For instance, assume that the auctioneer wants revenue. Suppose that each agent intrinsically observes certain features of the outcome. For instance, each agent observes whether or not he wins the object, and how much he pays, but not how much other agents pay.

By participating in the protocol, each agent observes a sequence of communication between himself and the auctioneer and some features of the outcome. Even if the auctioneer

had to sign non-disclosure agreements to ensure we wouldn't talk about auction strategy and discussions to any one, during or after the auction." (Auction action: How telcos fought the bruising battle for spectrum, The Economic Times, March 30 2015.)

 $^{^{4}}$ Section 1.2205(b)

⁵How SSPs use deceptive price floors to squeeze ad buyers, Digiday, Sep 13 2017

deviates from her assigned strategy, agent *i*'s observation could still have an *innocent explanation*. That is, when the auctioneer plays by the rules, there exist types for the other agents that result in that same observation for i.

Given a protocol, some deviations may be safe, in the sense that for every type profile, each agent's observation has an innocent explanation. That is, every observation that an agent might have (under the deviation) is also an observation he might have when the auctioneer is running the mechanism. For instance, when a bidder bids \$100 in a secondprice auction, receives the object, and is charged \$99, that observation has an innocent explanation - it could be that the second-highest value was \$99. Thus, in a second-price auction, the auctioneer can safely deviate by exaggerating the second-highest bid.⁶

Instead of just choosing a different outcome, the auctioneer may also alter the way she communicates with agents. For example, consider a protocol in which the auctioneer acts as a middleman between one seller and one buyer. The seller chooses a price for the object, which the auctioneer tells to the buyer. The object is sold to the buyer at that price if and only if the buyer accepts, and the auctioneer takes a 10% commission. The auctioneer has a safe deviation - she can quote a higher price to the buyer, and pocket the difference if the buyer accepts.

A protocol is *credible* if running the mechanism is incentive-compatible for the auctioneer; that is, if the auctioneer prefers playing by the book to any safe deviation. This is a way to think about partial commitment power for any extensive-form mechanism.

Having defined the framework, we now turn to our main application. Most realworld auctions are variations on just a few canonical formats - the first-price auction, the ascending auction, and (more recently) the second-price auction (Cassady, 1967; McAfee and McMillan, 1987).⁷ The first-price auction is static ("sealed-bid") – each agent is called to play exactly once, and has no information about the history of play when selecting his action. This yields a substantial advantage: Sealed-bid auctions can be conducted rapidly and asynchronously, thus saving logistical costs.⁸ The ascending auction is strategyproof. Thus, it demands less strategic sophistication from bidders, and does not depend sensitively on bidders' beliefs (Wilson, 1987; Bergemann and Morris, 2005; Chung and Ely, 2007). The second-price auction is static and strategy-proof; it combines the virtues of the first-price auction and the ascending auction (Vickrey, 1961). However, many realworld auctioneers persist in running first-price auctions and ascending auctions, despite

⁶An auctioneer running second-price auctions in Connecticut admitted, "After some time in the business, I ran an auction with some high mail bids from an elderly gentleman who'd been a good customer of ours and obviously trusted us. My wife Melissa, who ran the business with me, stormed into my office the day after the sale, upset that I'd used his full bid on every lot, even when it was considerably higher than the second-highest bid." (Lucking-Reiley, 2000)

⁷The Dutch (descending) auction, in which the price falls until one bidder claims the object, is less prevalent (Krishna, 2010, p.2).

⁸Using data from U.S. Forest Service timber auctions, Athey et al. (2011) find that "sealed bid auctions attract more small bidders, shift the allocation toward these bidders, and can also generate higher revenue".

the invention of this (apparently) superior format (Rothkopf et al., 1990). Why is this so?

We study the implications of credibility in the independent private values (IPV) model (Myerson, 1981). For now, we assume that the value distributions are regular and symmetric, and restrict attention to auctions in which only winning bidders make (or receive) transfers. Thus, the second-price auction (with reserve) is the unique strategy-proof static optimal auction, by the Green-Laffont-Holmström theorem (Green and Laffont, 1977; Holmström, 1979).

The results that follow require us to bridge the discrete world of extensive game forms and the continuous world of optimal auctions. We suppress these technicalities in the introduction, but the reader should be aware that the first result holds 'in the limit', as a finite grid type space becomes arbitrarily fine.

Our first result is as follows: The first-price auction (with reserve) is the unique credible static optimal auction. This implies that, in the class of static mechanisms, we must choose between incentive-compatibility for the auctioneer and dominant strategies for the agents.

Static mechanisms include the direct revelation mechanisms, in which each agent simply reports his type. Thus, when designing credible protocols, restricting attention to revelation mechanisms loses generality. The problem is that revelation mechanisms reveal too much, too soon. For a bidder to have a dominant strategy, his payment must depend on the other bidders' types. If the auctioneer knows the entire type profile, and the winning bidder's payment depends on the other bidders' types, then the auctioneer can safely deviate to raise revenue. This makes it impossible to run a credible strategy-proof optimal auction. What happens when we look outside the class of revelation mechanisms - when we use the full richness of extensive forms to regulate who knows what, and when?

Our second result is as follows: The ascending auction (with an optimal reserve) is credible. Moreover, it is the *unique* credible strategy-proof optimal auction. No other extensive forms satisfy these criteria.

Notably, this result does not use open outcry bidding to ensure good behavior by the auctioneer. Given an ascending auction with an optimal reserve, the auctioneer prefers to follow the rules even though she communicates with each bidder individually by telephone. If the auctioneer places chandelier bids, then she runs the risk that bidders will quit. In equilibrium, this deters her from placing chandelier bids at any price above the reserve.

These results imply an auction trilemma. Static, strategy-proof, or credible: An optimal auction can have any two of these properties, but not all three at once. Moreover, picking two out of three characterizes each of the standard auction formats (first-price, second-price, and ascending). Figure 1 illustrates.

Next, we generalize these results by relaxing the assumption that only winners make transfers. The credible static auctions are now *twin-bid* auctions. This is a larger class

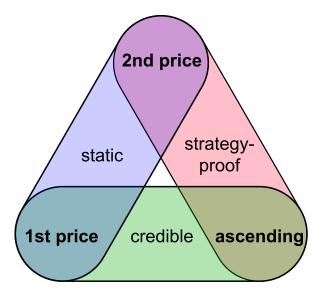


Figure 1: An auction trilemma: In the class of optimal auctions in which only the winner makes transfers, no auction is static, strategy-proof, and credible. Picking two out of three properties uniquely characterizes each standard format.

that includes all-pay auctions and first-price auctions with entry fees. In a twin-bid auction, each bid that an agent can place is associated with a weakly lower bid to be paid if that agent loses. Each agent pays his bid if he wins, and pays its lower 'twin' if he loses. If an agent wins the auction, then the difference between his bid and its twin is at least as large as the difference for any other agent. Under mild assumptions, twin-bid auctions are not strategy-proof.

We also relax the assumption that value distributions are symmetric. Under asymmetry, the static strategy-proof optimal auctions are *virtual* second-price auctions: each bid is scored as its corresponding virtual value, and the winner pays the least bid he could have reported while still having the highest score. Correspondingly, the credible strategy-proof optimal auctions are *virtual* ascending auctions: bids are scored according to their virtual values, so one bidder's price may rise faster than another's. Thus, general extensive forms enable the auctioneer to credibly reject higher bids in favor of lower bids, when it is optimal to do so.

For practical purposes, should an auction be static, strategy-proof, or credible? It depends. Some Internet advertising auctions must be conducted in milliseconds, so latency precludes the use of multi-round protocols. Strategy-proofness matters when bidders are inexperienced or have opportunities for rent-seeking espionage. Credibility matters especially when bidders are anonymous to each other or require that their bids be kept private. These real-world concerns are outside the model. Our purpose is not to elevate some criterion as essential, but to investigate which combinations are possible.

1.1 Related work

We are far from the first to conceive of games of imperfect information as being conducted by a central mediator under private communication. Von Neumann and Morgenstern exposit such games as being run by "an umpire who supervises the course of play", conveying to each player only such information as is required by the rules (Von Neumann and Morgenstern, 1953, p. 69-84). Similarly, Myerson (1986) considers multi-stage games in which "all players communicate confidentially with the mediator, so that no player directly observes the reports or recommendations of the other players."

The papers closest to ours are Dequiedt and Martimort (2015) and Li (2017). In Dequiedt and Martimort (2015), two agents simultaneously and privately report their types to the principal, who can misrepresent each agent's report to the other agent. If we restrict attention to revelation mechanisms, then our definition of credibility is equivalent to their requirement that the principal report truthfully. However, this restriction loses some generality, so our model instead permits the auctioneer to communicate sequentially with bidders by adopting extensive-form mechanisms. Li (2017) proposes a definition of bilateral commitment power, and also introduces the messaging game that we use here. The definition in Li (2017) is restricted to dominant-strategy mechanisms, whereas credibility allows for Bayes-Nash mechanisms. Also, Li (2017) does not model the incentives faced by the auctioneer, which is the entire subject of the present study.

Our paper is related to the literature on mechanisms with imperfect commitment, in which some parts of the outcome are chosen freely by the designer after observing the agents' reports (Baliga et al., 1997; Bester and Strausz, 2000, 2001). Our paper also relates to the literature that studies multi-period auction design with limited commitment (Milgrom, 1987; McAfee and Vincent, 1997; Skreta, 2006; Liu et al., 2014; Skreta, 2015). In this paradigm, the auctioneer chooses a mechanism in each period, but cannot commit today to the mechanisms that she will choose in future. In particular, if the object remains unsold, then the auctioneer may attempt to sell the object again. Essentially, these papers have a post-auction game, and require that the auctioneer is sequentially rational. Our machinery instead permits the auctioneer to misrepresent bidders' preferences during the auction.

Some papers model auctions as bargaining games in which the auctioneer cannot commit to close a sale (McAdams and Schwarz, 2007a; Vartiainen, 2013). These papers fix a particular stage game, in which players can solicit, make, or accept offers, and study equilibria of the repeated game. The auctioneer does not promise to obey any rules – she is constrained only by the structure of the repeated game. In our model, the auctioneer instead promises in advance to abide by certain rules, and can only deviate from those rules in ways that have innocent explanations. Thus, if the auctioneer promises to run a first-price auction, then she must conclude the auction after collecting the bids. By contrast, McAdams and Schwarz (2007a) and Vartiainen (2013) permit the auctioneer to restart play in the next period, exploiting the new information that she has learned.

Several papers study auctioneer cheating in specific auction formats, such as shillbidding in second-price auctions (McAdams and Schwarz, 2007b; Rothkopf and Harstad, 1995; Porter and Shoham, 2005) and in ascending auctions with common values (Chakraborty and Kosmopoulou, 2004; Lamy, 2009). Loertscher and Marx (2017) allow the auctioneer to choose when to stop the clocks in a two-sided clock auction. We contribute to this literature by providing a definition of auctioneer incentive-compatibility that is not tied to a particular format, and can thus be used as a design criterion.

Our paper contributes to the line of research that studies standard auction formats by relaxing various assumptions of the benchmark model (Milgrom and Weber, 1982; Maskin and Riley, 1984; Bulow et al., 1999; Fang and Morris, 2006; Hafalir and Krishna, 2008; Bergemann et al., 2017, 2018). While the usual approach is to compare the standard formats in terms of expected revenue, we instead characterize the standard formats with a few simple desiderata. Of course, the desiderata of Figure 1 do not exhaust the considerations of real-world auctioneers; factors such as interdependent values, risk aversion, and informational robustness importantly affect the choice of format.

2 Model

2.1 Definitions

The environment consists of:

- 1. A finite set of agents, N.
- 2. A set of outcomes, X.
- 3. A finite type space, $\Theta_N = \times_{i \in N} \Theta_i$.
- 4. A joint probability distribution $D: \Theta_N \to [0, 1]$.
- 5. Agent utilities $u_i: X \times \Theta_N \to \mathbb{R}$
- 6. A partition Ω_i of X for each $i \in N$. (ω_i denotes a cell of Ω_i .)

The partition Ω_i represents what agent *i directly observes* about the outcome. Conceptually, these partitions represent physical facts about the world, which are not objects of design. They capture the bare minimum that each agent observes about the outcome, regardless of the choice of mechanism.⁹

⁹In the application that follows, we will assume that each bidder in an auction knows how much he paid and whether he receives the object. In effect, this rules out the possibility that the auctioneer could hire pickpockets to raise revenue, or sell the object to multiple bidders by producing counterfeit copies.

We represent the rules of the mechanism as an extensive game form with imperfect information. This specifies the information that will be provided to each agent, the choices each agent will make, and the outcomes that will result, *assuming that the auctioneer follows the rules*. Crucially, we are not yet modeling the ways that the auctioneer can deviate.

Formally, a mechanism is an extensive game form with consequences in X. This is an extensive game form for which each terminal history is associated with some outcome. Formally, a mechanism G is a tuple $(H, \prec, P, A, \mathcal{A}, (\mathcal{I}_i)_{i \in N}, g)$, where each part of the tuple is as specified in Table 1. The full definition of extensive forms is familiar to most readers, so we relegate further detail to Appendix A. Let \mathcal{G} denote the set of all extensive game forms with consequences in X with finitely many histories and perfect recall.

Name	Notation	Representative element
histories	H	h
precedence relation over histories	\prec	
reflexive precedence relation	\preceq	
initial history	h_{\emptyset}	
terminal histories	Z	z
player called to play at h	P(h)	
actions	A	a
most recent action at h	$\mathcal{A}(h)$	
information sets for agent i	\mathcal{I}_i	I_i
outcome resulting from z	g(z)	
immediate successors of h	$\sigma(h)$	
actions available at I_i	$A(I_i)$	

Table 1: Notation for Extensive Game Forms

 S_i denotes a (pure) strategy: For each information set where agent *i* is called to play and each type of *i*, S_i chooses an action $S_i(I_i, \theta_i) \in A(I_i)$. $(S_i)_{i \in N} \equiv S_N$ denotes a strategy profile for the agents, for some $G \in \mathcal{G}$.

By convention, many papers make statements about mechanisms that implicitly refer to a particular equilibrium of the mechanism, such as the claim "second-price auctions are efficient". To reduce ambiguity, we will state our results explicitly for pairs (G, S_N) consisting of a mechanism and a strategy profile, which we refer to as a *protocol*.

Let $x^G(S_N, \theta_N)$ denote the outcome in G, when agents play according to S_N and the type profile is θ_N . Let $u_i^G(S_N, \theta_N) \equiv u_i(x^G(S_N, \theta_N), \theta_N)$.

Definition 1. (G, S_N) is **Bayesian incentive-compatible (BIC)** if, for all $i \in N$,

$$S_i \in \operatorname*{argmax}_{S'_i} \mathbb{E}_{\theta_N}[u_i^G(S'_i, S_{-i}, \theta_N)]$$
(1)

2.2 Pruning

At first glance, when constructing extensive-form mechanisms, it may seem important to keep track of off-path beliefs. However, if certain histories occur with zero probability under a BIC protocol (G, S_N) , then we can delete those histories from G without altering the mechanism's incentive properties. Similarly, if an agent is called to play, but reveals no outcome-relevant information about his type, we can skip that step without undermining incentives. Thus, we restrict attention to the class of *pruned* protocols.¹⁰ This technique allows us to remove redundant parts of the game tree, and implies cleaner definitions for the theorems that follow. In words, a pruned protocol has three properties.

- 1. For every history h, there exists some type profile such that h is on the path of play.
- 2. At every information set, there are at least two actions available (equivalently, every non-terminal history has at least two immediate successors).
- 3. If agent i is called to play at history h, then there are two types of i compatible with his actions so far, that could lead to different eventual outcomes.

Let $z(S_N, \theta_N)$ denote the terminal history that results from (S_N, θ_N) . Formally:

Definition 2. (G, S_N) is **pruned** if, for any history h:

- 1. There exists θ_N such that $h \leq z(S_N, \theta_N)$
- 2. If $h \notin Z$, then $|\sigma(h)| \ge 2$.
- 3. If $h \notin Z$, then for i = P(h), there exist $\theta_i, \theta'_i, \theta_{-i}$ such that
 - (a) $h \prec z(S_N, (\theta_i, \theta_{-i}))$
 - (b) $h \prec z(S_N, (\theta'_i, \theta_{-i}))$
 - (c) $x^G(S_N, (\theta_i, \theta_{-i})) \neq x^G(S_N, (\theta'_i, \theta_{-i}))$

By the next proposition, when our concern is to construct a BIC protocol, it is without loss of generality to consider only pruned protocols.

Proposition 1. If (G, S_N) is BIC, then there exists (G', S'_N) such that (G', S'_N) is pruned and BIC and for all θ_N , $x^{G'}(S'_N, \theta_N) = x^G(S_N, \theta_N)$.

Hence, from this point onwards we restrict attention to pruned (G, S_N) . Since every information set is reached with positive probability, any Bayes-Nash equilibrium in a pruned protocol survives equilibrium refinements that restrict off-path beliefs.

¹⁰This is stronger than the notion of pruning used in Li (2017), which includes only the first requirement.

2.3 A messaging game

We now explicitly model the auctioneer¹¹ as a player (denoted 0). The auctioneer has utility $u_0: X \times \Theta_N \to \mathbb{R}$.

Our goal is to study surreptitious deviations by the auctioneer. To do so, we must first take a stand on what each player knows at each point in the mechanism. Consider the messaging game, defined thus:

- 1. The auctioneer chooses to:
 - (a) Either: Select $x \in X$ and end the game.
 - (b) Or: Go to step 2.
- 2. The auctioneer chooses some agent $i \in N$ and sends a message along with a set of acceptable replies (m, R).
- 3. Agent *i* privately observes (m, R) and chooses $r \in R$.
- 4. The auctioneer privately observes r.
- 5. Go to step 1.

Assume the auctioneer has an arbitrarily rich message space M, from which she sends messages $m \in M$ and allows replies $R \in 2^M \setminus \emptyset$. At any prior round k, the auctioneer messaged $i^k \in N$ with (m^k, R^k) , and received reply $r^k \in R^k$.

Let S_0 denote the set of auctioneer pure strategies. A strategy for the auctioneer specifies what to do next, as a function of the entire history of communications: $S_0((i^k, m^k, R^k, r^k)_{k=1}^t) \in (N \times M \times (2^M \setminus \{\emptyset\})) \cup X$. We restrict these to send finitely many messages and (for each message) to allow finitely many replies.

A strategy for agent *i* specifies what reply to give at each point in the messaging game. Let m_i^k denote the *k*th message that the auctioneer sent to agent *i*, and similarly for R_i^k and r_i^k . Upon receiving a query, *i* chooses a reply, which depends on the past communication between *i* and the auctioneer $(m_i^{\tau}, R_i^{\tau}, r_i^{\tau})_{\tau=1}^{k-1}$, the current query (m_i^k, R_i^k) , and *i*'s type; that is, $S_i((m_i^{\tau}, R_i^{\tau}, r_i^{\tau})_{\tau=1}^{k-1}, m_i^k, R_i^k, \theta_i) \in R_i^{k, 12}$

Let T_i denote the total number of messages sent to i at the end of the messaging game. For any $S_0 \in \mathcal{S}_0$ and any S_N , (S_0, S_N) results in some sequence of communication between the auctioneer and agent i, $o_i^c \equiv (m_i^k, R_i^k, r_i^k)_{k=1}^{T_i}$ and some outcome x. Let o_i^x denote $\omega_i \in \Omega_i \mid x \in \omega_i$; this is what i directly observes about the outcome that the

¹¹We use the term 'auctioneer' to refer to the mediator, but this could be any mediator who runs a mechanism, such as a school choice authority or the National Resident Matching Program.

