

Chain Stability in Trading Networks*

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June 26, 2019

Abstract

In a general model of trading networks with bilateral contracts, we propose a suitably adapted *chain stability* concept that plays the same role as *pairwise stability* in two-sided settings. We first show that *chain stability* is equivalent to *stability* if all agents' preferences are jointly fully substitutable and satisfy the Laws of Aggregate Supply and Demand. Moreover, in the special case of trading networks with transferable utility, an outcome is consistent with competitive equilibrium if and only if it is chain stable. From a computational perspective, we show that checking whether an outcome is chain stable is substantially easier than directly checking whether an outcome is stable.

*An extended abstract of this work appeared in the *Proceedings of the 19th ACM Conference on Electronic Commerce*. We thank Joseph Shayani for excellent research assistance. Kominers thanks the National Science Foundation (grants CCF-1216095 and SES-1459912, as well as a graduate research fellowship), the Harvard Milton Fund, the Yahoo! Key Scientific Challenges Program, the John M. Olin Center (a Terence M. Considine Fellowship), the Ng Fund and the Mathematics in Economics Research Fund of the Harvard Center of Mathematical Sciences and Applications, the American Mathematical Society, the Simons Foundation, and the University of Melbourne (the Centre for Market Design and an Eminent Research Scholar Award) for support. Nichifor received funding from the Australian Research Council under the Discovery Early Career Research Award DE170101183. Ostrovsky thanks the Alfred P. Sloan Foundation for financial support. Westkamp received funding from the German Science Foundation and from the People Programme (Marie Curie Intra-European Fellowship) of the European Union's Seventh Framework Programme (FP7/2007-2013) under REA grant agreement 628276.

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1 Introduction

Cooperative solution concepts in game theory often rely on coordinated deviations by large groups of agents, including, in some cases, all the agents in the economy. A natural question when considering coordinated deviations is how (and whether) such coalitions can in fact form. Do all the agents in the economy need to consider all the possible deviations by all the possible coalitions? Or is it perhaps sufficient for agents to only consider smaller or more structured types of deviations? Do the agents need to reason about the structure of the entire economy in order to discover a profitable deviation, or is it sufficient for each of them to only consider his or her “local” environment?

A different yet related issue arises when considering the concept of competitive equilibrium. Competitive equilibrium requires specifying prices for *all* possible goods and trades in the economy—even those that are not actually traded. Reliance on “hypothetical” prices for untraded goods may be a relatively minor issue in economies with homogeneous goods and centralized trading, where most (or all) goods are actually traded and thus have observed prices. However, this issue is more problematic in economies with heterogeneous goods and personalized pricing, where only a small fraction of all possible trades in fact take place. In such environments, the reliance of competitive equilibrium on “unobserved” prices raises a number of questions and concerns. Do the agents in the economy know what the “unobserved” prices are? Do they need to? Can agents tell whether a particular set of realized contracts is consistent with competitive equilibrium, given that to verify consistency they would need data that does not actually exist?

A parallel set of issues arises in applied work: An econometrician may want to estimate parameters of interest, and would like to use conditions arising from cooperative solution concepts or from equilibrium requirements. In such cases, when using cooperative solution concepts, does an econometrician need to consider deviations by all possible groups of agents or just chains of agents? Does an econometrician have to worry that assuming competitive equilibrium imposes more structure on outcomes than can be reached by individual interactions?

Shapley and Shubik (1971), Crawford and Knoer (1981), Kelso and Crawford (1982), and Roth (1984) have shown that in two-sided matching environments with substitutable preferences, one needs neither rely on coordinated deviations by large

groups of agents nor on optimization under “missing” prices to perform competitive equilibrium analysis: In two-sided one-to-one and many-to-one matching markets, competitive equilibrium is, in essence, equivalent to *pairwise stability*, i.e., the requirement that no pair of agents wants to mutually deviate from their assignments, in favor of trading with each other. The pairwise stability requirement does not require specifying any “missing” prices, and does not require coordinated deviations by complex coalitions. Given that pairwise deviations are much easier for agents to discover, the equivalence results mitigate potential concerns about solution concepts that are based on discovering large-group deviations or on reasoning about unobserved “missing” prices. Beyond their conceptual interest, our results may contribute to the emerging empirical and econometric literature on matching markets. An econometrician who wants to structurally estimate parameters of interest, such as some aspect of the valuations of the agents, takes the exogenously given characteristics of the economy as independent variables, and takes market outcomes as dependent variables, assuming some solution concept. Our results imply that an econometrician need not take a stand on whether the proper solution concept for a given setting is chain stability, stability, or competitive equilibrium; this means an econometrician can work with whichever solution concept is most convenient when structurally estimating parameters of interest. In matching settings, for instance, the choice sets of agents may be very large, and so estimators that rely on direct comparisons of choice sets may not be computationally feasible; estimators that are based on chain/pairwise stability circumvent these difficulties (Choo and Siow, 2006; Fox and Bajari, 2013; Fox, 2017; Galichon et al., 2019).

In this paper, we establish analogous results for a very rich setting—trading networks with bilateral contracts. We allow agents to be buyers in some contracts and sellers in other contracts, and do not impose *any* restrictions on the network of possible trades. In particular, the market is neither required to have a two-sided structure, nor is the network of possible trades required to have a vertical structure. The model we present here is strictly more general than any of the earlier models in the literature, subsuming settings with discrete and continuous prices, with quasilinear and non-quasilinear utility functions, and with and without indifferences in agents’ preferences. We prove two equivalence results. Our main result shows that if all agents’ preferences jointly satisfy the *full substitutability* condition and the *Laws of Aggregate Supply and Demand* (which we make precise in Section 2.1, by way of a condition we

call *monotone-substitutability*), then the concept of *stability* (under which all possible deviations by groups of agents need to be considered) is equivalent to *chain stability*, under which only deviations by *chains* of agents need to be considered.¹ We also show a corollary of the main result of the current paper and the results of Hatfield et al. (2013): In trading environments with continuously transferable utility, if all agents’ preferences are fully substitutable, then an outcome is consistent with competitive equilibrium² if and only if it is not blocked by any chain. Note that this is not a limit result for large economies in the spirit of Debreu and Scarf (1963)—our equivalence result holds for fixed, finite economies.

After presenting our equivalence results, we quantify the simplicity of chain deviations relative to more general “blocking set” deviations. Formally, we show that as the size of the economy grows, the number of chains of trades (corresponding to possible blocking chains) is a vanishingly small fraction of the number of general sets of trades (corresponding to possible blocking sets). Intuitively, just as in two-sided settings it is much easier to discover a pairwise blocking set than it would be to find a general blocking set, in our setting it is much easier to discover a blocking chain than it would be to find a general blocking set. If the network has additional structure, the simplicity gain can be much higher than suggested by our formal counting result. For example, in the supply chain setting of Ostrovsky (2008), the number of chains increases only polynomially as a function of the number of agents, while the number of sets of contracts increases exponentially.

We also present three examples that demonstrate the roles that our assumptions play in the main equivalence result. The first example shows that if the preferences of some agent do not satisfy the Laws of Aggregate Supply and Demand, then chain stable outcomes may not be stable. The second example shows that if the preferences of some agent are not fully substitutable, then chain stable outcomes may likewise not be stable. The third example illustrates that ensuring robustness to blocking chains

¹Chain stability was originally introduced by Ostrovsky (2008) for a more restrictive, vertical environment in which all trade flows in one direction, from the suppliers of basic inputs to the consumers of final outputs. In the Ostrovsky (2008) environment, any chain of contracts has a beginning and an end, and passes “through” every agent at most once. In the current, richer environment, we adapt the definition of a chain to allow a chain to end at the same node as where it began (thus becoming a “loop”), and to cross itself (potentially several times). However, as before, the essential feature of a chain is that it is a “linked” sequence of trades, such that the agent who is the buyer in a particular trade is the seller in the next trade in the sequence. We discuss our concept of chain stability in more detail in Section 2.2 after introducing it formally.

²That is, one can “fill out” the missing prices to obtain a competitive equilibrium.

that do not “cross” themselves (i.e., chains that involve each agent in at most two contracts) is not sufficient to ensure robustness to general blocking sets. This last example, combined with our equivalence results, illustrates that chain stability plays the same role in the trading network setting as pairwise stability does in two-sided settings: chains are the “essential” blocking sets that one needs to consider to evaluate an outcome’s stability or its consistency with competitive equilibrium.

The model of trading networks that we consider is deliberately very general, encompassing many existing matching models and going beyond them. As a result, the existence of stable outcomes in our full model is not guaranteed (although it is of course guaranteed in many important special cases, such as the quasilinear case with transferable utility considered by Hatfield et al. (2013) and the vertical supply chain setting of Ostrovsky (2008)). The motivation for considering such a general model is two-fold: First, our model allows us to uncover the unifying structure underlying the equivalence between stability and chain stability in various special cases. Second, and relatedly, we establish equivalence for any other special case in which existence holds; moreover, for settings for which the existence of stable outcomes is guaranteed, our results imply that checking the existence of chain stable outcomes is in fact sufficient and that checking chain stability is substantially easier than checking stability. For example, following the circulation of our original draft, Fleiner, Jagadeesan, Jankó, and Teytelboym (2018) showed that stable outcomes are guaranteed to exist in a model of trading networks with frictions in the case of *complete markets*;³ our work immediately implies that chain stability is equivalent to stability in their setting.

The remainder of the paper is organized as follows. Section 1.1 provides an overview of related literature. Section 2 introduces our general model. Section 3 states and proves the main result on the equivalence of stability and chain stability. Section 4 discusses the correspondence between chain stable outcomes and competitive equilibria for the special case of quasilinear preferences and fully transferable utility. Section 5 assesses the simplicity of checking chain stability relative to checking stability directly. Section 6 presents the examples that show the roles of our assumptions. Section 7 concludes.

³Their work is a strict generalization of the model of Hatfield et al. (2013) that goes beyond quasilinearity and allows for certain income effects in agents’ utility functions.

1.1 Related Literature

The concept of blocking is fundamental in the analysis of matching markets. In the original papers of Gale and Shapley (1962) and Shapley and Shubik (1971) on stability in two-sided markets, attention is restricted to *pairwise blocks*, i.e., pairs of agents who mutually prefer each other to their assigned partners. The requirement that a two-sided matching be pairwise stable—i.e., be robust to pairwise blocks—seems much weaker than the requirement that a matching be robust to deviations by arbitrary sets of agents. Indeed, in general, in markets in which some agents are allowed to match with multiple partners, a matching that is robust to deviations by pairs may not be robust to richer deviations.⁴ However, as we discussed in the Introduction, key results in the theory of two-sided, many-to-one matching show that when agents’ preferences are *substitutable* (Kelso and Crawford, 1982; Roth, 1984), pairwise relationships are in fact the essential blocking sets: any pairwise stable matching is also robust to larger deviations.⁵

Ostrovsky (2008) introduced a generalization of two-sided matching to “supply chain” environments. In supply chain matching, goods flow downstream from initial producers to end consumers, potentially with numerous intermediaries in between. In the Ostrovsky (2008) framework, attention is restricted to blocking *chains*—sequences of agents who could benefit from re-contracting with each other along a vertical chain. Outcomes robust to chain deviations are said to be *chain stable*. Chain stability is a natural extension of pairwise stability to the setting in which an agent can be both a buyer and a seller; for example, an agent may be willing to sell a unit of output only if he can buy a unit of input required to produce that output. Ostrovsky (2008) showed that when the preferences of all agents in the economy are fully substitutable (see Definition 1 in Section 2.1), chain stable outcomes are guaranteed to exist. Again, chain stability appears to be a much weaker condition than the requirement that an outcome be robust to deviations by arbitrary sets of agents. However, as in the case of pairwise stability, under the assumption that agents’ preferences are fully substitutable, chains are the essential blocking sets in the supply chain setting: Hatfield and Kominers (2012) showed that in that setting, any chain stable outcome is *stable*,

⁴For example, if every firm in an economy is only interested in hiring an even number of workers, then an empty matching will always be pairwise stable, even in the cases where another, non-empty matching makes all agents in the economy strictly better off.