 $^{^{12}}$ Note the lack of calendar time: The agent observes the sequence of past communications between himself and the auctioneer, *not* a sequence of periods in which he either sees some communication or none.

auctioneer selected, as implied by the partition Ω_i . $o_i = (o_i^c, o_i^x)$ denotes an observation for agent *i*. $o_i(S_0, S_N, \theta_N)$ denotes the unique observation resulting from (S_0, S_N) , when the type profile is θ_N .

Given some extensive-form mechanism G, the auctioneer can 'carry out' G in the messaging game. That is, she can, starting from the initial history in $h_{\emptyset} \in H$, contact the agent who is called to play $P(h_{\emptyset})$, and send a message that corresponds to that information set, and allow replies that correspond to the actions. Upon receiving a reply, she can then contact the next agent, sending messages (information sets) and allowing replies (actions) as specified by G. Eventually, she will reach a terminal history $h \in Z \subseteq H$, whereupon she can choose the corresponding outcome and end the messaging game. We say that this 'rule-following' strategy **runs** G.

To define this formally, we use a one-to-one function λ , that takes as an input an information set in G or an action in G, and outputs an element of the message space M.

Definition 3. Take any $G = \langle H, \prec, P, A, \mathcal{A}, (\mathcal{I}_i)_{i \in N}, g \rangle$. S_0 **runs** G if there exists a oneto-one function $\lambda : (\bigcup_{i \in N} \mathcal{I}_i) \cup A \to M$ such that S_0 is described by the following algorithm, where we initialize $h := h_{\emptyset}$.

1. If $h \in Z$, terminate and select x = g(h).

2. Else:

- (a) Choose agent P(h) and send $(m, R) = (\lambda(I_i), \lambda(A(I_i)))$ for I_i such that $h \in I_i$.
- (b) Upon receiving $r \in R$, choose h' such that $\mathcal{A}(h') = \lambda^{-1}(r)$ and $h' \in \sigma(h)$. Set h := h' and go to step 1.

We use S_0^G to denote an auctioneer strategy that runs G.

Given S_0^G , for any S_i , we can define an equivalent strategy \tilde{S}_i for agent *i* in the messaging game. Given (m, R) and θ_i , \tilde{S}_i selects reply $\lambda(S_i(\lambda^{-1}(m), \theta_i)))$.¹³ We abuse notation and use S_i to denote both a strategy for agent *i* in *G*, and the equivalent strategy for agent *i* in the messaging game.

2.4 Credible mechanisms

In formulating the idea of incentive compatibility, Hurwicz (1972) writes:

In effect, our concept of incentive compatibility merely requires that no one should find it profitable to "cheat," where cheating is defined as behavior that can be made to look "legal" by a misrepresentation of a participant's preferences or endowment, with the proviso that the fictitious preferences should be within certain "plausible" limits.

¹³We specify \tilde{S}_i arbitrarily for communication sequences that are never observed under S_0^G .

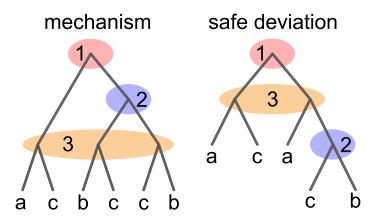


Figure 2: A mechanism and a deviation. If agent 1 cannot distinguish outcomes a and b, then the deviation is safe.

Here we modify Hurwicz's seminal idea to include incentive compatibility for the auctioneer. First, we say that some observation o_i has an "innocent explanation" (with respect to S_0^G) if there exist some types of other agents such that if they had those types and the auctioneer played S_0^G , o_i would be the observation of agent *i*.

Definition 4. Suppose the auctioneer promises to play S_0^G , the agents play S_N , and i's type is θ_i . Observation o'_i has an **innocent explanation** if there exists θ'_{-i} such that $o_i(S_0^G, S_N, (\theta_i, \theta'_{-i})) = o'_i$.

Definition 5. Suppose the auctioneer promises to play S_0^G and the agents play S_N . Then, an auctioneer strategy $S'_0 \in S_0$ is **safe** if for all agents $i \in N$ and all type profiles $\theta_N \in \Theta_N$, $o_i(S'_0, S_N, \theta_N)$ has an innocent explanation.

Let $\mathcal{S}_0^*(S_0^G, S_N) \equiv \{S_0' \mid S_0' \text{ is safe given promise } S_0^G \text{ and agent strategies } S_N\}$. The function $\mathcal{S}_0^*(\cdot, \cdot)$ takes a strategy for the auctioneer and a strategy profile for the agents as inputs and outputs the set of all strategies that the auctioneer can deviate to without being detected by a single agent.

Let $u_0(S_0, S_N, \theta_N)$ denote the auctioneer's utility in the messaging game, when the strategy profile is (S_0, S_N) and the type profile is θ_N . A protocol is credible if playing 'by the book' maximizes the auctioneer's expected utility.

Definition 6. (G, S_N) is credible if:

$$S_0^G \in \operatorname*{argmax}_{S_0 \in \mathcal{S}_0^*(S_0^G, S_N)} \mathbb{E}_{\theta_N}[u_0(S_0, S_N, \theta_N)]$$

$$\tag{2}$$

Definition 6 permits the auctioneer to misrepresent agents' actions to each other midway through the mechanism. The following example illustrates.

Example 1. Consider the mechanism on the left side of Figure 2. Each agent has one information set, two moves (left and right), and two types $(l_i \text{ and } r_i)$ that play the corre-

sponding moves. Agent 1 is assumed to observe whether the outcome is in the set $\{a, b\}$ or in $\{c\}$. Agents 2 and 3 perfectly observe the outcome.

The right side of Figure 2 illustrates a safe deviation: If agent 1 plays left, then the auctioneer plays 'by the book'. If agent 1 plays right, then instead of querying agent 2, the auctioneer queries agent 3. If agent 3 then plays left, the auctioneer chooses outcome a. If agent 3 plays right, only then does the auctioneer query agent 2, choosing c if 2 plays left and b if 2 plays right.

For every type profile, each agent's observation has an innocent explanation. The most interesting case is when the type profile is (r_1, l_2, l_3) . In this case, playing by the book results in outcome b, but the deviation results in outcome a. Agent 1 cannot distinguish between a and b, so (l_2, l_3) is an innocent explanation for 1. (l_1, l_3) is an innocent explanation for 2, and (l_1, l_2) is an innocent explanation for 3. Thus, if the auctioneer prefers outcome a to any other outcome, then the mechanism is not credible.

Notably, this deviation involves not just choosing different outcomes, but communicating differently even before a terminal history is reached. Indeed, when the type profile is (r_1, l_2, l_3) , the auctioneer can only get outcome a by deviating midway. If she waited until the end and then deviated to choose a, then agent 2's observation would not have an innocent explanation. Once agent 2 is called to play, he knows that outcome a should not occur.

Definition 6 takes the expectation of θ_N with respect to the *ex ante* distribution D, but it implicitly requires the auctioneer to best-respond to her *updated* beliefs in the course of running G. Recall that a strategy for the auctioneer is a complete contingent plan. Suppose that in the course of running G, the auctioneer discovers new information about agents' types, such that she can profitably change her continuation strategy. There exists a deviating strategy that adopts this new course of action contingent on the auctioneer discovering this information, and plays by the book otherwise. Thus, if S_0 is an *ex ante* best response, then its corresponding continuation strategies are also best responses along the equilibrium path-of-play.

When our concern is to construct a credible protocol, it is also without loss of generality to consider only pruned protocols.

Proposition 2. If (G, S_N) is credible and BIC, then there exists (G', S'_N) such that (G', S'_N) is pruned, credible, and BIC, and for all θ_N , $x^{G'}(S'_N, \theta_N) = x^G(S_N, \theta_N)$.

Observation 1. (G, S_N) is credible and BIC if and only if (S_0^G, S_N) is a Bayes-Nash equilibrium of the messaging game in which the auctioneer is constrained to play strategies in $\mathcal{S}_0^*(S_0^G, S_N)$.

Credibility restricts attention to 'promise-keeping' equilibria of the messaging game. However, any equilibrium can be turned into a promise-keeping equilibrium by altering the promise. **Observation 2.** If $S'_0 \in \mathcal{S}^*_0(S_0, S_N)$, then $\mathcal{S}^*_0(S'_0, S_N) \subseteq \mathcal{S}^*_0(S_0, S_N)$. Thus, if (S'_0, S_N) is a Bayes-Nash equilibrium given promise S_0 , then (S'_0, S_N) is a Bayes-Nash equilibrium given promise S'_0 .

Definition 6 is stated for pure strategies, but can be generalized to allow the auctioneer to mix. To do so, we simply extend the definition of extensive game forms so that Gincludes chance moves, and specify that o'_i has an innocent explanation to θ_i if there exists θ'_{-i} such that o'_i occurs with positive probability when the auctioneer plays S_0^G , the agents play S_N , and the type profile is (θ_i, θ'_{-i}) .

Here we restrict attention to protocols in which the auctioneer does not randomize. If some randomized protocol (G, S_N) is credible, then the deterministic protocol (G', S_N) in which we simply fix a particular realization of the randomization is also credible. Since (G, S_N) is credible, the auctioneer is indifferent between S_0^G and $S_0^{G'}$. Switching from Gto G' shrinks the set of innocent explanations, and therefore the set of safe deviations. The auctioneer preferred S_0^G to any safe deviation in the larger set, and therefore prefers $S_0^{G'}$ to any safe deviation in the smaller set, so (G', S_N) is credible.

3 Credible Optimal Auctions

We now study credible auctions in the independent private values (IPV) model (Myerson, 1981). We make this choice for two reasons: Firstly, this is a benchmark model in auction theory, so using it shows that the results are driven by credibility, and not by some hidden feature of an unusual model.¹⁴ Secondly, in the IPV model, revenue equivalence implies that the standard auctions start on an equal footing – the value distribution does not tip the scales in favor of a particular format, unlike the model with affiliated signals (Milgrom and Weber, 1982) or the model with risk aversion (Maskin and Riley, 1984).

Assume there are at least two bidders. An outcome $x = (y, t_N)$ consists of a winner $y \in N \cup \{0\}$ and a profile of payments (one for each bidder) $t_N \in \mathbb{R}^{|N|}$, so $X = (N \cup \{0\}) \times \mathbb{R}^{|N|}$.

We assume that type spaces are discrete $\Theta_i = \{\theta_i^1, \ldots, \theta_i^{K_i}\}$. This allows us to bypass the known paradoxes of extensive game forms with continuous time or infinite actions (Simon and Stinchcombe, 1989; Myerson and Reny, 2016). Each type is associated with a real number $v(\theta_i^k)$. Assume $v(\theta_i^1) \leq 0 < v(\theta_i^{K_i})$ and that $v(\theta_i^{k+1}) - v(\theta_i^k) > 0$. We will abuse notation slightly, and use θ_i^k to refer both to *i*'s *k*th type, and to the real number associated with that type.

Types are independently distributed, with probability mass function $f_i : \Theta_i \to (0, 1]$ and corresponding $F_i(\theta_i^k) = \sum_{l=1}^k f_i(\theta_i^l)$.

¹⁴As Brooks and Du (2018) observe, "The IPV model has been broadly accepted as a useful benchmark when values are private, but there is no comparably canonical model when values are common."

Agents have private values, that is:

$$u_i((y,t_N),\theta_N) = 1_{i=y}(\theta_i) - t_i \tag{3}$$

 Ω_i is as follows: Each bidder observes whether he wins the object and observes his own payment. That is, $(y, t_N), (y', t'_N) \in \omega_i$ if and only if:

- 1. Either: $y \neq i, y' \neq i$, and $t_i = t'_i$
- 2. Or: y = y' = i and $t_i = t'_i$.

The auctioneer desires revenue 15 :

$$u_0((y,t_N),\theta_N) = \sum_{i \in N} t_i \tag{4}$$

Let $\pi(G, S_N)$ denote the expected revenue of (G, S_N) .

The virtual values machinery in Myerson (1981) applies *mutatis mutandis* to the discrete setting. Suppose we choose (G, S_N) to maximize expected revenue subject to incentive compatibility and voluntary participation.

Definition 7. (G, S_N) is optimal if it maximizes $\pi(G, S_N)$ subject to the constraints:

- 1. Incentive compatibility: (G, S_N) is BIC.
- 2. Voluntary participation: For all *i*, there exists S'_i that ensures that *i* does not win and has a zero net transfer, regardless of S'_{-i} .¹⁶

 (G, S_N) is ϵ -optimal if it satisfies the constraints and the difference between $\pi(G, S_N)$ and the optimal expected revenue is no more than ϵ .

Definition 8. The virtual value of θ_i^k is:¹⁷

$$\eta_i(\theta_i^k) \equiv \theta_i - \frac{1 - F_i(\theta_i)}{f_i(\theta_i)} (\theta_i^{k+1} - \theta_i^k)$$
(5)

 $F_N = (F_i)_{i \in N}$ is **regular** if, for all i, $\eta_i(\theta_i)$ is strictly increasing.

As is well-known, optimal auctions have a characterization in terms of virtual values when certain constraints bind. $\check{u}_i^{G,S_N}(k,k')$ denotes the expected utility of agent *i* when

¹⁵The results that follow would require only small modifications if the auctioneer's payoff was a weighted average of revenue and social welfare.

¹⁶There are several standard ways of defining participation constraints, not entirely equivalent for our purposes. This definition appears in Maskin and Riley (1984). The existence of this non-participating strategy is used in the proof of Proposition 14.

¹⁷Since $1 - F_i(\theta_i)$ is equal to 0 at the upper bound, we can define $\theta_i^{K_i+1}$ arbitrarily for the purposes of Equation 11.

his type is θ_i^k and he plays as though his type is $\theta_i^{k'}$. $y^{G,S_N}(\theta_N)$ denotes the allocation at type profile θ_N . $y_i^{G,S_N}(\theta_N)$ is an indicator variable equal to 1 if *i* wins the object at θ_N and 0 otherwise. $t_i^{G,S_N}(\theta_N)$ is *i*'s transfer at θ_N .

Proposition 3. (Elkind, 2007) Assume F_N is regular and (G, S_N) satisfies the constraints in Definition 7. (G, S_N) is optimal if and only if:

- 1. Participation constraints bind for the lowest types. $\forall i : \check{u}_i^{G,S_N}(1,1) = 0$
- 2. Incentive constraints bind locally downward. $\forall i : \forall k \geq 2 : \check{u}_i^{G,S_N}(k,k) = \check{u}_i^{G,S_N}(k,k-1)$
- 3. The allocation maximizes virtual value. $\forall \theta_N$:
 - (a) If $\max_i \eta_i(\theta_i) > 0$, then $y^{G,S_N}(\theta_N) \in \operatorname{argmax}_i \eta_i(\theta_i)$.
 - (b) If $\eta_i(\theta_i) < 0$, then $i \neq y^{G,S_N}(\theta_N)$.

Even when the local incentive constraints are slack, the expected revenue is close to the expected virtual value of the winning bidder, provided that adjacent types are not far apart.

Proposition 4. If (G, S_N) is BIC, then:

$$0 \leq \underbrace{\mathbf{E}_{\theta_N} \left[\sum_{i \in N} y_i^{G, S_N}(\theta_N) \eta_i(\theta_i) \right]}_{expected \ virtual \ value} -\pi(G, S_N) - \underbrace{\sum_{i \in N} \check{u}_i^{G, S_N}(1, 1)}_{slack \ in \ lowest} \leq \max_{i \ 2 \leq k \leq K_i} \theta_i^k - \theta_i^{k-1}$$

$$(6)$$

Definition 9. F_N is symmetric if $\forall i, j : \forall k : K_i = K_j = K, \theta_i^k = \theta_j^k$, and $f_i(\theta_i^k) = f_j(\theta_j^k)$

Definition 10. (G, S_N) is winner-paying if $t_i^{G,S_N}(\theta_N) \neq 0$ only if $y_i^{G,S_N}(\theta_N) = 1$.

We start by studying the regular symmetric case. We also restrict attention to protocols which are winner-paying. These protocols respect reciprocity, in the sense that no party pays money unless he gets the object in return. We will later relax these restrictions.

For ease of exposition, we sometimes assume that the protocol breaks ties deterministically according to a fixed priority order.

Definition 11. Consider a strict total order \triangleright on N. This generates a strict total order on all agent types, as follows: $\theta_i \triangleright \theta_j$ if and only if $\theta_i \ge \theta_j$ and either $\theta_i > \theta_j$ or $i \triangleright j$. We also include a reserve ρ in this total order: $\theta_i \triangleright \rho$ if and only if $\theta_i \ge \rho$. We use min to denote the minimum of a set with respect to this \triangleright , and max similarly.

 (G, S_N) is **orderly** if, for some strict total order \triangleright on N and some reserve price ρ , i wins the object if and only if $\theta_i \triangleright \max_{\substack{i \neq i \\ j \neq i}} \theta_j$ and $\theta_i \triangleright \rho$.

3.1 Credible and static ϵ -optimal auctions

We now study credible and static ϵ -optimal auctions. We focus on ϵ -optimality because the Revenue Equivalence Theorem breaks slightly for finite type spaces. By Proposition 3, two auctions that result in the same allocation might have different expected revenue when the local incentive constraints are slack. However, by Proposition 4, this does not matter much when the type space is fine.

Definition 12. (G, S_N) is static if every agent has exactly one information set and for every terminal history z, there exists $h \prec z$ such that P(h) = i.

Consider the following mild generalization of first-price auctions: At most one agent can buy the object at a posted price. Each agent submits bids from some feasible set. If the special agent bids the posted price, then he wins for sure. Otherwise, the highest bidder wins and pays his bid.

Definition 13. (G, S_N) is a quasi-first-price auction if (G, S_N) is static, and there exists for each agent a bid function $b_i : A(I_i) \to \mathbb{R}$ and at most one special agent i^* with posted price p^* , such that:

- 1. Each agent pays his bid if he wins and pays nothing if he loses.
- 2. If some agent places a positive bid, then some agent wins the object.
- 3. If i^* bids the posted price $p^* = \max_{a \in A(I_{i^*})} b_{i^*}(a)$, then i^* wins the object. Otherwise, if i wins the object then i's bid is non-negative and at least as high as any other agent's bid.

We represent a reserve price by restricting the feasible bids $b_i(A(I_i))$ for each agent. If *i* never wins after playing action *a*, then we set $b_i(a)$ to be negative; such actions effectively decline to bid.

Theorem 1. Assume (G, S_N) is BIC and winner-paying. (G, S_N) is credible and static if and only if (G, S_N) is a quasi-first-price auction.

Proof. Suppose (G, S_N) is a quasi-first-price auction. (G, S_N) is static by definition. If i^* has bid the posted price, then the auctioneer has no discretion; every safe deviation sells the object to i^* at his bid. Otherwise, no safe deviation can sell to a bidder with a negative bid, and every safe deviation that sells the object involves charging some bidder his bid, so it is optimal to sell the object to the highest bidder (breaking ties arbitrarily). Thus, (G, S_N) is credible.