⁵Hatfield and Kominers (2017) prove this result in a general two-sided matching setting with contracts, and provide an overview of earlier literature on related results in other two-sided settings.

in the sense that it is robust to blocks by arbitrary sets of agents.⁶

Hatfield et al. (2013) dispensed with the vertical structure of the supply chain environment, and instead considered arbitrary trading networks. They also assumed that prices can vary freely (instead of being restricted to a finite discrete set), and that agents’ preferences are quasilinear.⁷ In their analysis, Hatfield et al. (2013) considered a stability concept analogous to that of Hatfield and Kominers (2012), allowing for re-contracting by arbitrary groups of agents. They showed that when agents’ preferences are fully substitutable, stable outcomes exist and are essentially equivalent to competitive equilibria with personalized prices. Our model includes the setting of Hatfield et al. (2013) as a special case—and for that special case, a corollary of our main result is that an outcome is consistent with competitive equilibrium if and only if it is not blocked by any chain of contracts.

Our paper contributes to the literature on the relationships between different solution concepts in matching environments (see, e.g., Echenique and Oviedo (2006), Klaus and Walzl (2009), Westkamp (2010), and Hatfield and Kominers (2017)). It also has parallels in the operations research literature on flows in networks (see, e.g., a textbook treatment by Ahuja et al. (1993)); the “flow decomposition lemma” in that literature states that any “flow” in a network can be “decomposed” into a collection of simple “paths” and “cycles,” resembling the decomposition of any blocking set into a collection of blocking chains in our Theorem 2. Note, however, that “paths” and “cycles” in the flow decomposition lemma cannot cross themselves, while in our environment, we need to allow for the possibility of self-crossing chains (see Example 3 in Section 6). The difficulty is due to the fact that in the “network flows” environment, there is a single type of good “flowing” through the network, and the objective function is the maximization or minimization of the aggregate flow, whereas in our setting many

⁶The setting of Hatfield and Kominers (2012) is a special case of our framework, and for that special case, the Hatfield and Kominers (2012) definition of stability coincides with ours (Definition 4 in Section 2.2). Note, however, that even in the case of vertical networks, our setting is substantially more general than that of Ostrovsky (2008) and Hatfield and Kominers (2012): we allow for arbitrary sets of contracts (as opposed to just finite ones) and explicitly incorporate the case in which an agent may be indifferent between two different sets of contracts (as opposed to having strict preferences); these generalizations are necessary to define the concept of competitive equilibrium and to establish the connections between chain stable outcomes and competitive equilibria.

⁷If one dispenses with supply chain structure without assuming that prices can vary freely, then stable outcomes may not exist (Hatfield and Kominers, 2012). Fleiner, Jankó, Tamura, and Teytelboym (2018) introduced a weaker concept, *trail stability*, for settings without supply chain structure and showed that trail stable outcomes are guaranteed to exist under full substitutability.

different types of goods may be present, and the preferences of agents in the market may be more complex. For the case of quasilinear environments with transferable utility, Candogan et al. (2016) provided a detailed analysis of the connections between results on stability and competitive equilibrium in trading networks and the literature on network flows.

2 Model

Our model includes as special cases the discrete-price models of Ostrovsky (2008) and Hatfield and Kominers (2012), as well as the continuous-price models of Hatfield et al. (2013) and Fleiner, Jagadeesan, Jankó, and Teytelboym (2018). Our notation is closely based on that of Hatfield et al. (2013).

There is an economy with a finite set I of *agents*. Pairs of agents can participate in bilateral *trades*. Each trade ω is associated with a *buyer* $b(\omega) \in I$ and a *seller* $s(\omega) \in I$, with $b(\omega) \neq s(\omega)$ and specifies all the nonpecuniary terms and conditions associated with a relationship between $b(\omega)$ and $s(\omega)$; for instance, ω could specify the transfer of a single unit of an indivisible good or service from $s(\omega)$ to $b(\omega)$.⁸ The set of possible trades, denoted Ω , is finite and exogenously given. Note that we require that the buyer and the seller associated with a trade be distinct agents, but we allow Ω to contain multiple trades associated with the same agents, and allow for the possibility of trades $\omega \in \Omega$ and $\psi \in \Omega$ such that $s(\omega) = b(\psi)$ and $s(\psi) = b(\omega)$.

To capture the purely financial aspect of a transaction associated with a trade, we augment each trade by introducing a price. Formally, a *contract* x is a pair $(\omega, p_\omega) \in \Omega \times \mathbb{R}$ that specifies a trade and an associated price. For a contract $x = (\omega, p_\omega)$, we denote by $b(x) \equiv b(\omega)$ and $s(x) \equiv s(\omega)$ the buyer and the seller associated with the trade ω of x . If $b(x) = i$ for some contract x , then x is *upstream* of, or on the *buy-side* for, i ; similarly, if $s(x) = i$ for some contract x , then x is *downstream* of, or on the *sell-side* for, i . We denote by $X \subseteq \Omega \times \mathbb{R}$ the set of all contracts available to the agents; this set is fixed and exogenously given. It can be infinite (as, e.g., in the setting of Hatfield et al. (2013), where all prices are allowed for all trades, and thus $X = \Omega \times \mathbb{R}$), or finite (as, e.g., in the settings of Ostrovsky (2008) and Hatfield

⁸For some applications, the assignment of buyer and seller roles in a trading relationship follows immediately from the context. In other applications, one needs a convention. For instance, in a two-sided matching market without transfers, we think of agents on one side as “sellers” (in all possible matches) and agents on the other side as “buyers” (in all possible matches).

and Kominers (2012)).