Suppose (G, S_N) is credible and static. Recall that (G, S_N) is pruned. If after some action a by bidder i, there are two prices that i might pay upon winning, the auctioneer can safely deviate to charge the higher price. Thus, for each action, if i might win after

playing that action, then there is a unique price that *i* might pay; this is $b_i(a)$. If *i* never wins after playing some action, then we set $b_i(a) < 0$.

At most one agent can have bids that win the object for sure; that agent is i^* . Since (G, S_N) is BIC and pruned, those actions are the set $\operatorname{argmax}_{a \in A(I_{i^*})} b_{i^*}(a)$ and we define $p^* = \max_{a \in A(I_{i^*})} b_{i^*}(a)$.

Consider any bid not placed i^* or not equal to $\max_{a \in A(I_{i^*})} b_{i^*}(a)$; let j be the identity of the agent who placed that bid. If that bid is positive, then the auctioneer does not keep the object; otherwise she could safely deviate to sell the object to j. There is an an innocent explanation if j loses. Thus, if j wins then j's bid is non-negative, since the auctioneer can safely deviate to keep the object. Moreover, if j wins then j's bid is at least as high as any other bid, or the auctioneer can safely deviate to sell the object to the highest bidder for strictly more revenue. Thus, (G, S_N) is a quasi-first-price auction. \Box

Clause 3 of Definition 13 is needed because posted prices are not ruled out by the requirement that the auction is credible and static. If the rules require that i^* wins for sure when he bids p^* , then the auctioneer cannot safely deviate to sell to a higher bidder. Of course, at most one bidder can face such a price, because at most one bidder can have actions that win for sure.

When F_N is regular and symmetric and the type space is fine, there exist quasi-firstprice auctions that are almost optimal. Moreover, if the auction maximizes virtual value, then the posted price is no less than the equilibrium bid of any agent whose type is two steps below the highest possible type. Thus, the posted-price 'discount' vanishes as the type space gets fine. The next proposition states this formally:

Proposition 5. Assume F_N is regular and symmetric. There exists a quasi-first-price auction that is orderly and ϵ -optimal, for $\epsilon = \max_{2 \le k \le K} \theta_i^k - \theta_i^{k-1}$. If a quasi-first-price auction is BIC and maximizes virtual value, then the posted price (if it exists) is at least $\max_{i \in N} b_i(S_i(I_i, \theta_i^{K-2}))$.

Proof. We now construct feasible bids that result in an ϵ -optimal first-price auction.

Set a reserve $\rho^* = \min_k \theta_i^k \mid \eta_i(\theta_i^k) > 0$. Consider a *second-price* auction with reserve ρ^* . We break ties between agents according to the order \triangleright . It is always a best-response for type θ_i to bid θ_i . Let $\tilde{b}_i(\theta_i)$ be θ_i 's expected payment conditional on winning under this protocol, and set $\tilde{b}_i(\theta_i) = -1$ if θ_i never wins. Observe that if $\theta_i > \theta_j$, then $\tilde{b}_i(\theta_i) \ge \tilde{b}_j(\theta_j)$. Similarly, if $\theta_i = \theta_j$ and i > j, then $\tilde{b}_i(\theta_i) \ge \tilde{b}_j(\theta_j)$.

Now consider a quasi-first-price auction in which $b_i(S_i(I_i, \theta_i)) = \tilde{b}_i(\theta_i)$ and we allocate the object in the same way. This new protocol is BIC and the participation constraints of the lowest types bind.¹⁸ Since F_N is regular and symmetric, the result-

¹⁸Recall our assumption that $\theta_i^1 \leq 0$, which implies that $\eta_i(\theta_i^1) < 0$. These agents never receive the object and always have zero transfers.

ing allocation maximizes virtual value. Thus, by Proposition 4, (G, S_N) is ϵ -optimal for $\epsilon = \max_{2 \le k \le K_i} \theta_i^k - \theta_i^{k-1}$.

Take any quasi-first-price price auction (G, S_N) that is BIC and maximizes virtual value. By construction, $\theta_{i^*}^K$ always wins and, since (G, S_N) maximizes virtual value, $\theta_{i^*}^{K-1}$ sometimes loses. Thus, the posted price is strictly greater than the bid placed by $\theta_{i^*}^{K-1}$, by BIC. That bid, in turn, must be at least $\max_{i \in N} b_i(S_i(I_i, \theta_i^{K-2}))$, since $\theta_{i^*}^{K-1}$ only wins when there is no strictly higher bid.

3.2 Credible and strategy-proof optimal auctions

We now characterize credible and strategy-proof optimal auctions.

Definition 14. (G, S_N) is strategy-proof if, for all $i \in N$, for all S'_{-i} :

$$S_i \in \operatorname*{argmax}_{S'_i} \mathbb{E}_{\theta_N}[u_i^G(S'_i, S'_{-i}, \theta_N)]$$
(7)

Definition 15. (G, S_N) is an ascending auction (with reserve price ρ) if:

- 1. All bidders start as **active**, with initial bids $(b_i)_{i \in N} := (\theta_i^1)_{i \in N}$.
- 2. The **high bidder** is the active bidder with the highest bid that is weakly above ρ (breaking ties according to \triangleright).
- 3. At each non-terminal history, some active bidder i (other than the high bidder) is called to play, and he chooses between actions that place a **bid** in Θ_i and actions that **quit**.
 - (a) Each bid is no less than the last bid that i placed.
 - (b) Each bid is no more than is necessary for i to become the high bidder.
 - (c) If i quits, then he is no longer active.
 - (d) At each information set, there is a unique action that places a bid, with one exception: If the reserve has not yet been met, and there is exactly one active bidder left, there may be multiple actions that place bids.¹⁹
- 4. *i's strategy specifies:*
 - (a) If i's type is strictly below a bid, he does not place that bid.
 - (b) If i's type is weakly above ρ and there is no high bidder, he places a bid.

¹⁹This exception is here because we will shortly state a characterization theorem. If there is exactly one bidder left and the reserve has not been met, then it is as though that bidder simply faces a posted price equal to the reserve. Provided that bidder knows that he wins for sure if he bids the reserve, distinct types above the reserve can take distinct actions without allowing the auctioneer to profitably deviate.

- (c) If i's type is above the current high bid (breaking ties with \triangleright), he places a bid.²⁰
- 5. The auction ends if one of three conditions obtains:
 - (a) If there are no active bidders. In that case, the object is not sold.
 - (b) If only the high bidder is active. In that case, the object is sold to the high bidder at his last bid.
 - (c) If the high bidder has bid θ_i^K , and no active bidder has higher tie-breaking priority. In that case, the object is sold to the high bidder at his last bid.

We pause to note a mild indeterminacy: When an active bidder is called to play, it could be that the available bid is not yet enough to become the high bidder. For instance, bidder i might choose whether to place a bid of 50 or quit, even though the current high bid is 100. In that case, types of i between 50 and 100 could place the bid or could quit. However, S_i is measurable with respect to i's information sets, so it must be that bidder i never quits when he might still win.

Observation 3. If F_N is regular and symmetric, then there exists an optimal ascending auction. In any ascending auction, participation constraints bind for the lowest types and incentive constraints bind locally downward. Given an optimal reserve $\rho^* = \min_k \theta_i^k \mid$ $\eta_i(\theta_i^k) > 0$, the ascending auction maximizes the virtual value of the winning bidder. By Proposition 3, such an auction is optimal.

The definition of extensive-form mechanisms permits the auctioneer to communicate with agents in any order, to convey any information (or no information) to the agent called to play, and to ask that agent to report any partition of his type space. Thus, there are many optimal auctions. However, the optimal auctions that are credible and strategy-proof are exactly the ascending auctions. To be precise:

Theorem 2. Assume F_N is regular and symmetric and (G, S_N) is orderly and optimal. (G, S_N) is credible and strategy-proof if and only if (G, S_N) is an ascending auction.

Proof overview. Suppose (G, S_N) is credible and strategy-proof. To prove that (G, S_N) is an ascending auction, we must show that for any extensive form that is not an ascending auction, there exists a profitable safe deviation for the auctioneer. A key feature of ascending auctions is that, at each history, the types of *i* that might win pool on the same action, unless every other agent has quit. This is stated precisely in Proposition 19, and is closely related to unconditional winner privacy as defined by Milgrom and Segal (2017). If at some history winning types do not pool, then the auctioneer can exploit one type by deviating to charge him a higher price. In the case of a second-price auction, the

²⁰Notice that, since *i*'s strategy must be measurable with respect to *i*'s information sets, this implies that if *i*'s type is above the *least possible high bid associated with that information set*, he places a bid.

auctioneer simply exaggerates the value of the second-highest bid. In general, however, the deviation must be more subtle in order to be safe - instead of just choosing a different outcome, the auctioneer may systematically misrepresent agents' actions midway through the extensive form. We construct an algorithm that produces a profitable safe deviation for any such extensive form.

Suppose (G, S_N) is an ascending auction. By inspection, it is strategy-proof. What remains is to show that it is credible. Suppose that the auctioneer has a profitable safe deviation. For every agent *i*, S_i remains a best response to any safe deviation by the auctioneer. Thus, since the auctioneer has a profitable safe deviation, she can openly commit to that deviation without altering the agents' incentives - we can define a new protocol (G', S'_N) that is BIC and yields strictly more expected revenue than (G, S_N) . But (G, S_N) is optimal, a contradiction. (The full proof is in the Appendix.)

By Theorem 1, restricting attention to revelation mechanisms forces a sharp choice between incentives for the auctioneer and strategy-proofness for the agents. Theorem 2 shows that allowing other extensive forms relaxes this trade-off.

Unlike Theorem 1, the characterization in Theorem 2 assumes optimality. This is not just a feature of our proof technique: the ascending auction is credible because it is optimal. If the type distributions are asymmetric, then the auctioneer may profitably deviate by enforcing bidder-specific reserve prices.²¹ We characterize the asymmetric case in Theorem 4.

While first-price auctions and ascending auctions seem to be disparate formats, they share a common feature. In both formats, if an agent might win the auction without being called to play again, then that agent knows exactly how much he will pay for the object. Thus, we can regard each agent as placing bids in the course of the auction, with the assurance that if he wins without further intervention, he will pay his bid. This 'pay-as-bid' feature is shared by all credible auctions:

Proposition 6 (Pay-as-bid). Assume (G, S_N) is credible. Suppose *i* is called to play at information set I_i , takes some action *a*, and might win without being called to play again. Then there is a unique price $t_i(I_i, a)$ that *i* will pay if he wins without being called to play again.

Proof. Suppose *i* might win without being called to play again, and there are two distinct prices $t_i < t'_i$ that *i* might pay in that circumstance. The auctioneer has a profitable safe deviation: when *i* is meant to pay t_i , she can deviate to charge t'_i , so (G, S_N) is not credible.

²¹Symmetric beliefs may seem like a knife-edge case. However, in some real-world auctions, strong bidders can mask their identities and bid through proxies so as to avoid discriminatory pricing. When faced with anonymous bidders, it is quite reasonable for auctioneers to hold symmetric beliefs.

Proposition 6 provides a consideration in favor of multi-stage auctions. Suppose we wish to have bidder i's payment depend on bidder j's private information. In order for the auction to be credible, bidder i must place a bid that incorporates that information, which requires i to learn that information during the auction. The converse of Proposition 6 is not true. For a counterexample, consider a 'pay-as-bid' static auction that allocates the object to the bidder who placed the second-highest bid.

3.3 Corollaries

Clearly, the quasi-first-price auction is not strategy-proof, except in the degenerate case that each agent has exactly one feasible bid. Thus, we have the following corollary.

Corollary 1 (Auction Trilemma). Assume F_N is regular and symmetric and (G, S_N) is BIC and winner-paying. If there exist θ_N and θ'_N such that $t_i^{G,S_N}(\theta_N) > t_i^{G,S_N}(\theta'_N) > 0$, then (G, S_N) is not static, strategy-proof, and credible. However, there exist ϵ -optimal (G, S_N) , for $\epsilon = \max_i \max_{2 \le k \le K} \theta_i^k - \theta_i^{k-1}$, that are:

- 1. static and strategy-proof (the second-price auction),
- 2. static and credible (the first-price auction),
- 3. strategy-proof and credible (the ascending auction).

Consider the messaging game restricted to safe deviations $S_0^*(S_0^G, S_N)$. Under a quasifirst-price auction, the auctioneer's strategy S_0^G is a best-response to any agent strategy profile S'_N . Under an ascending auction, each agent's strategy is a best-response to any opponent strategies $S'_{N\setminus i}$ and any safe auctioneer strategy S'_0 . Theorem 2 implies that no protocol can provide dominant-strategy incentives to both sides at once.²²

Corollary 2 (Strategy-proofness for one side only). Assume F_N is regular and symmetric and (G, S_N) is orderly and optimal. Assume that for any optimal reserve $\rho^* < \theta_i^{K-2}$. In the messaging game restricted to $S_0^*(S_0^G, S_N)$, either there exists S'_N such that S_0^G is not a best-response to S'_N , or there exists $i \in N$ and $S'_{N\setminus i}$ such that S_i is not a best-response to $(S_0^G, S'_{N\setminus i})$.

Proof. If (G, S_N) is not credible, then S_0^G is not a best-response to S_N . If (G, S_N) is not strategy-proof, then there exists $i \in N$ and $S'_{N\setminus i}$ such that S_i is not a best-response to $(S_0^G, S'_{N\setminus i})$. If (G, S_N) is credible and strategy-proof, then (G, S_N) is an ascending auction by Theorem 2. In that case, consider S'_N such that i bids until the price hits $\theta_i^{K_i}$, and every other bidder quits before the reserve is met. S_0^G is not a best-response to S'_N . \Box

 $^{^{22}\}mathrm{We}$ thank Sylvain Chassang for this insight.

3.4 A note on the Dutch auction

The Dutch (descending) auction is neither strategy-proof nor static, but it is credible. In a Dutch auction, the price falls until one bidder claims the object. Thus, each bidder in sees a sequence of descending prices $(p_i^1, p_i^2, p_i^3, ...)$; once he claims the object, he wins at that price. Consequently, once one bidder makes a claim, it is not safe to deviate the auctioneer must sell to that bidder at his current price. Fixing S_N , each bidder has a claim-price $p_i(\theta_i)$ at which he will agree. For a given θ_N , the rule-following auctioneer strategy yields revenue $\max_{i \in N} p_i(\theta_i)$. No safe deviation results in bidder *i* paying more than $p_i(\theta_i)$, so the revenue from following the rules first-order stochastically dominates the revenue from any safe deviation.

4 Extensions

4.1 Transfers from losing bidders

In stating Theorem 1, we restricted attention to winner-paying protocols. We now relax that assumption: the quasi-first-price auctions of Theorem 1 generalize to a larger class that permits the auctioneer to extract transfers from losing bidders, though each losing bidder's transfer must depend only on his own bid. Whether this class is of more than technical interest will vary from case to case. Most economically important auctions, such as those for art, for mineral rights, for spectrum, or for online advertising, do not extract payments from losing bidders. It could be that real-world auctions must respect *ex post* individual rationality, since otherwise one party will try to annul the contract afterwards. The resulting transaction costs may constrain the auctioneer to use winner-paying protocols.

We now state a definition that generalizes quasi-first-price auctions.

Definition 16. (G, S_N) is a **twin-bid auction** if (G, S_N) is static, and there exist for each agent two bid functions, $b_i^W : A(I_i) \to \mathbb{R}$ and $b_i^L : A(I_i) \to \mathbb{R}$, such that:

- 1. After playing a_i , i pays $b_i^W(a_i)$ if he wins and $b_i^L(a_i)$ if he loses.
- 2. If some agent plays an action a_i with $b_i^W(a_i) b_i^L(a_i) > 0$, then some agent wins the object.
- 3. If i wins the object after action profile $(a_j)_{j \in N}$, then $b_i^W(a_i) b_i^L(a_i) \ge \max\{0, \max_{j \neq i} b_j^W(a_j) b_i^L(a_j)\}$.

Theorem 3. (G, S_N) is credible and static if and only if (G, S_N) is a twin-bid auction.

Proof. Suppose (G, S_N) is a twin-bid auction. After action profile $(a_i)_{i \in N}$, every safe deviation charges $b_i^W(a_i)$ if agent *i* wins and $b_i^L(a_i)$ if he loses, so the auctioneer prefers S_0^G to any safe deviation. Thus, (G, S_N) is credible.

Suppose (G, S_N) is credible and static. The same argument as in the proof of Theorem 1 pins down the uniqueness of $b_i^W(a_i)$ if *i* might win after playing a_i , and the uniqueness of $b_i^L(a_i)$ if *i* might lose. We set $b_i^W(a_i)$ to be strictly less than $b_i^L(a_i)$ if *i* never wins after a_i . At most one agent has actions that guarantee he wins the object; for such an action we set $b_i^L(a_i)$ to be arbitrarily low, so that $b_i^W(a_i) - b_i^L(a_i) > \max\{0, \max_{j \neq i, a_j} b_j^W(a_j) - b_j^L(a_j)\}$.

Consider some agent *i* who plays a_i , where a_i does not guarantee that *i* wins. The auctioneer does not keep the object when $b_i^W(a_i) - b_i^L(a_i) > 0$, since she could safely deviate to allocate the object to *i*. There is an innocent explanation if *i* loses; thus if *i* wins then $b_i^W(a_i) - b_i^L(a_i) \ge 0$, since the auctioneer could safely deviate to keep the object. Finally, if *i* wins then $b_i^W(a_i) - b_i^L(a_i) \ge \max_{j \ne i} b_j^W(a_j) - b_j^L(a_j)$, otherwise she could safely deviate to sell the object to $\operatorname{argmax}_{j \ne i} b_j^W(a_j) - b_j^L(a_j)$. Thus, (G, S_N) is a twin-bid auction.

Twin-bid auctions include first-price auctions and all-pay auctions, though the credibility of all-pay auctions is sensitive to the assumption that the object is costless to provide. (More generally, $b_i^W(a_i) - b_i^L(a_i)$ must be no less than the auctioneer's cost of provision, which rules out standard all-pay auctions.²³) Twin-bid auctions also encompass first-price auctions with entry fees ($\forall a_i, a'_i : b_i^L(a_i) = b_i^L(a'_i) > 0$), and first-price auctions in which losing bidders are paid fixed compensation ($\forall a_i, a'_i : b_i^L(a_i) = b_i^L(a'_i) < 0$). Bidders who place higher bids may also receive more compensation if they lose; under the assumptions of Maskin and Riley (1984), this is the form of the optimal auction for bidders with constant absolute risk aversion.²⁴

Twin-bid auctions are not strategy-proof, except in degenerate cases.

Proposition 7. Assume there exist $\theta_i < \theta'_i < \theta''_i < \theta''_i$, θ_{-i} , and θ'_{-i} such that $y^{G,S_N}(\theta_i, \theta_{-i}) \neq i = y^{G,S_N}(\theta''_i, \theta'_{-i})$ and $y^{G,S_N}(\theta''_i, \theta'_{-i}) \neq i = y^{G,S_N}(\theta''_i, \theta'_{-i})$. If (G, S_N) is a twin-bid auction, then (G, S_N) is not strategy-proof.

4.2 Asymmetric distributions

Theorem 2 assumed that the distribution was symmetric; we now state a version that allows asymmetry. To proceed, we define a technical condition on the distribution. Clause 1 and 2 of the following definition require that the distribution is generic, which removes distractions from tie-breaking. Clause 3 states that for any $\eta_i(\theta'_i)$ in the interior of the convex hull of $\eta_j(\Theta_j)$, we can find θ_j with virtual value 'just below' $\eta_i(\theta'_i)$. This is implied by continuum type spaces and continuous densities, but must be assumed separately for finite type spaces.

²³The case when $b_i^W(a_i) - b_i^L(a_i)$ is exactly equal to the cost of provision is studied in Dequiedt and Martimort (2006), an early draft of Dequiedt and Martimort (2015).

²⁴Theorem 14 (Maskin and Riley, 1984, p. 1506-1507). This claim follows from their Equations 75 and 77, since μ is non-decreasing.

Definition 17. F_N is interleaved if, $\forall i \neq j$:

- 1. $\forall \theta_i, \theta_j : \eta_i(\theta_i) \neq \eta_j(\theta_j)$
- 2. $\forall \theta_i : \eta_i(\theta_i) \neq 0$
- 3. $\forall \theta_i, \theta'_i : if \eta_i(\theta_i) < \eta_i(\theta'_i) \text{ and } \eta_j(\theta^1_j) < \eta_i(\theta'_i) < \eta_j(\theta^{K_j}_j), \text{ then } \exists \theta_j : \eta_i(\theta_i) < \eta_j(\theta_j) < \eta_i(\theta'_i).$

Under asymmetry, we can construct an optimal auction by modifying the ascending auction to score bids according to their corresponding virtual values, and to sell only when the high bidder's virtual value is positive.

Definition 18. (G, S_N) is a virtual ascending auction if:

- 1. All bidders start as active, with initial bids $(b_i)_{i \in N} := (\theta_i^1)_{i \in N}$.
- 2. If $\max_i \eta_i(b_i) > 0$, the high bidder is $\operatorname{argmax}_i \eta_i(b_i)$. Otherwise there is no high bidder.
- 3. At each non-terminal history, some active bidder i (other than the high bidder) is called to play, and he chooses between actions that place a bid $b_i \in \Theta_i$ and actions that quit.
 - (a) Each bid is no less than the last bid that i placed.
 - (b) Each bid is no more than is necessary for i to become the high bidder.
 - (c) If i quits, then he is no longer active.
 - (d) At each information set, there is a unique action that places a bid, with one exception: If $\max_i \eta_i(b_i) < 0$ and there is exactly one active bidder left, there may be multiple actions that place bids.
- 4. *i's strategy specifies:*
 - (a) If i's type is strictly below a bid, he does not place that bid.
 - (b) If $\eta_i(\theta_i) > \max\{0, \max_{j \neq i} \eta_j(b_j)\}$, he places a bid.
- 5. The auction ends if one of three conditions obtains:
 - (a) If there are no active bidders. In that case, the object is not sold.
 - (b) If only the high bidder is active. In that case, the object is sold to the high bidder at his last bid.
 - (c) If no active bidder can beat the current high bid b_i , that is, for every active bidder $j \neq i$, $\eta_j(\theta_j^{K_j}) < \eta_i(b_i)$. In that case, the object is sold to the high bidder at his last bid.

Theorem 4. Assume F_N is regular and interleaved and (G, S_N) is optimal. (G, S_N) is credible and strategy-proof if and only if (G, S_N) is a virtual ascending auction.

Virtual ascending auctions score bids asymmetrically: Bidder *i* may be asked to bid \$100 in order to beat *j*'s bid of \$50, and then to bid \$101 to beat *j*'s bid of \$51. Since the auctioneer is communicating privately, she could safely deviate to equalize the prices that bidders face (provided Θ_i and Θ_j overlap enough). Nonetheless, it is incentivecompatible for the auctioneer to follow the rules. For each bidder, truthful bidding is a best-response to any safe deviation. Thus, if the auctioneer has a profitable safe deviation, then she could openly promise to deviate without undermining bidders' incentives. In that case, the original protocol was not optimal, a contradiction. It may seem intuitive that the auctioneer cannot credibly reject higher bids in favor of lower bids, but multi-round communication permits her to do so.

The virtual ascending auction can be modified to deal with irregular distributions: we simply alter Definition 18 to use ironed virtual values instead of virtual values, following the construction in Elkind (2007). In effect, if we iron virtual values in the interval θ_i^k to $\theta_i^{k'}$, the auctioneer promises ahead of time to jump *i*'s price directly from θ_i^k to $\theta_i^{k'+1}$. The proof that this is credible is the same as in the regular case.

Finally, the virtual ascending auction can be used to construct a static credible optimal auction. Consider a modified all-pay auction; each type θ_i makes a bid equal to the expected payment of θ_i in the virtual ascending auction, to be paid regardless of whether he wins. The winner is the bidder with the highest virtual value. This twin-bid auction is BIC and optimal, but neither strategy-proof nor *ex post* individually rational.²⁵

4.3 Affiliated values

As is well-known, relaxing the independence assumption even slightly results in auctions that extract all bidder surplus (Cremer and McLean, 1988). The standard (static) mechanisms for full surplus extraction are not credible. Even using extensive forms does not generally permit credible full surplus extraction.

Definition 19. (G, S_N) extracts full surplus if it is BIC, has voluntary participation, and $\pi(G, S_N) = \mathbf{E}_{\theta_N}[\max\{0, \max_{i \in N} \theta_i\}].$

Proposition 8. The Cremer and McLean (1988) conditions are not sufficient for the existence of a credible protocol that extracts full surplus.

Optimal auctions with correlation are better-behaved if we additionally require ex post

²⁵This format is closely related to the 'all-pay' procurement auctions studied in Dequiedt and Martimort (2015).

incentive compatibility and *ex post* individual rationality.²⁶ The virtual values machinery generalizes, and a modified ascending auction is optimal under some standard assumptions (Roughgarden and Talgam-Cohen, 2013). That modified ascending auction is credible. We now make the claim precisely.

Consider some probability mass function $f_N : \Theta_N \to [0, 1]$. We assume symmetric type spaces, $K_i = K_j = K$ and $\theta_i^k = \theta_j^k$ for all i, j, k, as well as affiliated types (Milgrom and Weber, 1982).

Definition 20. f_N is symmetric if its value is equal under any permutation of its arguments. f_N is affiliated if for all θ_N, θ'_N :

$$f_N(\theta_N \vee \theta'_N) f_N(\theta_N \wedge \theta'_N) \ge f_N(\theta_N) f_N(\theta'_N)$$
(8)

where \lor is the component-wise maximum and \land the component-wise minimum.

Definition 21. (G, S_N) is optimal among ex post auctions if it maximizes $\pi(G, S_N)$ subject to the constraints:

1. Ex post incentive compatibility. For all $i, \theta_i, \theta'_i, \theta_{-i}$:

$$\theta_i y_i^{G,S_N}(\theta_i, \theta_{-i}) - t_i^{G,S_N}(\theta_i, \theta_{-i}) \ge \theta_i y_i^{G,S_N}(\theta_i', \theta_{-i}) - t_i^{G,S_N}(\theta_i', \theta_{-i})$$
(9)

2. Ex post individual rationality. For all i, θ_i, θ_{-i} :

$$\theta_i y_i^{G,S_N}(\theta_i, \theta_{-i}) - t_i^{G,S_N}(\theta_i, \theta_{-i}) \ge 0$$
(10)

Definition 22. The conditional virtual value of θ_i^k given θ_{-i} is:

$$\eta_i(\theta_i^k|\theta_{-i}) \equiv \theta_i^k - \frac{1 - F_i(\theta_i^k|\theta_{-i})}{f_i(\theta_i^k|\theta_{-i})} (\theta_i^{k+1} - \theta_i^k)$$
(11)

where $f_i(\cdot|\theta_{-i})$ is the conditional distribution of θ_i given θ_{-i} and $F_i(\cdot|\theta_{-i})$ is the conditional cumulative distribution. f_N is **regular** if, for all i and θ_{-i} , $\eta_i(\theta_i|\theta_{-i})$ is strictly increasing in θ_i .

We now define a modified ascending auction. When there is only one bidder left, the auctioneer sets a reserve so that she only sells to types with a positive conditional virtual value.²⁷ That reserve depends on the final bids from the bidders who quit.

²⁶ Ex post incentive compatibility and ex post individual rationality are implied by strategy-proofness and voluntary participation (Definition 7). For extensive forms, ex post incentive compatibility and strategy-proofness are not equivalent. An opponent strategy profile S_{-i} consists of complete contingent plans of action. Ex post incentive compatibility in effect considers only plans 'consistent with' some opponent type profile θ_{-i} .

²⁷This definition is due to Roughgarden and Talgam-Cohen (2013), and differs only in that our construction is for finite type spaces to allow the use of extensive game forms.

Definition 23. (G, S_N) is a quirky ascending auction if:

- 1. All bidders start as active, with initial bids $(b_i)_{i \in N} := (\theta_i^1)_{i \in N}$.
- 2. Whenever there is more than one active bidder, some active bidder i is called to play, where $b_i \leq \max_{j \neq i} b_j$.
 - (a) i chooses between two actions; he can either raise b_i by one increment²⁸ or quit.
 - (b) If i quits then he is no longer active.
- 3. When there is exactly one active bidder *i*, if $\eta_i(b_i|b_{-i}) \leq 0$, *i* chooses to either raise his bid to $\min b'_i \mid \eta_i(b'_i|b_{-i}) > 0$ or quit. Otherwise *i* wins and pays b_i .
- 4. Inactive bidders do not win the object, and have zero transfers.
- 5. S_i specifies that *i* bids b_i if and only if $\theta_i \ge b_i$.

Proposition 9. Assume f_N is symmetric, affiliated, and regular. If (G, S_N) is a quirky ascending auction, then it is optimal among expost auctions and is credible.

5 A 'Prior-free' Definition

The definition of credibility depends on the joint distribution of agent types (Definition 6). It may be useful to have a definition that is 'prior-free', for settings such as matching or maxmin mechanism design.

Definition 24. Given (G, S_N) , $S_0 \in \mathcal{S}_0^*(S_0^G, S_N)$ is always-profitable if, for all θ_N :

$$u_0(S_0, S_N, \theta_N) \ge u_0(S_0^G, S_N, \theta_N) \tag{12}$$

with strict inequality for some θ_N .

 (G, S_N) is **prior-free credible** if no safe deviation is always-profitable.

For comparison, (G, S_N) is credible if no safe deviation is profitable in expectation. Prior-free credibility allows one to dispense with strong assumptions about the auctioneer's beliefs.

What happens if we replace "credible" with "prior-free credible" in the statement of Theorems 1 and 2? Quasi-first-price auctions and ascending auctions are credible, so they are prior-free credible. However, the other direction of implication now starts from weaker premises. Prior-free credibility still suffices for the characterizations.

Proposition 10. Theorems 1, 2, 3, and 4 remain true when "credible" is replaced by "prior-free credible".

²⁸i.e. from θ_i^k to θ_i^{k+1} , where we set $\theta_i^{K+1} > \theta_i^K$.

Proof. Since credible protocols are prior-free credible, each "if" direction is immediate. In the proof of Theorem 1, we show that if (G, S_N) is static but not a quasi-first-price auction, then there exists a safe deviation that is always-profitable, so (G, S_N) is not prior-free credible. In the proof of Theorem 2, we show that if (G, S_N) is strategy-proof but not an ascending auction, then there exists a safe deviation that is always-profitable, so (G, S_N) is not prior-free credible. So too for Theorems 3 and 4.

6 Other Applications

6.1 Auctions with matroid constraints

So far we have assumed that in each feasible allocation there is at most one winner. Suppose instead that multiple bidders can be satisfied at once; that is, the feasible sets of winners are a family $\mathcal{F} \subseteq 2^N$. Each bidder's type is independently distributed according to $f_i : \Theta_i \to (0, 1]$, where *i*'s utility at allocation $Y \in \mathcal{F}$ is $\theta_i \mathbb{1}_{i \in Y} - t_i$. Each bidder observes whether or not he is in the allocation, and his own transfer.

Definition 25. \mathcal{F} is a matroid if:

- 1. $\emptyset \in \mathcal{F}$
- 2. If $Y' \subset Y$ and $Y \in \mathcal{F}$, then $Y' \in \mathcal{F}$.
- 3. For any $Y, Y' \in \mathcal{F}$, if |Y| > |Y'|, then there exists $i \in Y \setminus Y'$ such that $Y' \cup \{i\} \in \mathcal{F}$.

Here are some examples of matroids:

- 1. The auctioneer can sell at most k items; that is, $Y \in \mathcal{F}$ if and only if $|Y| \leq k$.
- 2. There are incumbent bidders and new entrants. The auctioneer sells k licenses, and at most l licenses can be sold to incumbents.
- 3. The auctioneer is selling the edges of a graph. Each edge is demanded by exactly one bidder, and the auctioneer can sell any set of edges that is acyclic.
- 4. There are bands of spectrum $\{1, \ldots, K\}$, and each band k is acceptable to a subset of bidders N_k . Each bidder is indifferent between bands that he finds acceptable. At most one bidder can be assigned to each band.

Proposition 11. If \mathcal{F} is a matroid, then there exists a credible strategy-proof optimal protocol.

We describe this protocol informally, since the fine details parallel Definition 18, and our construction draws heavily on Bikhchandani et al. (2011) and Milgrom and Segal (2017). Each bidder's starting bid is equal to his lowest possible type. We score bids according to their ironed virtual values, and keep track of a set of active bidders \hat{N} .

Bidder *i* is **essential** at \hat{N} if, for all $Y \subseteq \hat{N}$, if $Y \in \mathcal{F}$, then $Y \cup \{i\} \in \mathcal{F}$. At each step, we choose an active bidder *i* whose score is minimal in \hat{N} . If *i*'s score is positive and *i* is essential at \hat{N} , then we guarantee that *i* is in the allocation and charge him his current bid, removing him from \hat{N} . Otherwise, *i* chooses to either raise his bid until his score is positive and no longer minimal, or quit (in which case he is also removed from \hat{N}). The auction ends when $\hat{N} = \emptyset$.

The above protocol outputs the same allocation as a greedy algorithm that starts with the empty set and at each step adds a bidder with the highest ironed virtual value among those that can be feasibly added, until no bidders with positive ironed virtual values can be added (we prove this in the Appendix). By a standard result in combinatorial optimization (Hartline, 2016, p.134), this greedy algorithm maximizes the ironed virtual value when \mathcal{F} is a matroid. Given that the relevant participation constraints and incentive constraints bind, maximizing ironed virtual values implies that the protocol is optimal (Elkind, 2007).

The auction we described is credible, for the same reasons as before: Since truthful bidding is best response to any safe deviation, if the auctioneer could improve revenue by a safe deviation, she could have committed from the beginning to an alternative mechanism and increased revenue. Since the original protocol was optimal, we have a contradiction.

6.2 Public goods provision

A social planner chooses whether to provide a public good with integer cost c > 0. An outcome consists of an allocation $y \in \{0, 1\}$ and transfers from each agent $(t_i)_{i \in N}$. Agent *i*'s utility is $\theta_i y - t_i$, where $\Theta_i = \{0, 1, 2, ..., K\}$. The efficient allocation is:

$$y^*(\theta_N) = \begin{cases} 1 & \text{if } \sum_i \theta_i - c \ge 0\\ 0 & \text{otherwise} \end{cases}$$
(13)

The planner wants to choose the efficient allocation, but also receives a small benefit from having higher transfers. Formally, for $\gamma \in (0, \frac{1}{|N|K})$:

$$u_0(y, t_N, \theta_N) = 1_{y=y^*(\theta_N)} + \gamma \sum_i t_i$$
(14)

Each agent observes whether the public good is provided, as well as his own transfer. Under mild conditions, if a protocol is static, strategy-proof and efficient, then it is not prior-free credible. The key intuition is that, for a static protocol to be prior-free credible, *i*'s transfers must be measurable with respect to the allocation rule, which prevents the use of threshold prices.

Proposition 12. Assume there exist $\theta_i < \theta'_i < \theta''_i < \theta''_i$, $\theta_{N\setminus i}$, and $\theta'_{N\setminus i}$ such that:

1. $\theta_i + \sum_{j \neq i} \theta_j < c < \theta'_i + \sum_{j \neq i} \theta_j$ 2. $\theta''_i + \sum_{j \neq i} \theta'_j < c < \theta'''_i + \sum_{j \neq i} \theta'_j$

There does not exist (G, S_N) that is static, strategy-proof, efficient, and prior-free credible.

If we allow non-static mechanisms, then there exist prior-free credible efficient protocols when |N| = 2. Our construction treats agents asymmetrically; *i* declares whether he is willing to buy the public good at a given price, and at each step the price rises. The public good is withheld if *i* quits. *j* declares whether he is willing to forgo the public good in return for payment, and at each step the payment offered to *j* falls. The public good is provided if *j* quits. We coordinate the price faced by *i* and the payment offered to *j* so that the public good is provided if and only if their values exceed the cost of provision. Formally, initialize $b_i := 0, b_j := K$.

- 1. If $b_i + b_j < c$, ask *i* to raise his bid to $c b_j$ or quit.
 - (a) *i* raises his bid if and only if $\theta_i \ge c b_j$
 - (b) If *i* quits, then the public good is not provided, $t_i = 0$ and $t_j = -b_j$.
- 2. If $b_i + b_j \ge c$, ask j to lower his bid to $c b_i 1$ or quit.
 - (a) j lowers his bid if and only if $\theta_j \leq c b_i 1$
 - (b) If j quits, then the public good is provided, $t_i = b_i$ and $t_j = 0$.
- 3. Go to step 1.

Proposition 13. The above protocol for two agents is efficient, strategy-proof, and priorfree credible.

Proof. Efficiency and strategy-proofness follow by inspection. Holding fixed the parameters c and K, at any point in the messaging game, for each agent there is at most one query that can be safely sent to him. Observe that, for any safe deviation, at any point in the messaging game, the planner knows only a lower bound for i's type $\underline{\theta}_i$ and an upper bound for j's type $\overline{\theta}_j$. If $\underline{\theta}_i + \overline{\theta}_j < c$, and the planner queries j, then j quits if his type is $\overline{\theta}_j$, causing the public good to be inefficiently provided when the type profile is $(\underline{\theta}_i, \overline{\theta}_j)$. If $\underline{\theta}_i + \overline{\theta}_j \geq c$, and the planner queries i, then i quits if his type is $\underline{\theta}_i$, causing the public good to be inefficiently withheld when the type profile is $(\underline{\theta}_i, \overline{\theta}_j)$. Any safe deviation can change revenue by no more than 2K so, since γ is small, the protocol is prior-free credible.

Since this protocol treats agents asymmetrically, there is no easy extension to three or more agents. For that case, it is an open question whether strategy-proofness, efficiency, and prior-free credibility are compatible.