For each agent $i \in I$ and set of contracts $Y \subseteq X$, we let $Y_{\rightarrow i} \equiv \{y \in Y : i = b(y)\}$ denote the set of contracts in Y in which i is the buyer, i.e., the set of upstream contracts for i , and $Y_{i \rightarrow} \equiv \{y \in Y : i = s(y)\}$ denote the set of contracts in Y in which i is the seller, i.e., the set of downstream contracts for i . We let $Y_i \equiv Y_{i \rightarrow} \cup Y_{\rightarrow i}$. We let $a(Y) \equiv \bigcup_{y \in Y} \{b(y), s(y)\}$ denote the set of agents involved in Y as either buyers or sellers. Slightly abusing notation, for a contract $x \in X$, we write $a(x) \equiv a(\{x\})$. We use analogous notation for various properties of trades $\omega \in \Omega$ and sets of trades $\Psi \subseteq \Omega$: e.g., $a(\omega) = \{b(\omega), s(\omega)\}$ and $\Psi_i \equiv \{\omega \in \Psi : i \in a(\omega)\}$. Finally, we denote by $\tau(Y)$ the set of trades involved in contracts in Y : $\tau(Y) \equiv \{\omega \in \Omega : (\omega, p_\omega) \in Y \text{ for some } p_\omega \in \mathbb{R}\}$.

A set of contracts $Y \subseteq X$ is *feasible* if it does not contain two or more contracts associated with the same trade: formally, $Y \subseteq X$ is feasible if $(\omega, p_\omega), (\omega, \hat{p}_\omega) \in Y$ implies that $p_\omega = \hat{p}_\omega$; equivalently, $Y \subseteq X$ is feasible if $|Y| = |\tau(Y)|$. An *outcome* is a feasible set of contracts.

2.1 Preferences

Each agent i has a utility function U_i over feasible sets $Y \subseteq X_i$ of contracts that involve i as the buyer or the seller. For a feasible set $Y \subseteq X_i$, we have that $U_i(Y) \in \mathbb{R} \cup \{-\infty\}$, with the value of $-\infty$ used to denote sets of contracts that are technologically impossible for the agent to undertake (e.g., selling the same object to two different buyers). We assume that $U_i(\emptyset) \in \mathbb{R}$, i.e., any agent's utility from the "outside option" of not forming any contracts is finite.

The *choice correspondence* of agent i from a set of contracts $Y \subseteq X_i$ is defined as the collection of sets of contracts maximizing the utility of agent i :

$$C_i(Y) \equiv \{Z \subseteq Y : Z \text{ is feasible; } \forall \text{ feasible } Z' \subseteq Y, U_i(Z) \geq U_i(Z')\}.$$
⁹

For notational convenience, we also extend the choice correspondence to sets of contracts that do not necessarily involve agent i : for a set of contracts $Y \subseteq X$, $C_i(Y) \equiv C_i(Y_i)$.

We now introduce our first key condition on preferences, *full substitutability*. To ease the exposition, we first present a version of the full substitutability condition that

⁹Note that $C_i(Y)$ may be empty if Y is infinite.

restricts attention to situations in which the choice correspondence is single-valued.¹⁰

Definition 1. The preferences of agent i are *fully substitutable* if:

1. For all sets of contracts $Y, Z \subseteq X_i$ such that $|C_i(Y)| = |C_i(Z)| = 1$, $Y_{i \rightarrow} = Z_{i \rightarrow}$, and $Y_{\rightarrow i} \subseteq Z_{\rightarrow i}$, for the unique $Y^* \in C_i(Y)$ and $Z^* \in C_i(Z)$, we have

$$(Y_{\rightarrow i} \setminus Y_{\rightarrow i}^*) \subseteq (Z_{\rightarrow i} \setminus Z_{\rightarrow i}^*) \text{ and } Y_{i \rightarrow}^* \subseteq Z_{i \rightarrow}^*.$$

2. For all sets of contracts $Y, Z \subseteq X_i$ such that $|C_i(Y)| = |C_i(Z)| = 1$, $Y_{\rightarrow i} = Z_{\rightarrow i}$ and $Y_{i \rightarrow} \subseteq Z_{i \rightarrow}$, for the unique $Y^* \in C_i(Y)$ and $Z^* \in C_i(Z)$, we have

$$(Y_{i \rightarrow} \setminus Y_{i \rightarrow}^*) \subseteq (Z_{i \rightarrow} \setminus Z_{i \rightarrow}^*) \text{ and } Y_{\rightarrow i}^* \subseteq Z_{\rightarrow i}^*.$$

Informally, the choice correspondence C_i is fully substitutable if, when the set of options available to i on one side expands, i both rejects a (weakly) larger set of contracts on that side and selects a (weakly) larger set of contracts on the other side, where “larger” is understood in a set-inclusion sense. Hatfield et al. (2013, 2019) have identified several economically important examples of fully substitutable preferences.

The second property important for our results is that the preferences of all agents satisfy the Laws of Aggregate Supply and Demand. As with full substitutability, we first present a version of the Laws of Aggregate Supply and Demand that restricts attention to situations in which the choice correspondence is single-valued.

Definition 2. The preferences of agent i satisfy the *Law of Aggregate Demand* if for all sets of contracts $Y, Z \subseteq X_i$ such that $|C_i(Y)| = |C_i(Z)| = 1$, $Y_{i \rightarrow} = Z_{i \rightarrow}$, and $Y_{\rightarrow i} \subseteq Z_{\rightarrow i}$, for the unique $Y^* \in C_i(Y)$ and $Z^* \in C_i(Z)$, we have

$$|Z_{\rightarrow i}^*| - |Z_{i \rightarrow}^*| \geq |Y_{\rightarrow i}^*| - |Y_{i \rightarrow}^*|.$$

The preferences of agent i satisfy the *Law of Aggregate Supply* if for all sets of contracts $Y, Z \subseteq X_i$ such that $|C_i(Y)| = |C_i(Z)| = 1$, $Y_{i \rightarrow} \subseteq Z_{i \rightarrow}$, and $Y_{\rightarrow i} = Z_{\rightarrow i}$, for

¹⁰For the case of quasilinear utility functions, the full substitutability definition we use here corresponds to the (CFS) condition of Hatfield et al. (2019). Thus, the results of Hatfield et al. (2019) imply that (again, for the case of quasilinear utility functions) our definition is equivalent to a number of other substitutability concepts that have originated in several distinct literatures. Ostrovsky (2008) and Hatfield et al. (2013) provide detailed discussions of the implications of full substitutability in various environments.