7 Discussion

It is worth considering why real-world auctioneers might lack full commitment power. Vickrey (1961) suggests that the seller could delegate the task of running the auction to a third-party who has no stake in the outcome. However, auction houses such as Sotheby's, Christie's, and eBay charge commissions that are piecewise-linear functions of the sale price.²⁹ Running an auction takes effort, and many dimensions of effort are not contractible. Robust contracts reward the auctioneer linearly with revenue (Carroll, 2015), so it is difficult to employ a third-party who is both neutral and well-motivated.³⁰

When an auctioneer makes repeated sales, reputation could help enforce the fullcommitment outcome. However, the force of reputation depends on the discount rate and the detection rate of deviations. Safe deviations are precisely those that a bidder could not detect immediately. Online advertising auctions are repeated frequently, so it is plausible that bidders could examine the statistics to detect foul play.³¹ However, some economically important auctions are infrequent or not repeated at all - for instance, auctions for wireless spectrum or for the privatization of state-owned industries. Even established auction houses such as Christie's and Sotheby's have faced regulatory scrutiny, based in part on concerns that certain deviations are difficult for individual bidders to detect.

Modern auctioneers could use cryptography to prove that the rules of the auction have been followed, without disclosing additional information to bidders. Cryptographic verification relies on digital infrastructure: Participants typically need access to a public bulletin board, a sound method of creating and sharing public keys, and a time-lapse encryption service that provides public keys and commits to release the corresponding decryption keys only at pre-defined times (Parkes et al., 2015).³² It can be costly to construct this infrastructure, and to persuade bidders that it works as the auctioneer claims. By using credible mechanisms, auctioneers may increase the resources and attention available for substantive purposes.

²⁹http://www.sothebys.com/en/news-video/blogs/all-blogs/sotheby-s-at-large/2016/10/ important-update-regarding-sothebys-buyers-premium.html, http://www.christies.com/ buying-services/buying-guide/financial-information/, http://pages.ebay.com/help/sell/ fees.html, accessed 11/5/2017.

³⁰As Myerson (2009) observes, "The problems of motivating hidden actions can explain why efficient institutions give individuals property rights, as owners of property are better motivated to maintain it. But property rights give people different vested interests, which can make it more difficult to motivate them to share their private information with each other."

³¹However, bidders in online advertising auctions have expressed concerns that supply-side platforms (SSPs) are deviating from the rules of the second-price auction. The industry news website Digiday alleged, "Rather than setting price floors as a flat fee upfront, some SSPs are setting high price floors after their bids come in as a way to squeeze out more money from ad buyers who believe they are bidding into a second-price auction". https://digiday.com/marketing/ ssps-use-deceptive-price-floors-squeeze-ad-buyers/, accessed 11/30/2017.

 $^{^{32}\}mathrm{Bidders}$ may even need special training or software assistance to play their part in a cryptographic protocol.

Not all auctioneers have full commitment power, just as not all firms are Stackelberg leaders. When the auctioneer lacks full commitment, it can be hazardous for bidders to reveal all their information at once. In a first-price auction, a bidder 'reveals' his value in return for a guarantee that his report completely determines the price he might pay.³³ In an ascending auction, a bidder reports whether his value is above b only when the auctioneer (correctly) asserts that bids below b are not enough to win. Credibility is a shared foundation for these seemingly disparate designs. How this principle extends to other environments is an open question.

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³³This property is generalized in a natural way by the 'first-price' menu auction (Bernheim and Whinston, 1986).

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A Definition of Extensive Game Forms with Consequences in X

An extensive game form with consequences in X is a tuple $(H, \prec, P, A, \mathcal{A}, (\mathcal{I}_i)_{i \in N}, g)$, where:

- 1. *H* is a set of histories, along with a binary relation \prec on *H* that represents precedence.
 - (a) \prec is a partial order, and (H, \prec) form an arborescence³⁴.
 - (b) We use $h \leq h'$ if h = h' or $h \prec h'$.
 - (c) h_{\emptyset} denotes $h \in H : \neg \exists h' : h' \prec h$.
 - (d) $Z \equiv \{h \in H : \neg \exists h' : h \prec h'\}$
 - (e) $\sigma(h)$ denotes the set of immediate successors of h.
- 2. *P* is a player function. $P: H \setminus Z \to N$.
- 3. A is a set of actions.
- 4. $\mathcal{A}: H \setminus h_{\emptyset} \to A$ labels each non-initial history with the last action taken to reach it.
 - (a) For all h, \mathcal{A} is one-to-one on $\sigma(h)$.
 - (b) A(h) denotes the actions available at h.

$$A(h) \equiv \bigcup_{h' \in \sigma(h)} \mathcal{A}(h') \tag{15}$$

- 5. \mathcal{I}_i is a partition of $\{h : P(h) = i\}$ such that:
 - (a) A(h) = A(h') whenever h and h' are in the same cell of the partition.
 - (b) For any $I_i \in \mathcal{I}_i$, we denote: $P(I_i) \equiv P(h)$ for any $h \in I_i$. $A(I_i) \equiv A(h)$ for any $h \in I_i$.

³⁴That is, a directed rooted tree such that every edge points away from the root.

- (c) Each action is available at only one information set: If $a \in A(I_i)$, $a' \in A(I'_j)$, $I_i \neq I'_j$ then $a \neq a'$.
- 6. g is an outcome function. It associates each terminal history with an outcome. $g: Z \to X$

B Proofs omitted from the main text

B.1 Proposition 1

For each of the three clauses in Definition 2, we show that if (G, S_N) does not satisfy this clause, we can transform (G, S_N) to have strictly fewer histories, such that the transformed protocol is BIC and results in the same outcomes for each type profile. Since the set of histories in (G, S_N) is finite, it follows that there exists a BIC (G', S'_N) that cannot be reduced further, but results in the same outcomes as (G, S_N) .

Clause 1: Suppose there exists h such that there is no θ_N such that $h \leq z(S_N, \theta_N)$. Since the game tree is finite, we can locate an earliest possible h; that is, an h such that no predecessor satisfies this property. Consider h' that immediately precedes h, and the information set I'_i such that $h \in I'_i$. There is some action a' at I'_i that is not played by any type of i that reaches I'_i . We can delete all histories that follow i playing a' at I'_i (and define $(\prec', \mathcal{A}', P', (\mathcal{I}'_i)_{i \in N}, g')$ and S'_N so that they are as in G, but restricted to the new smaller set of histories H'). Since these histories were off the path of play, their deletion does not affect the incentives of agents in $N \setminus i$. Since i preferred his original S_i to any strategy that played a' at I'_i , his new strategy S'_i remains incentive-compatible. Thus, the transformed (G', S'_N) is BIC.

Clause 2: Suppose there exists $h \notin Z$ such that $|\sigma(h)| = 1$. We simply rewrite the transformed game (G', S'_N) that deletes h (and all the other histories in that same information set) and 'automates' *i*'s singleton action at h. That is, for all $h' \in I_i$ for I_i such that $h \in I_i$, we remove h' from the set of histories, and define $(\prec', \mathcal{A}', P', (\mathcal{I}'_i)_{i \in N}, g')$ and S'_N so that they are as in G, but restricted to $H \setminus I_i$. (G', S'_N) is BIC.

Clause 3: The above arguments prove that, starting from an arbitrary (G, S_N) , we can produce an outcome-equivalent (G, S_N) that satisfies Clauses 1 and 2. We now take (G, S_N) that satisfies Clauses 1 and 2, and show that if it does not satisfy Clause 3, then we can reduce the protocol further.

Informally, our argument proceeds as follows: Suppose there is some h at which Clause 3 is not satisfied, where we denote i = P(h). Upon reaching h, i's continuation strategy no longer affects the outcome. Consider a modified protocol (G', S'_N) : Play proceeds exactly as in (G, S_N) , except after history h is reached. Whenever, under (G, S_N) , i would be called to play at h' where $h \leq h'$, we instead skip i's turn and continue play as though i played the action that would be selected by some type θ_i . This modified protocol contains strictly fewer histories.

Formally, suppose Clause 1 and 2 hold for (G, S_N) , but there exists $h \notin Z$, such that for i = P(h), there does not exist $\theta_i, \theta'_i, \theta_{-i}$ such that

- 1. $h \prec z(S_N, (\theta_i, \theta_{-i}))$
- 2. $h \prec z(S_N, (\theta'_i, \theta_{-i}))$
- 3. $x^G(S_N, (\theta_i, \theta_{-i})) \neq x^G(S_N, (\theta'_i, \theta_{-i}))$

Since Clause 1 holds, there exists (θ_i, θ_{-i}) such that $h \prec z(S_N, (\theta_i, \theta_{-i}))$. Upon reaching h, we can henceforth 'automate' play as though i had type θ_i . First, we delete any history h' such that $h \preceq h'$ and P(h') = i; this ensures that i is no longer called to play after h. Next, we delete any history h' such that $h \preceq h'$ and there does not exist θ''_{-i} such that $h' \prec z(S_N, (\theta_i, \theta''_{-i}))$; this has the effect of 'automating' play as though i has type θ_i . Given the new smaller set of histories H', we again define $(\prec', \mathcal{A}', P', (\mathcal{I}'_i)_{i \in N}, g')$ and S'_N so that they are as in G, but restricted to H'.

By construction, for all θ'_i , if *i* is playing as though his type is θ'_i and we would have reached history *h* under (G, S_N) , then the outcome is the same under (G', S'_N) as when *i* is playing as though his type is θ_i under (G, S_N) (which by hypothesis is the same as when *i* is playing as though his type is θ'_i under (G, S_N)). Plainly, if we would not have reached history *h* under (G, S_N) , then the outcomes under (G, S_N) and (G', S'_N) are identical. Thus, (G', S'_N) is BIC.

This completes the proof of Proposition 1.

B.2 Proposition 2

To prove Proposition 2, we show that each of the three transformations we used in the proof of Proposition 1 also preserve credibility. That is, for each (G', S'_N) that is produced from (G, S_N) by one of the three transformations, if the auctioneer has a profitable safe deviation from $S_0^{G'}$, then she also has a profitable safe deviation from S_0^G .

Consider the first transformation (deleting all histories that follow action a at I_i , when a is never chosen on the path of play). Suppose the auctioneer had a profitable safe deviation S'_0 from $S_0^{G'}$. The auctioneer could make that same deviation, but additionally offer the response $\lambda(a)$ whenever sending the message $\lambda(I_i)$. By hypothesis, agent i never selects $\lambda(a)$ as a reply, so for any θ_N and any j, j's resulting observation has an innocent explanation. Thus, the auctioneer also has a profitable safe deviation from S_0^G .

Consider the second transformation (deleting all histories in some information set with a singleton action set). Suppose the auctioneer had a profitable safe deviation S'_0 from $S_0^{G'}$. The auctioneer could make that same deviation from S_0^G , except that for the deleted information set I_i , the auctioneer delays sending $\lambda(I_i, A(I_i))$ until the last possible moment. That is consider S_0 that is the same as S'_0 , except that, if the auctioneer has not yet sent $\lambda(I_i, A(I_i))$ to agent *i*, then:

- 1. If S'_0 specifies that the auctioneer sends $\lambda(I'_i, A(I'_i))$ for $I'_i \succ I_i$, then S_0 specifies that she first sends $\lambda(I_i, A(I_i))$ and then (immediately thereafter) sends $\lambda(I'_i, A(I'_i))$
- 2. If S'_0 specifies that the auctioneer chooses an outcome such that the resulting observation for *i* does not have an innocent explanation under S^G_0 , then S_0 specifies that she first sends $\lambda(I_i, A(I_i))$ before choosing that outcome.

 S_0 is a profitable safe deviation from S_0^G .

Consider the third transformation (deleting histories where *i* is called to play, following some history *h* such that, for any two types of *i* that reach *h*, both types of *i* result in the same outcome). Suppose S'_0 was a profitable safe deviation from $S_0^{G'}$.

If the observation for *i* that results from S'_0 does not have an innocent explanation under S_0^G , it must be that (given on all the communication *i* has seen so far), the outcome S'_0 is about to select can only occur under *G* at terminal histories that follow *h*. But by hypothesis, for any θ_i and θ'_i that are consistent with reaching *h*, and any θ_{-i} consistent with reaching *h*, the resulting outcome is the same. Thus, let S_0 be exactly as in S'_0 , except that if S'_0 specifies that the auctioneer chooses an outcome such that the resulting observation for *i* does not have an innocent explanation under S_0^G , then S_0 specifies that the auctioneer communicates with *i* as though play started from *h* and the opponent type profiles were θ_{-i} , for some θ_{-i} consistent with reaching *h*.

Formally, if S'_0 would choose an outcome such that *i*'s observation has no innocent explanation, then fix some θ_N such that $h \prec z(S_N, \theta_N)$. Initialize $\hat{h} := h$.

- 1. If $\hat{h} \in Z$, then terminate and choose $x = g(\hat{h})$.
- 2. Else if $P(\hat{h}) \neq i$, then for $I_{P(\hat{h})}$ such that $\hat{h} \in I_{P(\hat{h})}$:
 - (a) $\hat{h} := h' \mid h' \in \sigma(\hat{h})$ and $S_{P(\hat{h})}(I_{P(\hat{h})}, \theta_{P(\hat{h})}) = \mathcal{A}(h').$
 - (b) Go to step 1.

3. Else:

- (a) Send $(m, R) = \lambda(I_i, A(I_i))$ for I_i such that $\hat{h} \in I_i$.
- (b) Upon receiving $r \in R$, choose $\hat{h} := h' \mid \mathcal{A}(h') = \lambda^{-1}(r)$ and $h' \in \sigma(\hat{h})$.
- (c) Go to step 1.

Since, under S_i , *i*'s play in this final stage makes no difference to the outcome, delaying communication with *i* until the outcome is about to be selected results in a safe deviation. This completes the proof of Proposition 2...

B.3 Proposition 4

To derive the lower bound, we use the downward incentive constraints. Since (G, S_N) is BIC, type θ_i^k should not wish to imitate type θ_i^{k-1} , *i.e.*:

$$\forall i : \forall k \ge 2 : \check{u}_i^{G,S_N}(k,k) \ge \check{u}_i^{G,S_N}(k,k-1)$$
(16)

Thus,

$$\check{u}_{i}^{G,S_{N}}(k,k) - \check{u}_{i}^{G,S_{N}}(1,1) = \sum_{l=2}^{k} \check{u}_{i}^{G,S_{N}}(l,l) - \check{u}_{i}^{G,S_{N}}(l-1,l-1)$$

$$\geq \sum_{l=2}^{k} \check{u}_{i}^{G,S_{N}}(l,l-1) - \check{u}_{i}^{G,S_{N}}(l-1,l-1) = \mathbf{E}_{\theta_{-i}}[\sum_{l=2}^{k} (\theta_{i}^{l} - \theta_{i}^{l-1})y_{i}^{G,S_{N}}(\theta_{i}^{l-1},\theta_{-i})]$$
(17)

Thus, i's expected utility is at least:

$$\mathbf{E}_{\theta_{-i}} \left[\sum_{k=2}^{K_i} f_i(\theta_i^k) \sum_{l=1}^k (\theta_i^l - \theta_i^{l-1}) y_i^{G,S_N}(\theta_i^{l-1}, \theta_{-i}) \right] + \check{u}_i^{G,S_N}(1, 1) \\
= \mathbf{E}_{\theta_{-i}} \left[\sum_{k=1}^{K_i} (1 - F_i(\theta^k)) (\theta_i^{k+1} - \theta_i^k) y_i^{G,S_N}(\theta_i^k, \theta_{-i}) \right] + \check{u}_i^{G,S_N}(1, 1) \\
= \mathbf{E}_{\theta_{-i}} \left[\sum_{k=1}^{K_i} (\theta_i^{k+1} - \theta_i^k) f_i(\theta^k) \frac{1 - F_i(\theta^k)}{f_i(\theta^k)} y_i^{G,S_N}(\theta_i^k, \theta_{-i}) \right] + \check{u}_i^{G,S_N}(1, 1) \quad (18)$$

Summing across agents yields the lower bound:

$$0 \le \mathbf{E}_{\theta_N} \left[\sum_{i \in N} y_i^{G, S_N}(\theta_N) \eta_i(\theta_i) \right] - \pi(G, S_N) - \sum_{i \in N} \check{u}_i^{G, S_N}(1, 1)$$
(19)

To derive the upper bound, we use the upward incentive constraints. Since (G, S_N) is BIC, θ_i^{k-1} should not wish to imitate type θ_i^k , *i.e.*:

$$\forall i : \forall k \ge 2 : \check{u}_i^{G,S_N}(k-1,k-1) \ge \check{u}_i^{G,S_N}(k-1,k)$$
(20)

$$\check{u}_{i}^{G,S_{N}}(k,k) - \check{u}_{i}^{G,S_{N}}(1,1) = \sum_{l=2}^{k} \check{u}_{i}^{G,S_{N}}(l,l) - \check{u}_{i}^{G,S_{N}}(l-1,l-1) \\
\leq \sum_{l=2}^{k} \check{u}_{i}^{G,S_{N}}(l,l) - \check{u}_{i}^{G,S_{N}}(l-1,l) = \sum_{l=2}^{k} (\theta_{i}^{l} - \theta_{i}^{l-1}) \mathbf{E}_{\theta_{-i}}[y_{i}^{G,S_{N}}(\theta_{i}^{l},\theta_{-i})]$$
(21)

Let $\epsilon = \max_j \max_{2 \le k \le K_j} \theta_j^k - \theta_j^{k-1}$.

$$\left(\sum_{k=1}^{K_{i}} f_{i}(\theta_{i}^{k}) \check{u}_{i}^{G,S_{N}}(k,k)\right) - \check{u}_{i}^{G,S_{N}}(1,1) \\
\leq \mathbf{E}_{\theta_{-i}} \left[\sum_{k=1}^{K_{i}} f_{i}(\theta_{i}^{k}) \sum_{l=2}^{k} (\theta_{i}^{l} - \theta_{i}^{l-1}) y_{i}^{G,S_{N}}(\theta_{i}^{l}, \theta_{-i})\right] \\
\leq \mathbf{E}_{\theta_{-i}} \left[\sum_{k=1}^{K_{i}} (1 - F_{i}(\theta^{k}))(\theta_{i}^{k+1} - \theta_{i}^{k}) y_{i}^{G,S_{N}}(\theta_{i}^{k}, \theta_{-i})\right] \\
+ \epsilon \mathbf{E}_{\theta_{-i}} \left[\sum_{k=2}^{K_{i}} f_{i}(\theta_{i}^{k})(y_{i}^{G,S_{N}}(\theta_{i}^{k}, \theta_{-i}) - y_{i}^{G,S_{N}}(\theta_{i}^{1}, \theta_{-i}))\right] \\
\leq \mathbf{E}_{\theta_{-i}} \left[\sum_{k=1}^{K_{i}} (\theta_{i}^{k+1} - \theta_{i}^{k}) f_{i}(\theta_{i}^{k}) \frac{1 - F_{i}(\theta_{i}^{k})}{f_{i}(\theta_{i}^{k})} y_{i}^{G,S_{N}}(\theta_{i}^{k}, \theta_{-i})\right] + \epsilon \quad (22)$$

Summing across agents yields the upper bound:

$$\mathbf{E}_{\theta_N}\left[\sum_{i\in N} y_i^{G,S_N}(\theta_N)\eta_i(\theta_i)\right] - \pi(G,S_N) - \sum_{i\in N} \check{u}_i^{G,S_N}(1,1) \le \epsilon$$
(23)

B.4 Theorem 2

B.4.1 credible, strategy-proof \rightarrow ascending

We start by deriving several properties of credible strategy-proof optimal (G, S_N) , without assuming that F_N is regular or symmetric. Since we are mostly holding fixed (G, S_N) , we will drop the superscripts on y^{G,S_N} and t_i^{G,S_N} to reduce clutter.

Proposition 14. If (G, S_N) is optimal and strategy-proof, then (G, S_N) is winner-paying.

Proof. For all (θ_i, θ_{-i}) , if $y(\theta_i, \theta_{-i}) \neq i$ then $t_i(\theta_i, \theta_{-i}) \leq 0$. Suppose not. (G, S_N) satisfies voluntary participation. When *i*'s opponent's imitate θ_{-i} ,³⁵ type θ_i can profitably deviate to non-participation if $t_i(\theta_i, \theta_{-i}) > 0$, contradicting strategy-proofness.

 $\theta_i^1 \leq 0$, so $\eta_i(\theta_i^1) < 0$. (G, S_N) is optimal, so θ_i^1 never wins (by Proposition 3). θ_i^1 's participation constraint binds, so for all θ_{-i} , $t_i(\theta_i^1, \theta_{-i}) = 0$.

Take any (θ_i, θ_{-i}) . If $y(\theta_i, \theta_{-i}) \neq i$ and $t_i(\theta_i, \theta_{-i}) > 0$, then when *i*'s opponents imitate θ_{-i}, θ_i^1 can profitably imitate θ_i , contradicting strategy-proofness. Thus, (G, S_N) is winner-paying.

Proposition 15. If (G, S_N) is strategy-proof, then the allocation rule is monotone. That is, if $\theta_i < \theta'_i$ and $y(\theta_i, \theta_{-i}) = i$, then $y(\theta'_i, \theta_{-i}) = i$.

³⁵Formally, define S'_{-i} such that for all $j \neq i$, I_j , and θ'_j , $S'_j(I_j, \theta'_j) = S_j(I_j, \theta_j)$

Proof. Suppose not, so $y(\theta'_i, \theta_{-i}) \neq i$. By strategy-proofness, $-t_i(\theta'_i, \theta_{-i}) \geq \theta'_i - t_i(\theta_i, \theta_{-i})$, which implies $-t_i(\theta'_i, \theta_{-i}) > \theta_i - t_i(\theta_i, \theta_{-i})$, so θ_i can profitably imitate θ'_i , a contradiction.

Definition 26. (G, S_N) has threshold pricing if:

$$t_{i}(\theta_{N}) = \begin{cases} \min_{\theta_{i}' \in \Theta_{i}} \theta_{i}' \mid y(\theta_{i}', \theta_{-i}) = i & \text{if } y(\theta_{N}) = i \\ 0 & \text{otherwise} \end{cases}$$
(24)

Proposition 16. If (G, S_N) is optimal and strategy-proof, then (G, S_N) has threshold pricing.

Proof. Proposition 14 pins down the payments whenever $y(\theta_N) \neq i$.

We prove the rest by induction. (G, S_N) is optimal, so θ_i^1 's participation constraint binds. Thus, Equation 24 holds when for θ_i^1 . Suppose that Equation 24 holds for all $\theta_i^{k'}$ such that $k' \leq k$. We prove it holds for θ_i^{k+1} .

Take any θ_{-i} . There are three cases to consider.

If $y(\theta_i^k, \theta_{-i}) = i$, then strategy-proofness implies that $y(\theta_i^{k+1}, \theta_{-i}) = i$ and $t_i(\theta_i^{k+1}, \theta_{-i}) = t_i(\theta_i^k, \theta_{-i}) = \min_{\theta_i' \in \Theta_i} \theta_i' \mid y(\theta_i', \theta_{-i}) = i$.

If $y(\theta_i^{k+1}, \theta_{-i}) \neq i$, then $t_i(\theta_i, \theta_{-i}) = 0$.

Notice that, in the previous two cases, θ_i^{k+1} is exactly indifferent between S_i and deviating to imitate type θ_i^k . Finally, suppose $y(\theta_i^k, \theta_{-i}) \neq i$ and $y(\theta_i^{k+1}, \theta_{-i}) = i$. $t_i(\theta_i^{k+1}, \theta_{-i}) \leq \theta_i^{k+1}$, since (G, S_N) is strategy-proof. If $t_i(\theta_i^{k+1}, \theta_{-i}) < \theta_i^{k+1}$, then (G, S_N) is not optimal, since the incentive constraints do not bind locally downward (Proposition 3). Thus, $t_i(\theta_i^{k+1}, \theta_{-i}) = \theta_i^{k+1}$, and the inductive step is proved.

Given (G, S_N) , let Θ_i^h denote the types of *i* that are consistent with *i*'s actions up to history *h*, that is:

$$\Theta_i^h = \{\theta_i \mid \forall h', h'' \leq h : [h' \in I_i, h'' \in \sigma(h')] \to [S_i(I_i, \theta_i) = \mathcal{A}(h'')]\}$$
(25)

 $\text{For } \hat{N} \subseteq N, \, \text{let } \Theta^h_{\hat{N}} = \times_{i \in \hat{N}} \Theta^h_i.$

Proposition 17. If $h \prec h'$ then $\Theta_i^h \supseteq \Theta_i^{h'}$. If $h \in I_i$ and $h' \in I_i$, then $\Theta_i^h = \Theta_i^{h'}$.

The first is clear by inspection. The second follows because the definition of Θ_i^h invokes only *i*'s past information sets and actions, and *G* has perfect recall. Thus, we define $\Theta_i^{I_i} = \Theta_i^h \mid h \in I_i$. Define also:

$$\underline{\theta}_i^h = \min\{\theta_i \in \Theta_i^h\} \tag{26}$$

$$\overline{\theta}_i^h = \max\{\theta_i \in \Theta_i^h\}$$
(27)

The next proposition states that strategy-proofness constrains what agents can learn about each others' play midway through the protocol. In essence, it says that if, at some history h where i is called to play, i can affect whether or not θ_j wins, then i cannot (at this information set) rule out the possibility that j's type is instead some $\theta'_j > \theta_j$.

Proposition 18. Assume (G, S_N) is optimal and strategy-proof. Take any information set I_i and history $h \in I_i$. Take any $\theta_i, \theta'_i \in \Theta^h_i, \theta_j \in \Theta^h_j$, and $\theta_{N \setminus \{i,j\}} \in \Theta^h_{N \setminus \{i,j\}}$.

If $y(\theta_i, \theta_j, \theta_{N \setminus \{i,j\}}) = j$ and $y(\theta'_i, \theta_j, \theta_{N \setminus \{i,j\}}) \neq j$, then $\forall \theta'_j > \theta_j : \exists h' \in I_i : \theta'_j \in \Theta_j^{h'}$ and $\theta_{N \setminus \{i,j\}} \in \Theta_{N \setminus \{i,j\}}^{h'}$.

Proof. Suppose not. We construct a strategy profile S'_{-j} such that θ'_j has a profitable deviation. For $l \in N \setminus \{i, j\}$, let l imitate θ_l ; that is $\forall I_l : \forall \theta'_l : S'_l(I_l, \theta'_l) = S_l(I_l, \theta_l)$. Let i imitate θ'_i unless he encounters I_i , and let him imitate type θ_i if he has encountered I_i . Formally:

$$\forall I'_i : \forall \theta''_i : S'_i(I'_i, \theta''_i) = \begin{cases} S_i(I'_i, \theta_i) & \text{if } \exists h'' \in I'_i : \exists h''' \in I_i : h''' \leq h'' \\ S_i(I'_i, \theta'_i) & \text{otherwise} \end{cases}$$
(28)

By Proposition 16, (G, S_N) has threshold pricing. If type θ'_j deviates to imitate θ_j , then (when facing S'_j), the path of play passes through I_i , so j wins at price $\min_{\theta''_j \in \Theta_j} \theta''_j \mid y(\theta_i, \theta''_j, \theta_{N\setminus\{i,j\}}) = j$, for a positive surplus since $\theta'_j > \theta_j$. On the other hand, if type θ'_j plays according to S_j , then the path of play does not pass through I_i , so j either wins at a strictly higher price $\min_{\theta''_j \in \Theta_j} \theta''_j \mid y(\theta'_i, \theta''_j, \theta_{N\setminus\{i,j\}}) = j$, or does not win and has zero surplus. Thus, j has a profitable deviation, and (G, S_N) is not strategy-proof, a contradiction.

Let W_i^h denote the subset of *i*'s types that might reach *h* and then win. Similarly, let L_i^h denote the subset of *i*'s types that might reach *h* and then lose.

$$W_i^h = \{\theta_i \in \Theta_i^h \mid \exists \theta_{-i} \in \Theta_{-i}^h : y(\theta_i, \theta_{-i}) = i\}$$

$$\tag{29}$$

$$L_i^h = \{\theta_i \in \Theta_i^h \mid \exists \theta_{-i} \in \Theta_{-i}^h : y(\theta_i, \theta_{-i}) \neq i\}$$
(30)

Definition 27. (G, S_N) is winner-pooling if for all I_i , $h \in I_i$:

- 1. Either: $\forall \theta_i, \theta'_i \in W_i^h : S_i(I_i, \theta_i) = S_i(I_i, \theta'_i)$
- 2. Or: $W_i^h \cap L_i^h = \emptyset$

Proposition 19. Assume F_N is symmetric and regular, and (G, S_N) is optimal, orderly, and strategy-proof. If (G, S_N) is credible, then (G, S_N) is winner-pooling.

Before starting the proof of Proposition 19, we highlight that this is the reason that we have assumed regularity and orderliness in the statement of Theorem 2. Together, regularity and orderliness imply that, if there are two distinct types $\theta_i < \theta'_i$ in W^h_i that do not pool on the same action, then there exists θ_{-i} such that θ_i loses when facing θ_{-i} , but θ'_i wins. This enables us to construct profitable safe deviations for the auctioneer.³⁶

Proof. Under the assumptions of Proposition 19, we will show that if (G, S_N) is not winner-pooling, then the auctioneer has a profitable safe deviation, so (G, S_N) is not credible.

Let h^* be some history at which the winner-pooling property does not hold; we pick h^* such that, for all $h \prec h^*$, h is not a counterexample to winner-pooling. Since (G, S_N) is orderly and the winner-pooling property held at all predecessors to h^* , it follows that for all *i*, either $W_i^{h^*} = \emptyset$ or $W_i^{h^*} = \{\theta_i \mid \theta_i \triangleright \max_{j \neq i} \underline{\theta}_j^{h^*} \text{ and } \theta_i \triangleright \rho\}.$

Let i^* denote $P(h^*)$, and $I_{i^*}^*$ the corresponding information set. Since the winnerpooling property doesn't hold at h^* , $W_{i^*}^{h^*} \cap L_{i^*}^{h^*} \neq \emptyset$ and there exist two distinct actions taken by types in $W_{i^*}^{h^*}$ at $I_{i^*}^*$. Since (G, S_N) is orderly, $\min W_{i^*}^{h^*} \in W_{i^*}^{h^*} \cap L_{i^*}^{h^*}$. Define

$$\theta_{i^*}^* = \min^{\triangleright} \theta_{i^*} \in W_{i^*}^{h^*} \mid S_{i^*}(I_{i^*}^*, \theta_{i^*}) \neq S_{i^*}(I_{i^*}^*, \min^{\triangleright} W_{i^*}^{h^*})$$
(31)

We are going to squeeze extra revenue out of agent i^* when his type is $\theta_{i^*}^*$: by his actions at h^* , he hints that his type is more than high enough to win. Let h^{**} be the immediate successor of h^* that would be reached by $\theta_{i^*}^*$, that is

$$h^{**} = h \mid h \in \sigma(h^*) \text{ and } \theta^*_{i^*} \in \Theta^h_{i^*}$$

$$(32)$$

Since $W_{i^*}^{h^*} \cap L_{i^*}^{h^*} \neq \emptyset$ and (G, S_N) is orderly, $\{j \in N \mid W_j^{h^*} \neq \emptyset\}$ includes i^* and at least one other agent. For each $i \in N$, we assign a nemesis:

$$\psi(i) = \max^{\triangleright} \{ j \in N \setminus \{i\} \mid W_j^{h^*} \neq \emptyset \}$$
(33)

By choosing i's nemesis in this way, we ensure a useful property; given any θ_j , we can find $\theta_{\psi(i)}$ such that i has the same allocation and transfer when the highest opponent type is θ_j and when it is $\theta_{\psi(i)}$. Similarly, given any θ_i , we can find $\theta_{\psi(i)}$ that forces i to pay exactly θ_i if he wins (by threshold pricing). Formally, we say $\theta_{\psi(i)}$ is *i*-equivalent to θ_j if

$$\{\theta_i \mid \theta_i \succeq \theta_j\} = \{\theta_i \mid \theta_i \succeq \theta_{\psi(i)}\}$$
(34)

where \geq is the reflexive order implied by the strict order \triangleright .

Given S_0^G (with corresponding λ), we now exhibit a (partial) behavioral strategy that

 $^{^{36}}$ If type spaces were continuous, regularity would by itself imply the desired property for *every* optimal allocation rule. However, for discrete types, we need to pick a particular allocation rule - and the orderly one will do.

deviates from S_0^G upon encountering h^{**} and is strictly profitable. We describe this algorithmically. The description is lengthy, because it must produce a safe deviation for any extensive game form in a large class. We start by defining several subroutines for the algorithm.

The algorithm calls the following subroutine: Given some variable \hat{h} that takes values in the set of histories, we can start at the initial value of \hat{h} and communicate with i as though the opponent types were θ_{-i} , updating \hat{h} as we go along. When we do this, we say that we **simulate** θ_{-i} against i starting from \hat{h} , until certain specified conditions are met. Formally,

- 1. If [conditions], STOP.
- 2. Else if $P(\hat{h}) \neq i$, set $\hat{h} := h \in \sigma(\hat{h}) \mid \theta_{-i} \in \Theta_{-i}^{h}$
- 3. Else if $P(\hat{h}) = i$:
 - (a) Send $(\lambda(I_i), \lambda(A(I_i)))$ for $I_i \mid \hat{h} \in I_i$ to i.
 - (b) Upon receiving r, set $\hat{h} := h \mid h \in \sigma(\hat{h})$ and $\mathcal{A}(h) = \lambda^{-1}(r)$.
 - (c) Go to step 1.

The algorithm also calls the following subroutine: Given some history h and some θ_{-i} , where i was called to play at h's immediate predecessor, we may find the cousin of h consistent with θ_{-i} . This is the history that immediately follows from the same information set, is consistent with the action i just took, but is also consistent with the opponent types being θ_{-i} . Formally, let $\operatorname{cousin}(h, \theta_{-i})$ be equal to h' such that $\exists I_i : \exists h'', h'''$:

- 1. $h'', h''' \in I_i$
- 2. $h \in \sigma(h'')$
- 3. $h' \in \sigma(h''')$
- 4. $\mathcal{A}(h) = \mathcal{A}(h')$
- 5. $\theta_{-i} \in \Theta_{-i}^{h'}$

Clearly, it is not always possible to find such a history. But we will be careful to prove that $cousin(h, \theta_{-i})$ is well-defined when we invoke it.

Our algorithm keeps track of several variables:

- 1. A best offer, initialized $\beta := \theta_i^*$.
- 2. A set of 'active' agents, initialized $\hat{N} := N$.

- 3. The agent we are currently communicating with, $\hat{i} := i^*$.
- 4. A simulated history, for each agent: $\hat{h}_{i^*} := h^{**}$ and for $i \in N \setminus \{i^*\}$, $\hat{h}_i := h^*$.

The algorithm proceeds in three stages. At h^{**} , i^{*} 's type could be at least $\theta_{i^*}^{*}$, but it could also be too low to exploit (if some types not in $W_{i^*}^{h^*}$ took the same action as $\theta_{i^*}^{*}$ at h^*). In Stage 1, we check whether i^{*} 's type is at least $\theta_{i^*}^{*}$. If it is, we set β to be the least type consistent with i^{*} 's responses, and go to Stage 2. Otherwise, we lower β appropriately, and proceed to Stage 2. In Stage 2, we cycle through the bidders, updating β to be equal to the highest type we've confirmed so far, until we have found the bidder with the highest type (breaking ties with \triangleright). Finally, in Stage 3, we sell to the bidder with the highest type (if it's above the reserve), at a price greater than or equal to the price in the original protocol. We use := for the assignment operator, and : \in to assign an arbitrary element in the set on the right-hand side.

Stage 1

- 1. Pick $\theta_{\psi(i^*)}$ that is i^* -equivalent to β .
- 2. Simulate $(\theta_{\psi(i^*)}, \underline{\theta}_{N \setminus \{i^*, \psi(i^*)\}}^{h^*})$ against i^* starting from \hat{h}_{i^*} , until either $\underline{\theta}_{i^*}^{\hat{h}_{i^*}} \geq \beta$ or $\hat{h}_{i^*} \in \mathbb{Z}$.
- 3. If $\underline{\theta}_{i^*}^{\hat{h}_{i^*}} \geq \beta$, then set $\beta := \underline{\theta}_{i^*}^{\hat{h}_{i^*}}$ and go to Stage 2.
- 4. Else, set $\hat{N} := \hat{N} \setminus \{i^*\}, \beta := \min_{i \neq i^*, \theta_i}^{\triangleright} \theta_i \mid \theta_i \in W_i^{h^*}$ and go to Stage 2.

Stage 2

- 1. If $\hat{N} = 1$, go to Stage 3.
- 2. Set $\hat{i} :\in \{i \in \hat{N} \mid \underline{\theta}_i^{\hat{h}_i} \triangleleft \beta\}.$
- 3. Pick $\theta_{\psi(\hat{i})}$ that is \hat{i} -equivalent to β .
- 4. If $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*}) \notin \Theta_{-\hat{i}}^{\hat{h}_{\hat{i}}}$, set $\hat{h}_{\hat{i}} := \operatorname{cousin}(\hat{h}_{\hat{i}}, (\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*}))$.
- 5. Simulate $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*})$ against \hat{i} starting from $\hat{h}_{\hat{i}}$, until either $\underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}} \succeq \beta$ or $\hat{h}_{\hat{i}} \in Z$.
- 6. If $\underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}} \geq \beta$, set $\beta := \underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}}$ and go to Step 1 of Stage 2.
- 7. Else, set $\hat{N} := \hat{N} \setminus {\hat{i}}$ and go to Step 1 of Stage 2.

Stage 3

- 1. Set $\hat{i} := i \mid i \in \hat{N}$.
- 2. Pick $\theta_{\psi(\hat{i})}$ that is \hat{i} -equivalent to β .

- 3. If $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus{\{\hat{i},\psi(\hat{i})\}}}^{h^*}) \notin \Theta_{-\hat{i}}^{\hat{h}_{\hat{i}}}$, set $\hat{h}_{\hat{i}} := \operatorname{cousin}(\hat{h}_{\hat{i}}, (\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus{\{\hat{i},\psi(\hat{i})\}}}^{h^*}))$.
- 4. Simulate $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*})$ against \hat{i} starting from $\hat{h}_{\hat{i}}$, until $\hat{h}_{\hat{i}} \in \mathbb{Z}$.
- 5. Choose the outcome that corresponds to that terminal history, $x = g(\hat{h}_i)$, and terminate.