the unique $Y^* \in C_i(Y)$ and $Z^* \in C_i(Z)$, we have

$$|Z_{i \rightarrow}^*| - |Z_{\rightarrow i}^*| \geq |Y_{i \rightarrow}^*| - |Y_{\rightarrow i}^*|.$$

Informally, the choice correspondence C_i satisfies the Law of Aggregate Demand if, when the set of options available to i as a buyer expands, the *net demand of i* , i.e., the difference between the number of buy-side and sell-side contracts demanded by i , (weakly) increases.¹¹ Similarly, the choice correspondence C_i satisfies the Law of Aggregate Supply if, when the set of options available to i as a seller expands, the *net supply of i* , i.e., the difference between the number of sell-side and buy-side contracts supplied by i , (weakly) increases. These conditions extend the canonical Law of Aggregate Demand (Hatfield and Milgrom (2005); see also Alkan and Gale (2003)) to the current setting, in which each agent can be both a buyer in some trades and a seller in others.

Intuitively, if we think of each contract as specifying the transfer of an object, the Laws of Aggregate Supply and Demand require that no object can substitute for *multiple* other objects. Thus, when i obtains access to a new buy-side contract, the total number of buy-side contracts he chooses weakly increases (for a fixed number of sell-side contracts), and, similarly, when i obtains access to a new sell-side contract, the total number of sell-side contracts he chooses weakly increases (for a fixed number of buy-side contracts).¹² For instance, in the setting of the used car market discussed by Hatfield et al. (2013), a trade represents the transfer of an automobile, and so the Laws of Aggregate Supply and Demand hold naturally: purchasing an additional car enables the dealer to sell at most one more car.

When the choice correspondence is multi-valued (as can naturally arise when prices can vary continuously), the definitions of full substitutability and the Laws of Aggregate Supply and Demand must become more subtle in order to account for indifferences. In particular, we need to reformulate the first part of the definition of full substitutability (Definition 1) to consider instances when the choice correspondence is multi-valued by requiring, for any set Y , for each optimal choice from Y , for a set Z

¹¹That is, when an agent gains access to more buy-side contracts while holding his set of available sell-side contracts fixed, the increase in the number of buy-side contracts chosen has to be weakly larger than the increase in the number of sell-side contracts chosen.

¹²Of course, these monotonicity conditions only make sense if trades represent corresponding units of goods; for a discussion of this and other issues related to contract design, see Hatfield and Kominers (2017).

that expands i 's opportunities on the buy-side, i.e., a set Z such that $Y_{i \rightarrow} = Z_{i \rightarrow}$ and $Y_{\rightarrow i} \subseteq Z_{\rightarrow i}$, there exists an optimal choice from Z that satisfies the same conditions as those in the first part of Definition 1.¹³ Similarly, we have to extend the Laws of Aggregate Supply and Demand to consider multivalued choice correspondences as the set of available buy-side or sell-side contracts expands. Additionally, when the choice correspondence may be multi-valued, requiring both conditions to hold simultaneously becomes subtle, as we need to ensure that they apply to the *same* element of the multi-valued choice correspondence. That is, for example, we need that for any set Y , for each optimal choice Y^* from Y , for a set Z that expands i 's opportunities on the buy-side, there exists an optimal Z^* that simultaneously fulfills the requirements of full substitutability and the Laws of Aggregate Supply and Demand. We formalize the preceding requirements in the following definition.

Definition 3. The preferences of agent i are *monotone-substitutable* if:¹⁴

1. For all finite sets of contracts $Y, Z \subseteq X_i$ such that $Y_{i \rightarrow} = Z_{i \rightarrow}$ and $Y_{\rightarrow i} \subseteq Z_{\rightarrow i}$, for every $Y^* \in C_i(Y)$ there exists $Z^* \in C_i(Z)$ such that both Y^* and Z^* are consistent with the full substitutability condition when the set of buy-side opportunities expands, i.e.,

$$(Y_{\rightarrow i} \setminus Y_{\rightarrow i}^*) \subseteq (Z_{\rightarrow i} \setminus Z_{\rightarrow i}^*) \text{ and } Y_{i \rightarrow}^* \subseteq Z_{i \rightarrow}^*, \quad (1a)$$

and Y^* and Z^* are consistent with the Law of Aggregate Demand, i.e.,

$$|Z_{\rightarrow i}^*| - |Z_{i \rightarrow}^*| \geq |Y_{\rightarrow i}^*| - |Y_{i \rightarrow}^*|. \quad (1b)$$

2. For all finite sets of contracts $Y, Z \subseteq X_i$ such that $Y_{\rightarrow i} = Z_{\rightarrow i}$ and $Y_{i \rightarrow} \subseteq Z_{i \rightarrow}$, for every $Y^* \in C_i(Y)$ there exists $Z^* \in C_i(Z)$ such that both Y^* and Z^* are consistent with the full substitutability condition when the set of sell-side opportunities expands, i.e.,

$$(Y_{i \rightarrow} \setminus Y_{i \rightarrow}^*) \subseteq (Z_{i \rightarrow} \setminus Z_{i \rightarrow}^*) \text{ and } Y_{\rightarrow i}^* \subseteq Z_{\rightarrow i}^*, \quad (2a)$$

¹³These formulations of full substitutability are equivalent when continuous transfers are available and agents' utility functions are quasilinear (Hatfield et al., 2019).

¹⁴Note that when choice-correspondences are single-valued, monotone-substitutability reduces to imposing full substitutability and the Laws of Aggregate Demand and Supply separately.

and Y^* and Z^* are consistent with the Law of Aggregate Supply, i.e.,

$$|Z_{i \rightarrow}^*| - |Z_{\rightarrow i}^*| \geq |Y_{i \rightarrow}^*| - |Y_{\rightarrow i}^*|. \quad (2b)$$

The following lemma illustrates one of the implications of monotone–substitutability, which plays a key role in understanding our main result.