Since (G, S_N) is orderly, the deviation does not change the allocation. In particular, some agent \hat{i} is removed from \hat{N} only when we know that $\theta_{\psi(\hat{i})} > \theta_{\hat{i}}$, since $\theta_{\psi(\hat{i})}$ is \hat{i} equivalent to β , the latter implies that $\beta > \theta_{\hat{i}}$.³⁷ Moreover, since (G, S_N) is orderly and has threshold pricing (by Proposition 16), the resulting algorithm results in transfers that are always at least as high as the transfers under (G, S_N) . The transfers are strictly higher for at least one type profile, namely $(\theta_{i^*}^*, \underline{\theta}_{-i^*}^{h^*})$. Under (G, S_N) , $t_{i^*}(\theta_{i^*}^*, \underline{\theta}_{-i^*}^{h^*}) = \min_{i=1}^{n} W_{i^*}^{h^*}$, whereas under the deviation i^* 's transfer is $\theta_{i^*}^*$. Thus, the deviation is profitable.

It remains to prove that the deviation is safe. When we first start communicating with any agent \hat{i} under the deviation, we are simulating opponent types that are consistent with h^* , because the winner-pooling property holds at all histories prior to h^* , and we have chosen the simulated nemesis type $\theta_{\psi(\hat{i})}$ to be in $W^{h^*}_{\psi(\hat{i})}$. (Thus, Step 4 of Stage 2 and Step 3 of Stage 3 are not triggered if this is the first time the deviating algorithm is communicating with that agent.)

Whenever the deviation communicates with some agent i for a second time, we have to prove that we can find cousins (in Step 4 of Stage 2 and Step 3 of Stage 3) in the way the algorithm requires. Let $\theta_{\psi(\hat{i})}^{\text{old}}$ and β^{old} denote the simulated nemesis type and the best offer from the last time the algorithm communicated with \hat{i} . Let $\theta_{\psi(\hat{i})}^{\text{new}}$ and β^{new} denote the current simulated nemesis type and best offer. Observe that we always revise the nemesis type upwards; $\beta^{\text{old}} \leq \beta^{\text{new}}$, so $\theta_{\psi(\hat{i})}^{\text{old}} \leq \theta_{\psi(\hat{i})}^{\text{new}}$. If $\theta_{\psi(\hat{i})}^{\text{old}} = \theta_{\psi(\hat{i})}^{\text{new}}$, we are done, since $(\theta_{\psi(\hat{i})}^{\text{old}}, \underline{\theta}_{-N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*}) \in \Theta_{-\hat{i}}^{\hat{h}_i}$. Otherwise, consider h', the immediate predecessor of \hat{h}_i . At h', \hat{i} is called to play, and it is not yet clear whether $\psi(\hat{i})$ wins. In particular, $\theta_{\psi(\hat{i})}^{\text{old}}$ would win against $\underline{\theta}_{\hat{i}}^{h'}$, but would lose against $\underline{\theta}_{\hat{i}}^{\hat{h}_i}$, *i.e.* $y(\underline{\theta}_{\hat{i}}^{h}, \theta_{\psi(\hat{i})}^{\text{old}}, \underline{\theta}_{-N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*}) = \psi(\hat{i}) \neq$ $y(\underline{\theta}_{\hat{i}}^{\hat{h}_i}, \theta_{\psi(\hat{i})}^{\text{old}}, \underline{\theta}_{-N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*})$. By Proposition 18, there exists another history h'' in the same information set as h', such that $(\theta_{\psi(\hat{i})}^{\text{new}}, \underline{\theta}_{-N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*}) \in \Theta_{-\hat{i}}^{h''}$. Thus, we can find cousins in the way that the algorithm requires.

Observe that, whenever \hat{i} is removed from \hat{N} , he has seen a communication sequence that is consistent with his reaching a terminal history with an opponent type profile such that \hat{i} does not win and has a zero transfer, and the Stage 3 outcome respects that. At Stage 3, the final agent \hat{i} 's observation is consistent with $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*})$. Thus, the algorithm produces a profitable safe deviation.

³⁷Since (G, S_N) is orderly, we must eventually learn either that $\theta_{\hat{i}} > \theta_{\psi(\hat{i})}$ or vice versa, since this information is necessary to determine whether \hat{i} or $\psi(\hat{i})$ should win when the other agents' types are $\underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*}$. Thus, reaching Step 4 of Stage 1 or Step 7 of Stage 2 implies that $\beta > \theta_{\hat{i}}$.

We are now ready to show that, under the assumptions of Theorem 2, if (G, S_N) is credible and strategy-proof, then (G, S_N) is an ascending auction. With Propositions 16 and 19 in hand, what remains is mostly an exercise in labeling.

Bidder i is active at h if $W_i^h \neq \emptyset$. There are three cases to consider:

- 1. An active bidder is called to play, and there is more than one active bidder.
- 2. An inactive bidder is called to play.
- 3. An active bidder is called to play, and there are no other active bidders. (We leave this case till last - it can only happen when every other bidder has a type below the reserve.)

Take any I_i and $h \in I_i$ such that an active bidder i is called to play. Suppose there exists another active bidder, so $W_i^h \cap L_i^h \neq \emptyset$. There is some action $S_i(I_i, \theta_i^K)$ that is taken by the highest type of i. Proposition 19 implies that for all $\theta_i \in W_i^h$, $S_i(I_i, \theta_i) = S_i(I_i, \theta_i^K)$. Thus, any agent who does not play that action has **quit**. The **bid** at I_i is the least type of i consistent with playing $S_i(I_i, \theta_i^K)$, that is $\min_{i \in \Theta_i^h} \{\theta_i \in \Theta_i^h \mid S_i(I_i, \theta_i) = S_i(I_i, \theta_i^K)\}$. By Proposition 17, each bid is weakly more than the last bid that i placed.

By construction, all types strictly below the bid quit. Since (G, S_N) is orderly, if there is no high bidder, then all types weakly above the reserve ρ place a bid. Similarly, all types above the current high bid place a bid.

If bidder i quits, then he either has a type lower than the reserve, or we have identified another bidder whose type is greater than i's (according to the order \triangleright). Thus, since (G, S_N) is orderly, once i is inactive, further information about his type no longer affects the outcome, so (since (G, S_N) is pruned) only active bidders are called to play. Similarly, if i is the current high bidder at history h and there is another active bidder, then by Proposition 19, all i's types who reach h take the same action, and (by (G, S_N) pruned) i is not called to play at h. Thus, if i is called to play at h, he is an active bidder who is not the current high bidder.

Suppose an active bidder *i* is called to play at *h* and is the unique active bidder. Since (G, S_N) is pruned, *i* is not the current high bidder, which implies that there is *no* high bidder - all the other bidders have types below the reserve. Let I_i be such that $h \in I_i$.

In this case, we can define an action a as **quitting** if there is no type above the reserve that plays a, that is:

$$\neg \exists \theta_i \in \Theta_i^h \mid \theta_i \triangleright \rho \text{ and } S_i(I_i, \theta_i) = a \tag{35}$$

For any non-quitting action a, the associated **bid** is:

$$\min^{\triangleright} \{\theta_i \mid \theta_i \triangleright \rho \text{ or } [\theta_i \in \Theta^h_i \text{ and } S_i(I_i, \theta_i) = a]\}$$
(36)

By construction, if i has a type strictly below the bid associated with a, then he does

not play a. If i has a type above the reserve, then he places a bid. However, $W_i^h \cap L_i^h = \emptyset$, so there can be multiple actions that place bids. Again, by Proposition 17, each bid is weakly more than the last bid that i placed.

The three conditions that specify what happens when the auction ends are similarly entailed by orderliness and threshold pricing (Proposition 16). If there are no active bidders at h, then for all i, $\rho \triangleright \overline{\theta}_i^h$. Thus, the object is not sold, and since (G, S_N) is pruned, h is a terminal history. If the high bidder i is the unique active bidder at h, then we know that no bidder in $N \setminus i$ has a higher type than i, and that i's current bid is equal to $\min_{j \neq i} \{\theta_i \mid \theta_i \triangleright \max_{j \neq i} \theta_j \text{ and } \theta_i \triangleright \rho\} = \min_{i=1}^{i} \{\theta_i \mid y(\theta_i, \theta_{-i}) = i\}$. Thus, i must win and pay his bid, and since (G, S_N) is pruned, h is a terminal history. Finally, if the high bidder has bid θ^K and no active bidder has higher tie-breaking priority, then i must win and pay θ^K , and since (G, S_N) is pruned, h is a terminal history.

This completes the proof that, under the assumptions of Theorem 2, if (G, S_N) is credible and strategy-proof, then (G, S_N) is an ascending auction.

$\textbf{B.4.2} \quad \textbf{ascending} \rightarrow \textbf{credible}, \, \textbf{strategy-proof}$

Now we show that if (G, S_N) is orderly, optimal, and an ascending auction, it is credible and strategy-proof.

That (G, S_N) is strategy-proof is straightforward. It remains to show that (G, S_N) is credible. As a preliminary, we prove that for any safe deviation $S'_0 \in \mathcal{S}^*_0(S^G_0, S_N)$ and for any S'_{-i} , S_i is a best response to (S'_0, S'_{-i}) in the messaging game.

First, consider information sets at which there is a unique action that places a bid. Take any *i*, I_i , and θ_i such that $\theta_i \in \Theta_i^{I_i}$. Recall that S_i requires that *i* quit if θ_i is strictly below the bid $b(I_i)$ at I_i , and that *i* places the bid if θ_i is above the least high bid consistent with reaching I_i . The least high bid consistent with reaching I_i is, formally,

$$\min^{\triangleright} \{\rho, \min_{h \in I_i, j \neq i} \frac{\theta_j^h}{\theta_j}\}$$
(37)

And, since (G, S_N) is optimal and has threshold pricing,

$$b(I_i) \trianglelefteq \min^{\triangleright} \{\theta'_i \mid \theta'_i \rhd \min^{\triangleright} \{\rho, \min^{\flat} \{\rho, \min^{\flat} \{\theta_j\}\}\}$$
(38)

For any safe deviation S'_0 and for any S'_{-i} , it is optimal for i to quit (upon reaching information set I_i) if $\theta_i \triangleleft \min^{\triangleright} \{\rho, \min_{h \in I_i, j \neq i} \underline{\theta}_j^h\}$. In particular, note that under (G, S_N) , if iwins after reaching I_i , he pays at least $\min^{\triangleright} \{\rho, \min_{h \in I_i, j \neq i} \underline{\theta}_j^h\}$. Thus, for any safe deviation, i's best possible payoff upon placing a bid is no more than zero, so it is optimal to quit (which yields zero payoff).

For any safe deviation S'_0 and for any S'_{-i} , it is optimal for *i* to place a bid if θ_i is

weakly above that bid. This is because *i* can quit if the required bid ever rises strictly above θ_i . Under any safe deviation, *i* cannot be charged more than θ_i unless he (at some later point) bids more than θ_i . Thus, the worst possible payoff from placing a bid is zero, and the best possible payoff from quitting is zero.

By the above arguments and Equation 38, there are three possibilities at each I_i and $\theta_i \in \Theta_i^{I_i}$:

- 1. $\min_{h \in I_i, j \neq i} \stackrel{\triangleright}{=} \theta_j^h \} \triangleleft \theta_i$, in which case S_i requires that *i* place a bid, and this is a best response to (S'_0, S'_{-i}) .
- 2. $\theta_i \triangleleft b(I_i)$, in which case S_i requires *i* to quit, and this is a best response to (S'_0, S'_{-i}) .
- 3. $b(I_i) \leq \theta_i < \min_{h \in I_i, j \neq i} \theta_j^h$, in which case S_i is underdetermined, and both quitting now or placing the bid and quitting later are best responses to (S'_0, S'_{-i}) .

Finally, consider information sets at which there are multiple bid-placing actions. In this case, under any safe deviation, i is sure to win if and only if he eventually bids the reserve - this implies that S_i remains a best response to any safe deviation.

Suppose now that (G, S_N) is an orderly ascending auction but not credible, so the auctioneer has a profitable safe deviation S'_0 . Consider a corresponding G' in which the auctioneer 'commits openly' to that deviation, that is to say, G' such that S'_0 runs G'. For all i, S_i is a best response to (S'_0, S_{-i}) , so (G', S_N) is also BIC. (We abuse notation slightly to use S_N as a strategy profile for G and G'. Every information set in G' has a corresponding information set in G, so it is clear what is meant.) By hypothesis, S'_0 is a profitable deviation, so $\pi(G', S_N) > \pi(G, S_N)$, so (G, S_N) is not optimal. Thus, if (G, S_N) is orderly, optimal, and an ascending auction, then (G, S_N) is credible. This completes the proof of Theorem 2.

B.5 Proposition 7

Suppose (G, S_N) is a twin-bid auction and strategy-proof. We drop the superscripts on t_i^{G,S_N} and y^{G,S_N} to reduce clutter. Strategy-proofness requires:

$$t_i(\theta'_i, \theta_{-i}) - t_i(\theta_i, \theta_{-i}) \le \theta'_i \tag{39}$$

$$\theta_i'' \le t_i(\theta_i''', \theta_{-i}') - t_i(\theta_i'', \theta_{-i}') \tag{40}$$

 y^{G,S_N} is monotone, so $y(\theta_i, \theta'_{-i}) \neq i$ and $y(\theta''_i, \theta_{-i}) = i$. It follows that:

$$t_i(\theta_i, \theta_{-i}) = t_i(\theta_i, \theta'_{-i}) = t_i(\theta''_i, \theta'_{-i})$$

$$\tag{41}$$

$$t_i(\theta_i^{\prime\prime\prime},\theta_{-i}^{\prime}) = t_i(\theta_i^{\prime\prime\prime},\theta_{-i}) = t_i(\theta_i^{\prime},\theta_{-i})$$

$$\tag{42}$$

where the first equality in each line follows from the definition of a twin-bid auction and the second equality follows from strategy-proofness. Substituting into Equation 40 yields

$$\theta_i'' \le t_i(\theta_i', \theta_{-i}) - t_i(\theta_i, \theta_{-i}) \tag{43}$$

which contradicts Equation 39.

B.6 Theorem 4

B.6.1 virtual ascending \rightarrow credible, strategy-proof

Suppose (G, S_N) is a virtual ascending auction. By inspection, (G, S_N) is strategy-proof. Moreover, S_i is a best response to any (S'_0, S_{-i}) for $S'_0 \in \mathcal{S}^*_0(S^G_0, S_N)$. (This requires only small modifications to the proof of Theorem 2, which we omit to avoid repetition.) Thus, if (G, S_N) is not credible, then there exists (G', S_N) that yields strictly higher expected revenue for the auctioneer, which implies that (G, S_N) is not optimal. Thus, if (G, S_N) is optimal and a virtual ascending auction, then (G, S_N) is credible.

B.6.2 credible, strategy-proof \rightarrow virtual ascending

Propositions 15, 16, 17, and 18 pin down some details even when F_N is not symmetric. We start by proving an analogue to Proposition 19.

Proposition 20. Assume F_N is regular and interleaved, and (G, S_N) is optimal and strategy-proof. If (G, S_N) is credible, then (G, S_N) is winner-pooling.

Proof. As before, we will show that if (G, S_N) is not winner-pooling, then the auctioneer has a profitable safe deviation, so (G, S_N) is not credible. Let h^* be some history at which the winner-pooling property does not hold; we pick h^* such that, for all $h \prec h^*$, h is not a counterexample to winner-pooling. Since (G, S_N) is regular and interleaved, and the winner-pooling property held at all predecessors to h^* , Proposition 3 implies that for all i, either $W_i^{h^*} = \emptyset$ or $W_i^{h^*} = \{\theta_i \mid \eta_i(\theta_i) > \max(0, \max_{j \neq i}^{\sim} \eta_j(\underline{\theta}_j^{h^*}))\}$. Let us define $i^*, \theta_{i^*}^*$ and h^{**} as before.

The proof of Proposition 19 works here with the following modifications: First, we define

$$\psi(i) = \operatorname*{argmax}_{j \in N \setminus \{i\}} \{\eta_j(\theta_j^{K_j}) \mid W_j^{h^*} \neq \emptyset\}$$
(44)

Second, we say $\theta_{\psi(i)}$ *i*-separates at $\gamma \in \mathbb{R}$ if

$$\{\theta_i \mid \eta_i(\theta_i) \ge \gamma\} = \{\theta_i \mid \eta_i(\theta_i) \ge \eta_j(\theta_{\psi(i)})\}$$
(45)

Thirdly, we initialize $\beta := \min\{\eta_{i^*}(\theta_{i^*}^*), \eta_{\psi(i^*)}(\theta_{\psi(i^*)}^{K_{\psi(i^*)}})\}$ and specify the algorithm as: Stage 1

- 1. Pick $\theta_{\psi(i^*)}$ that i^* -separates at β .
- 2. Simulate $(\theta_{\psi(i^*)}, \underline{\theta}_{N \setminus \{i^*, \psi(i^*)\}}^{h^*})$ against i^* starting from \hat{h}_{i^*} , until either $\eta_{i^*}(\underline{\theta}_{i^*}^{\hat{h}_{i^*}}) \geq \beta$ or $\hat{h}_{i^*} \in \mathbb{Z}$.
- 3. If $\eta_{i^*}(\underline{\theta}_{i^*}^{\hat{h}_{i^*}}) \geq \beta$, then set $\beta := \underline{\theta}_{i^*}^{\hat{h}_{i^*}}$ and go to Stage 2.
- 4. Else, set $\hat{N} := \hat{N} \setminus \{i^*\},\$

$$\beta := \min_{i \neq i^*, \theta_i} \eta_i(\theta_i) \mid \theta_i \in W_i^{h^*}$$
(46)

and go to Stage 2.

Stage 2

- 1. If $\hat{N} = 1$, go to Stage 3.
- 2. Set $\hat{i} :\in \{i \in \hat{N} \mid \eta_i(\underline{\theta}_i^{\hat{h}_i}) < \beta\}.$
- 3. Pick $\theta_{\psi(\hat{i})}$ that \hat{i} -separates at β .
- 4. If $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*}) \notin \Theta_{-\hat{i}}^{\hat{h}_{\hat{i}}}$, set $\hat{h}_{\hat{i}} := \operatorname{cousin}(\hat{h}_{\hat{i}}, (\theta_{\psi(\hat{i})}, \underline{\theta}_{N\setminus\{\hat{i},\psi(\hat{i})\}}^{h^*}))$.
- 5. Simulate $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*})$ against \hat{i} starting from $\hat{h}_{\hat{i}}$, until either $\eta_{\hat{i}}(\underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}}) \geq \beta$ or $\hat{h}_{\hat{i}} \in \mathbb{Z}$.
- 6. If $\eta_{\hat{i}}(\underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}}) \geq \beta$, set $\beta := \eta_{\hat{i}}(\underline{\theta}_{\hat{i}}^{\hat{h}_{\hat{i}}})$ and go to Step 1 of Stage 2.
- 7. Else, set $\hat{N} := \hat{N} \setminus {\hat{i}}$ and go to Step 1 of Stage 2.

Stage 3

- 1. Set $\hat{i} := i \mid i \in \hat{N}$.
- 2. Pick $\theta_{\psi(\hat{i})}$ that \hat{i} -separates at β .
- 3. If $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*}) \notin \Theta_{-\hat{i}}^{\hat{h}_{\hat{i}}}$, set $\hat{h}_{\hat{i}} := \operatorname{cousin}(\hat{h}_{\hat{i}}, (\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*}))$.
- 4. Simulate $(\theta_{\psi(\hat{i})}, \underline{\theta}_{N \setminus \{\hat{i}, \psi(\hat{i})\}}^{h^*})$ against \hat{i} starting from $\hat{h}_{\hat{i}}$, until $\hat{h}_{\hat{i}} \in \mathbb{Z}$.
- 5. Choose the outcome that corresponds to that terminal history, $x = g(\hat{h}_i)$, and terminate.

This deviating algorithm does not change the allocation; the object is kept if $\max_i \eta_i(\theta_i) \leq 0$, and allocated to $\operatorname{argmax}_i \eta_i(\theta_i)$ otherwise (where $\operatorname{argmax}_i \eta_i(\theta_i)$ is singleton since F_N is interleaved). Revenue is at least as high as under S_0^G , and strictly higher when $\theta_N = (\theta_{i^*}^*, \underline{\theta}_{-i^*}^h)$.

It remains to check that the various steps of the algorithm are well-defined. We can pick separating types in Step 1 of Stage 1, because either $\beta = \eta_{\psi(i^*)}(\theta_{\psi(i^*)}^{K_{\psi(i^*)}})$ or $\beta = \eta_{i^*}(\theta_{i^*}^*) < \eta_{\psi(i^*)}(\theta_{\psi(i^*)}^{K_{\psi(i^*)}})$. In the first case, $\theta_{\psi(i^*)}^{K_{\psi(i^*)}}$ will *i**-separate at β . In the second case, since $\eta_{i^*}(\theta_{i^*}^*) > \eta_{\psi(i^*)}(\theta_{\psi(i^*)}^1)$, by F_N interleaved there exists $\theta_{\psi(i^*)}$ that will *i**-separate at β .

When we pick separating types in Step 3 of Stage 2 and Step 2 of Stage 3, β is equal to $\eta_j(\theta_j)$ for some agent j where $\theta_j \in W_j^{h^*}$. Consider $\theta'_i = \min\{\theta_i \mid \eta_i(\theta_i) \geq \beta\}$. Since $\theta_j \in W_j^{h^*}$, it follows (by F_N regular and interleaved) that $\eta_i(\theta'_i) > \eta_{\psi(i)}(\theta_{\psi(i)}^1)$. If $\eta_i(\theta'_i) < \eta_{\psi(i)}(\theta_{\psi(i)}^{K_{\psi(i)}})$, then, by F_N interleaved, there exists $\theta_{\psi(i)}$ that will \hat{i} -separate at β . If $\eta_i(\theta'_i) \geq \eta_{\psi(i)}(\theta_{\psi(i)}^{K_{\psi(i)}})$ then since β never exceeds $\min\{\eta_i(\theta_i) \mid \eta_i(\theta_i) \geq \eta_{\psi(i)}(\theta_{\psi(i)}^{K_{\psi(i)}})\}$, it follows that $\theta_{\psi(i)}^{K_{\psi(i)}}$ will \hat{i} -separate at β .

We can choose cousins (in Step 4 of Stage 2 and Step 3 of Stage 3) because F_N is regular and (G, S_N) is strategy-proof and optimal, by the same argument as in the proof of Theorem 2 that invokes Proposition 18. Thus, the algorithm is well-defined, and produces a profitable safe deviation, which completes the proof.

With Proposition 20 in hand, we now complete the proof that, under the assumptions of Theorem 4, if (G, S_N) is credible and strategy-proof, then (G, S_N) is a virtual ascending auction. Since F_N is regular and interleaved, the allocation and payments are entirely pinned down by Proposition 3 and 16. At type profile θ_N , agent *i* wins if and only if $\eta_i(\theta_i) > \max\{0, \max_{j \neq i} \eta_j(\theta_j)\}$, and pays $\min \theta'_i \mid \eta_i(\theta'_i) > \max\{0, \max_{j \neq i} \eta_j(\theta_j)\}$.

Bidder *i* is **active** at *h* if $W_i^h \neq \emptyset$. There are three cases to consider:

- 1. An active bidder is called to play, and there is more than one active bidder.
- 2. An inactive bidder is called to play.
- 3. An active bidder is called to play, and there are no other active bidders.

Take any I_i and $h \in I_i$ such that an active bidder *i* is called to play, and there exists another active bidder, so $W_i^h \cap L_i^h \neq \emptyset$. Proposition 20 implies that for all $\theta_i \in W_i^h$, $S_i(I_i, \theta_i) = S_i(I_i, \theta_i^{K_i})$. Thus, if bidder *i* does not play that action, then he has **quit**. The **bid** at I_i is the least type of *i* consistent with playing $S_i(I_i, \theta_i^{K_i})$, that is min $\{\theta_i \in \Theta_i^h \mid S_i(I_i, \theta_i) = S_i(I_i, \theta_i^{K_i})\}$. By Proposition 17, each bid is weakly more than the last bid that *i* placed.

By construction, all types strictly below the bid quit. Since (G, S_N) is optimal, *i* places a bid if $\eta_i(\theta_i) > \max\{0, \max_{j \neq i} \eta_j(b_j)\}$.

If bidder *i* quits, then either his virtual value is negative, or we have identified another bidder with a strictly higher virtual value. Thus, since (G, S_N) is pruned, only active bidders are called to play. Similarly, if *i* is the current high bidder at history *h* and there is another active bidder, then by Proposition 20, all *i*'s types who reach *h* take the same action, and (by (G, S_N) pruned) *i* is not called to play at *h*. Thus, if *i* is called to play at *h*, he is an active bidder who is not the current high bidder.

Suppose an active bidder *i* is called to play at *h* and is the unique active bidder. Since (G, S_N) is pruned, *i* is not the current high bidder, which implies that there is *no* high bidder. Let I_i be such that $h \in I_i$.

In this case, we can define an action a as **quitting** if no type with a positive virtual value plays a, that is:

$$\neg \exists \theta_i \in \Theta_i^h \mid \eta_i(\theta_i) > 0 \text{ and } S_i(I_i, \theta_i) = a$$
(47)

For any non-quitting action a, the associated **bid** is:

$$\min\{\theta_i \mid \eta_i(\theta_i) > 0 \text{ or } [\theta_i \in \Theta_i^h \text{ and } S_i(I_i, \theta_i) = a]\}$$

$$(48)$$

In this case, $W_i^h \cap L_i^h = \emptyset$, so there can be multiple actions that place bids. Again, by Proposition 17, each bid is weakly more than the last bid that *i* placed. The three conditions that specify what happens when the auction ends are entailed by optimality and threshold pricing (Proposition 16). Thus, under the assumptions of Theorem 4, if (G, S_N) is credible and strategy-proof, then (G, S_N) is a virtual ascending auction.

B.7 Proposition 8

There are two bidders *i* and *j*, each with two possible values $0 < \theta_i < \theta'_i < \theta_j < \theta'_j$. The joint distribution of types is $f_N(\theta_i, \theta_j) = f_N(\theta'_i, \theta'_j) = 1/3$, $f_N(\theta_i, \theta'_j) = f_N(\theta'_i, \theta_j) = 1/6$, which satisfies the full rank condition of Cremer and McLean (1988) Theorem 2.

Suppose (G, S_N) is credible and extracts full surplus. By Propositions 1 and 2, it is without loss of generality to restrict (G, S_N) so that after j is called to play once, he is never called to play again.

Take any information set I_j at which j is called to play. Since (G, S_N) is credible, for each action that j takes at I_j , there is a unique transfer from j if j wins (Proposition 6). Since (G, S_N) extracts full surplus, j wins no matter whether he plays $S_j(I_j, \theta_j)$ or $S_j(I_j, \theta'_j)$. Since (G, S_N) is BIC, j's transfer after playing $S_j(I_j, \theta_j)$ is the same as j's transfer after playing $S_j(I_j, \theta'_j)$.

This argument applies to every information set at which j is called to play, so j's transfer does not depend on his own type; $t_j^{G,S_N}(\theta_i, \theta_j) = t_j^{G,S_N}(\theta_i, \theta'_j)$ and $t_j^{G,S_N}(\theta'_i, \theta_j) = t_j^{G,S_N}(\theta'_i, \theta'_j)$.

Since j always wins the object, the auctioneer can safely deviate to communicate with j as though i's type is θ_i or as though i's type is θ'_i . Since (G, S_N) is credible, j's transfer does not depend on i's type; $t_j^{G,S_N}(\theta_i, \theta_j) = t_j^{G,S_N}(\theta'_i, \theta_j)$. Thus, j's transfer is some constant \bar{t}_j across all type profiles. $\theta_j - \bar{t}_j = 0$, so $\theta'_j - \bar{t}_j > 0$, and (G, S_N) does not extract full surplus, a contradiction.

B.8 Proposition 9

To ease notation, we drop the superscripts on t_i^{G,S_N} and y_i^{G,S_N} . Define $\nu(\theta_i, \theta_{-i}) = \theta_i y_i(\theta_i, \theta_{-i}) - t_i(\theta_i, \theta_{-i})$.

We can use the same method as Proposition 4 to derive an upper bound on $\nu(\theta_i, \theta_{-i})$ under *ex post* incentive compatibility and *ex post* individual rationality, namely:

$$\nu(\theta_{i}^{k}, \theta_{-i}) \ge \sum_{l=2}^{k} y_{i}(\theta_{i}^{l-1}, \theta_{-i})(\theta_{i}^{l} - \theta_{i}^{l-1})$$
(49)

This implies a bound on *i*'s expected utility conditional on θ_{-i} , namely

$$\mathbf{E}_{\theta_{i}}[\nu(\theta_{i}^{k},\theta_{-i}) \mid \theta_{-i}] \geq \sum_{k=2}^{K} f_{i}(\theta_{i}^{k}) \sum_{l=1}^{k} y_{i}(\theta_{i}^{l-1},\theta_{-i})(\theta_{i}^{l} - \theta_{i}^{l-1}) \\
= \sum_{k=1}^{K} f_{i}(\theta_{i}^{k}|\theta_{-i}) \frac{1 - F_{i}(\theta_{i}^{k}|\theta_{-i})}{f_{i}(\theta_{i}^{k}|\theta_{-i})} (\theta_{i}^{k+1} - \theta_{i}^{k}) y_{i}(\theta_{i}^{k},\theta_{-i}) \quad (50)$$

which gives an upper bound on expected revenue

$$\pi(G, S_N) = \sum_{i \in N} \mathbf{E}_{\theta_N} \left[\theta_i y_i(\theta_N) - \nu(\theta_i, \theta_{-i}) \right]$$
$$= \sum_{i \in N} \mathbf{E}_{\theta_{-i}} \left[\mathbf{E}_{\theta_i} \left[\theta_i y_i(\theta_N) - \nu(\theta_i, \theta_{-i}) \mid \theta_{-i} \right] \right]$$
$$\leq \sum_{i \in N} \mathbf{E}_{\theta_{-i}} \left[\mathbf{E}_{\theta_i} \left[\eta_i(\theta_i \mid \theta_{-i}) y_i(\theta_N) \mid \theta_{-i} \right] \right] = \mathbf{E}_{\theta_N} \left[\sum_{i \in N} \eta_i(\theta_i \mid \theta_{-i}) y_i(\theta_N) \right]$$
(51)

Moreover, the above equation holds with equality if the local downward incentive constraints bind and the participation constraints bind for the lowest type, where these constraints are conditional on θ_{-i} .

We now apply the argument in Roughgarden and Talgam-Cohen (2013), which is written for continuous densities but works also for the discrete case. For the reader's convenience, we repeat it here.

Proposition 21. If f_N is affiliated and $\theta_j < \theta'_j$, then $\eta_i(\theta_i | \theta_j, \theta_{N \setminus \{i,j\}}) \ge \eta_i(\theta_i | \theta'_j, \theta_{N \setminus \{i,j\}})$

Proof. By affiliation, $F_i(\theta_i | \theta'_j, \theta_{N \setminus \{i,j\}})$ dominates $F_i(\theta_i | \theta_j, \theta_{N \setminus \{i,j\}})$ in terms of hazard rate (Krishna, 2010, Appendix D), i.e.

$$\frac{1 - F_i(\theta_i | \theta_j, \theta_{N \setminus \{i,j\}})}{f_i(\theta_i | \theta_j, \theta_{N \setminus \{i,j\}})} \le \frac{1 - F_i(\theta_i | \theta'_j, \theta_{N \setminus \{i,j\}})}{f_i(\theta_i | \theta'_j, \theta_{N \setminus \{i,j\}})}$$
(52)

which implies $\eta_i(\theta_i|\theta_j, \theta_{N\setminus\{i,j\}}) \ge \eta_i(\theta_i|\theta'_j, \theta_{N\setminus\{i,j\}}).$

Proposition 22. Assume f_N is symmetric, regular, and affiliated. For all $\theta_{N\setminus\{i,j\}}$, if $k \ge k'$, then $\eta_i(\theta_i^k | \theta_{N\setminus\{i,j\}}, \theta_j^{k'}) \ge \eta_j(\theta_j^{k'} | \theta_{N\setminus\{i,j\}}, \theta_i^k)$.

Proof.

$$\eta_{i}(\theta_{i}^{k}|\theta_{N\setminus\{i,j\}},\theta_{j}^{k'}) \geq \theta_{i}^{k'} - \frac{1 - F_{i}(\theta_{i}^{k'}|\theta_{N\setminus\{i,j\}},\theta_{j}^{k'})}{f_{i}(\theta_{i}^{k'}|\theta_{N\setminus\{i,j\}},\theta_{j}^{k'})}(\theta_{i}^{k'+1} - \theta_{i}^{k'})$$

$$\geq \theta_{i}^{k'} - \frac{1 - F_{i}(\theta_{i}^{k'}|\theta_{N\setminus\{i,j\}},\theta_{j}^{k})}{f_{i}(\theta_{i}^{k'}|\theta_{N\setminus\{i,j\}},\theta_{j}^{k})}(\theta_{i}^{k'+1} - \theta_{i}^{k'}) = \eta_{j}(\theta_{j}^{k'}|\theta_{N\setminus\{i,j\}},\theta_{i}^{k}) \quad (53)$$

where the first inequality follows from regularity, the second inequality follows from Proposition 21, and the equality follows from symmetry. \Box

By Proposition 22, the right-hand side of Equation 51 is maximized by, at each θ_N , selling to some agent in $\operatorname{argmax}_i \theta_i$ if $\max_i \eta_i(\theta_i|\theta_{-i}) > 0$, and keeping the object otherwise. The quirky ascending auction does this, and additionally the local incentive constraints bind downward and the participation constraint of the lowest type binds, so the left-hand side of Equation 51 is equal to the right-hand side. Thus, any quirky ascending auction is optimal among *ex post* mechanisms.

It remains to prove that the quirky ascending auction is credible. Once more, note that S_i is a best response to any safe deviation by the auctioneer. Under any safe deviation, if $b_i \leq \theta_i$, then bidder *i*'s utility is non-negative if he continues bidding according to S_i , and zero if he quits now. If $b_i > \theta_i$, then bidder *i*'s utility is non-positive if he continues bidding, and zero if he quits now. Thus, S_i is a best-response to any safe deviation by the auctioneer, regardless of θ_{-i} . For any safe deviation S'_0 , the corresponding protocol (G', S_N) is *ex post* incentive compatible and *ex post* individually rational. Suppose that S'_0 is profitable, so (G', S_N) yields strictly more expected revenue than (G, S_N) . Since (G, S_N) is optimal among *ex post* mechanisms, we have the desired contradiction.

B.9 Proposition 11

Suppose we construct ironed virtual values for discrete type spaces as in Elkind (2007). Let the protocol break ties according to some fixed order on N, when two bids have the same ironed virtual value.

Fix some type profile θ_N . Let us label agents in decreasing order of ironed virtual values, $\{1, 2, \ldots, n\}$, breaking ties according to the fixed order. Let $\{i^1, i^2, \ldots, i^J\}$ be the set picked by the greedy algorithm, in order of selection (where the algorithm breaks ties using the same fixed order). We must show that the protocol described in Subsection 6.1 results in the same allocation.

Take the greedy algorithm's *j*th pick, $i^j = k$. We will show that k is essential with respect to the set of active bidders \hat{N} before k is asked to place a bid strictly above his type. Take any step at which k's bid is equal to his type, and k's score is minimal in \hat{N} . By construction, $\hat{N} \subseteq \{1, 2, \ldots, k\}$, since bidders with lower ironed virtual values have either been put in the allocation or quit.

Take any $Y \subseteq \{1, 2, ..., k\}$ such that $Y \in \mathcal{F}$. We assert that $Y \cup \{k\} \in \mathcal{F}$. There are two cases: either $|Y| \ge j$ or |Y| < j.

If $|Y| \ge j > |\{i^1, \ldots, i^{j-1}\}|$ and $Y \cup \{k\} \notin \mathcal{F}$, then since \mathcal{F} is a matroid, there exists $l \in Y \setminus \{i^1, \ldots, i^{j-1}\}$, such that $\{i^1, \ldots, i^{j-1}\} \cup \{l\} \in \mathcal{F}$. Thus $i^j = k$ is not the greedy algorithm's *j*th pick, a contradiction.

If $|Y| < j = |\{i^1, \ldots, i^j\}|$, then since \mathcal{F} is a matroid, there exists $l \in \{i^1, \ldots, i^j\} \setminus Y$ such that $Y \cup \{l\} \in \mathcal{F}$ and $Y \cup \{l\} \subseteq \{1, \ldots, k\}$. Thus, we can find $Y' \supset Y$ such that $|Y'| = j, Y' \subseteq \{1, \ldots, k\}$, and $Y' \in \mathcal{F}$. From the argument in the previous paragraph, $Y' \cup \{k\} \in \mathcal{F}$, and, since \mathcal{F} is a matroid, $Y \cup \{k\} \in \mathcal{F}$.

We have now established that, since $N \subseteq \{1, 2, ..., k\}$, k is essential with respect to N. Thus the *j*th pick of the greedy algorithm is in the allocation produced by the protocol. This argument holds for all *j*, so the protocol's allocation is a superset of $\{i^1, ..., i^J\}$. But the protocol only sells to bidders with positive ironed virtual values, so its allocation is exactly $\{i^1, ..., i^J\}$, and the protocol is optimal.

Finally, note that for any safe deviation, each bidder's 'truth-telling' strategy is a best response. That is, each bidder should keep bidding so long as the price he faces is weakly below his value, and quit otherwise. Thus, if the auctioneer has a profitable safe deviation, then the original protocol is not optimal, a contradiction.

B.10 Proposition 12

Suppose not. Since (G, S_N) is prior-free credible and efficient, there exist unique transfers $t_i^1(\theta'_i), t_i^1(\theta''_i), t_i^1(\theta''_i)$ that are paid if the public good is provided and *i* has the corresponding type. Since (G, S_N) is strategy-proof, these transfers are all equal $t_i^1(\theta'_i) = t_i^1(\theta''_i) = t_i^1(\theta''_i) = t_i^1(\theta''_i) = t_i^1(\theta''_i) = t_i^1$. Similarly, there exist unique transfers $t_i^0(\theta_i) = t_i^0(\theta'_i) = t_i^0(\theta''_i) = t_i^0$ that are paid if the public good is not provided and *i* has the corresponding type.

 (G, S_N) is strategy-proof and efficient, so $\theta'_i - t_i^1 \ge -t_i^0$, which implies $\theta''_i - t_i^1 > -t_i^0$. Thus, when *i*'s opponents play as though their types are $\theta'_{N\setminus i}$, type θ''_i can profitably imitate θ''_i , a contradiction.