Lemma 1. *Suppose that the preferences of i are monotone–substitutable and that $Y^* \in C_i(Y)$ for some $Y \subseteq X$.*

1. *For any contract $\bar{y} \in [X \setminus Y]_{\rightarrow i}$, there exists a $\bar{Y}^* \in C_i(Y \cup \{\bar{y}\})$ such that either*

(a) $\bar{Y}^* = Y^*$, or

(b) $\bar{Y}^* = Y^* \cup \{\bar{y}\}$, or

(c) *there exists a contract $y \in Y_{\rightarrow i}^*$ such that $\bar{Y}_{\rightarrow i}^* = (Y_{\rightarrow i}^* \cup \{\bar{y}\}) \setminus \{y\}$ and $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^*$, or*

(d) $\bar{Y}_{\rightarrow i}^* = Y_{\rightarrow i}^* \cup \{\bar{y}\}$ and *there exists some contract $z \in [Y \setminus Y^*]_{i \rightarrow}$ such that $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^* \cup \{z\}$.*

2. *For any contract $\bar{y} \in [X \setminus Y]_{i \rightarrow}$, there exists a $\bar{Y}^* \in C_i(Y \cup \{\bar{y}\})$ such that either*

(a) $\bar{Y}^* = Y^*$, or

(b) $\bar{Y}^* = Y^* \cup \{\bar{y}\}$, or

(c) *there exists a contract $y \in Y_{i \rightarrow}^*$ such that $\bar{Y}_{i \rightarrow}^* = (Y_{i \rightarrow}^* \cup \{\bar{y}\}) \setminus \{y\}$ and $\bar{Y}_{\rightarrow i}^* = Y_{\rightarrow i}^*$, or*

(d) $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^* \cup \{\bar{y}\}$ and *there exists some contract $z \in [Y \setminus Y^*]_{\rightarrow i}$ such that $\bar{Y}_{\rightarrow i}^* = Y_{\rightarrow i}^* \cup \{z\}$.*

Part 1 of Lemma 1 describes how an optimal choice by i changes when i gains access to the contract \bar{y} as a buyer. There are four possibilities: In the first possibility, \bar{y} is undesirable and so i 's optimal choice does not change. In the second possibility, i chooses the same set of contracts along with the newly-available contract \bar{y} . In the third possibility, the contract \bar{y} “substitutes” for y , and i chooses the same set of contracts as a seller. In the fourth possibility, i chooses the same set of contracts along with the newly-available contract \bar{y} as a buyer, and also chooses a not-previously-chosen

sell-side contract. Part 2 of Lemma 1 describes the analogous behavior associated with gaining access to one contract as a seller.

To understand the proof of Lemma 1, consider an agent with fully substitutable preferences who converts inputs into outputs and suppose that one input \bar{y} becomes available. Full substitutability ensures that the agent still rejects all of the inputs that he rejected before and does not reject any additional outputs. The Laws of Aggregate Supply and Demand ensure that, when \bar{y} becomes available, the intermediary's optimal choice must have a weakly higher net demand. Given the constraints imposed by full substitutability, this can only be achieved by either choosing the same set of contracts that he chose before (leaving net demand unchanged), choosing the same set of contracts along with \bar{y} (which increases net demand by one), replacing some contract y with \bar{y} as a buyer (leaving net demand unchanged), or taking \bar{y} and adding some contract z as a seller (also leaving net demand unchanged).

In a quasilinear setting, Hatfield et al. (2019) showed that full substitutability implies monotone-substitutability. In general, however, full substitutability does not imply the Laws of Aggregate Supply and Demand (see, e.g., Example 1 of Section 6 below) and thus does not imply monotone-substitutability.¹⁵ Hatfield et al. (2019) provided an extended discussion of the restrictions imposed by monotone-substitutability and economically interesting classes of preferences that are monotone-substitutable (in quasilinear settings).

2.2 Stability and Chain Stability

Our main result connects two solution concepts for trading network settings: *stability*, based on the concepts introduced by Hatfield and Kominers (2012) and Hatfield et al. (2013), and *chain stability*, based on the concept introduced by Ostrovsky (2008).

We begin with the definition of stability.

Definition 4. An outcome A is *stable* if it is

1. *Individually rational*: $A_i \in C_i(A)$ for all i ;
2. *Unblocked*: There is no nonempty *blocking set* $Z \subseteq X$ such that
 - (a) Z is feasible,
 - (b) $Z \cap A = \emptyset$, and

¹⁵Even in the special case of a two-sided market, full substitutability does not imply the Laws of Aggregate Supply and Demand, see, e.g., Hatfield and Milgrom (2005).

(c) for all $i \in a(Z)$, for all $Y \in C_i(Z \cup A)$, we have $Z_i \subseteq Y$.

Individual rationality is a voluntary participation condition based on the idea that an agent can always unilaterally drop contracts if doing so increases his welfare. The unblockedness condition states that when presented with a stable outcome A , one cannot propose a new set of contracts such that all the agents involved in these new contracts would strictly prefer to execute all of them (and possibly drop some of their existing contracts in A) instead of executing only some of them (or none).

To introduce our second solution concept, chain stability, we first need to formalize the notion of a *chain*.

Definition 5. A non-empty set of trades Ψ is a *chain* if its elements can be arranged in some order $\psi^1, \dots, \psi^{|\Psi|}$ such that $s(\psi^{\ell+1}) = b(\psi^\ell)$ for all $\ell \in \{1, 2, \dots, |\Psi| - 1\}$. A non-empty set of contracts Z is a *chain* if $\tau(Z)$ is a chain.

Note that because there is no vertical ordering of agents in our framework, Definition 5 adapts the “chain” concept of Ostrovsky (2008) to our current framework by allowing chains to cross themselves: the buyer in contract $y^{|Z|}$ is allowed to be the seller in contract y^1 (in which case the chain becomes a cycle) and a given agent can be involved in the chain multiple times. Example 3 of Section 6 illustrates the role of “self-crossing” chains in our results.

We now define chain stability.

Definition 6. An outcome A is *chain stable* if it is

1. *Individually rational:* $A_i \in C_i(A)$ for all i ;
2. *Not blocked by a chain:* There does not exist a feasible nonempty *blocking chain* $Z \subseteq X$ such that
 - (a) Z is feasible,
 - (b) $Z \cap A = \emptyset$, and
 - (c) for all $i \in a(Z)$, for all $Y \in C_i(Z \cup A)$, we have $Z_i \subseteq Y$.

The essential difference between the definitions of stability (Definition 4) and chain stability (Definition 6) consists of just one word: “set” in requirement 2 in the definition of stability versus “chain” in requirement 2 in the definition of chain stability. Substantively, however, the two definitions are very different. Blocking sets considered in Definition 4 can be arbitrarily complex, involving any sets of contracts

and agents. By contrast, blocking chains considered in Definition 6 have a well-defined linear structure. As Ostrovsky (2008) argued, blocking chains are much easier to identify and organize than arbitrary blocking sets. An agent can contact a potential supplier and propose a possible contract. The supplier would then contact one of his suppliers, and so on, and the process would proceed in a linear fashion until a blocking chain is identified. An important difference in our setting is that in the case of loops, the agent initiating the communication may need to make his initial offer tentative: instead of proposing a contract outright, he would have to say something along the lines of: “I may be interested in signing the contract x with you, if I can subsequently sign a contract y with a customer for one of the outputs I am offering.” An initial agent may also try initiating the deviation in both directions at the same time, making tentative offers to a supplier and a customer. While identifying chains in our trading network setting is more complicated than identifying pairwise blocks in two-sided settings or blocking chains in the setting of Ostrovsky (2008), it is still relatively simple and natural compared to trying to identify grand coalitions and large, complex, “non-linear” sets of blocking contracts (see Section 5).

3 Main Result: Equivalence of Stability Concepts

Stability appears substantively different and noticeably stronger than chain stability: the former requires robustness to all blocking sets, while the latter requires robustness only to specific blocking sets—chains of contracts. It is immediate that any stable outcome is chain stable, regardless of whether agents’ preferences are fully substitutable or satisfy the Laws of Aggregate Supply and Demand. Our main result shows that when agents’ preferences are monotone–substitutable, the two solution concepts are in fact equivalent.

Theorem 1. *If all agents’ preferences are monotone–substitutable, then any chain stable outcome is stable.*

Theorem 1 is an immediate corollary of a stronger result: when agents’ preferences are monotone–substitutable, any set blocking an outcome A can be “decomposed” into blocking chains.

Theorem 2. *Suppose that all agents’ preferences are monotone–substitutable. If some outcome A is blocked by some set Z then for some $K \geq 1$ we can partition the set*

Z into a collection of K chains $\{W^k\}_{k=1}^K$ such that A is blocked by W^1 and for any $k \leq K - 1$, the set of contracts $A \cup W^1 \cup \dots \cup W^k$ is blocked by W^{k+1} .

In particular, Theorem 1 follows from Theorem 2 by noting that if an outcome A is not stable, then either A is not individually rational (and so A can not be chain stable by definition) or there exists a blocking set Z ; Theorem 2 then implies that we can construct a chain W^1 that blocks A .

We prove Theorem 2 by way of the following lemma, which shows that, for any set of contracts A blocked by some set Z , either Z is a chain or we can remove a chain W from Z and still have that $Z \setminus W$ blocks A .

Lemma 2. *Suppose that all agents' preferences are monotone-substitutable. For any feasible outcome A blocked by some set Z , if Z is not itself a chain, then there exists a chain $W \subsetneq Z$ such that A is blocked by $Z \setminus W$ and $A \cup (Z \setminus W)$ is blocked by W .*

Lemma 2 implies that for any set Z blocking A , if Z is not a chain, then there exists a chain $\tilde{W}^1 \subsetneq Z$ such that A is blocked by $Z \setminus \tilde{W}^1$ and $A \cup (Z \setminus \tilde{W}^1)$ is blocked by \tilde{W}^1 . But then, applying Lemma 2 again, if $Z \setminus \tilde{W}^1$ is not a chain, there exists a chain $\tilde{W}^2 \subsetneq Z \setminus \tilde{W}^1$ such that A is blocked by $(Z \setminus \tilde{W}^1) \setminus \tilde{W}^2 = Z \setminus (\tilde{W}^1 \cup \tilde{W}^2)$ and $A \cup (Z \setminus (\tilde{W}^1 \cup \tilde{W}^2))$ is blocked by \tilde{W}^2 . Iterating this logic, we obtain a sequence of chains $\tilde{W}^1, \tilde{W}^2, \dots$ such that, for each ℓ , $Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^\ell)$ blocks A , \tilde{W}^ℓ blocks $A \cup (Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^\ell))$, and, if $Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^\ell)$ is not a chain, we can extend the sequence by another chain $\tilde{W}^{\ell+1}$. As Z is finite (since it is feasible), the sequence of chains $\tilde{W}^1, \tilde{W}^2, \dots$ must be finite; consequently, there must be some L such that $Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^L)$ is a chain that—by construction—blocks A . Setting $W^1 \equiv Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^L)$ and $W^\ell \equiv \tilde{W}^{L+2-\ell}$ for all $\ell \in \{2, \dots, L+1\}$, we see that Lemma 2 implies Theorem 2: By construction of $\tilde{W}^1, \dots, \tilde{W}^L$, we have that $\tilde{W}^1, \dots, \tilde{W}^L$ is a partition of Z , A is blocked by $W^1 = Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^L)$, and, for all $\ell \leq L$, $A \cup W^1 \cup \dots \cup W^\ell = A \cup (Z \setminus (\tilde{W}^1 \cup \dots \cup \tilde{W}^{L+1-\ell}))$ is blocked by $W^{\ell+1} = \tilde{W}^{L+1-\ell}$.

Before proceeding to the formal proof of Lemma 2, we explain the intuition behind this result and highlight where our assumptions on preferences are used. For simplicity, assume that there are no indifferences in agents' preferences over any relevant sets of contracts, i.e., that all agents' choice correspondences over subsets of $Z \cup A$ are single-valued. Our goal is to “peel off” a chain W from the set Z in such a way that the remaining set $Z \setminus W$ still blocks A .

We start the chain “in the middle,” by choosing an arbitrary contract $z^0 \in Z$. Since Z is a blocking set, we have that $Z_{b(z^0)} \subseteq Z_{b(z^0)}^*$ where $\{Z_{b(z^0)}^*\} = C_{b(z^0)}(Z \cup A)$. Thus, as the preferences of $b(z^0)$ are monotone–substitutable, Case 1 of Lemma 1 implies that, for the unique $Y_{b(z^0)}^* \in C_{b(z^0)}((Z \setminus \{z^0\}) \cup A)$, either¹⁶

1. $Z_{b(z^0)}^* = Y_{b(z^0)}^* \cup \{z^0\}$, or
2. $Z_{\rightarrow b(z^0)}^* = (Y_{\rightarrow b(z^0)}^* \cup \{z^0\}) \setminus \{y\}$ for some $y \in [(A \cup Z) \setminus Z^*]_{\rightarrow b(z^0)}$ and $Z_{b(z^0) \rightarrow}^* = Y_{b(z^0) \rightarrow}^*$, or
3. $Z_{\rightarrow b(z^0)}^* = Y_{\rightarrow b(z^0)}^* \cup \{z^0\}$ and $Z_{b(z^0) \rightarrow}^* = Y_{b(z^0) \rightarrow}^* \cup \{\bar{y}\}$ for some $\bar{y} \in Z_{b(z^0) \rightarrow}^*$.

Rewriting the preceding to describe Y^* , we find that

1. $Y_{b(z^0)}^* = Z_{b(z^0)}^* \setminus \{z^0\}$, or
2. $Y_{\rightarrow b(z^0)}^* = (Z_{\rightarrow b(z^0)}^* \setminus \{z^0\}) \cup \{y\}$ for some $y \in (A \cup Z) \setminus Z^*$ and $Y_{b(z^0) \rightarrow}^* = Z_{b(z^0) \rightarrow}^*$, or
3. $Y_{\rightarrow b(z^0)}^* = (Z_{\rightarrow b(z^0)}^* \setminus \{z^0\})$ and $Y_{b(z^0) \rightarrow}^* = Z_{b(z^0) \rightarrow}^* \setminus \{\bar{y}\}$ for some $\bar{y} \in Z_{b(z^0) \rightarrow}^*$.

Thus, with respect to the contracts in Z , there are two possibilities

- The agent $b(z^0)$ chooses all of his remaining contracts in $[Z \setminus \{z^0\}]_{b(z^0)}$, i.e., $[Z \setminus \{z^0\}]_{b(z^0)} \subseteq Y^*$. This possibility corresponds to the first case above, the second case above (since $(A \cup Z) \setminus Z^* \subseteq A$ as $b(z^0)$ chooses all of the contracts in Z from $A \cup Z$), and the third case above when $\bar{y} \in A$.
- The agent $b(z^0)$ chooses all of his remaining contracts in $[Z \setminus \{z^0\}]_{b(z^0)}$ except for one contract $z^1 = \bar{y}$ for which he is the seller, i.e., $[Z \setminus \{z^0, z^1\}]_{b(z^0)} \subseteq Y^*$ for some $z^1 \in Z_{b(z^0) \rightarrow}$. This possibility corresponds to the third case above when $\bar{y} \in Z$.

In the former case, we have found the “downstream end” of the chain; in the latter case, we extend the chain by adding z^1 and now consider $b(z^1)$. By assumption, the preferences of $b(z^1)$ are also monotone–substitutable, and so the same analysis applies: either z^1 is the “downstream end” of the chain or we can extend the chain by adding

¹⁶Note that the first possibility described in the first case of Lemma 1 can not happen, as we know $z^0 \in Z_{b(z^0)}^*$ since Z is a blocking set.

a contract $z^2 \in Z_{b(z^1) \rightarrow}$ and considering $b(z^2)$. Since the number of contracts in Z is finite, by iterating this process we must eventually reach a contract z^N such that the agent $b(z^N)$ chooses all of his remaining contracts in $[Z \setminus \{z^0, \dots, z^N\}]_{b(z^N)}$; thus, z^N is the “downstream end” of the chain. An analogous process allows us to grow the chain “upstream,” adding contracts z^{-1}, z^{-2}, \dots until we reach the “upstream end,” z^{-M} . The chain $W = \{z^{-M}, \dots, z^N\}$ satisfies the requirements of Lemma 2: First, W blocks $(Z \cup A) \setminus W$ because Z blocks A , i.e., every contract in Z is chosen from $Z \cup A$, and so every contract in $W \subseteq Z$ is chosen from $((Z \cup A) \setminus W) \cup W = Z \cup A$. Second, by construction, every agent chooses all of their contracts in $Z \setminus W$ from $(Z \cup A) \setminus W$; thus, $Z \setminus W$ blocks A .

The full proof of Lemma 2 follows the sketch just described, but the execution is much more challenging due to the need to account for multi-valued choice correspondences.¹⁷

3.1 Proof of Lemma 2

We first define the *A-endowed utility function* $\hat{U}_i(\cdot; A)$ for each $i \in I$ as

$$\hat{U}_i(Y; A) = \max_{\bar{A} \subseteq A} \{U_i(Y \cup \bar{A})\};$$

that is, $\hat{U}_i(Y; A)$ is the maximum utility that agent i can obtain by combining Y with elements of A . This gives rise to an *A-endowed choice correspondence* $\hat{C}_i(\cdot; A)$ for each $i \in I$, given by

$$\hat{C}_i(Y; A) \equiv \operatorname{argmax}_{\tilde{Y} \subseteq Y} \{\hat{U}_i(\tilde{Y}; A)\} = \{\tilde{Y} \setminus A : \tilde{Y} \in C_i(Y \cup A)\};$$

that is, an element of $\hat{C}_i(Y; A)$ is a set of contracts that i “chooses” from Y when he has access to all the contracts in A . Note that, since Z is a blocking set, $Z_i \subseteq Y$ for all $Y \in C_i(Z \cup A)$ for all $i \in I$, and thus $\hat{C}_i(Z; A) = \{Z_i\}$ for all $i \in I$.

Take any contract $z^0 \in Z$. We will algorithmically “grow” a chain W containing z^0 ,

¹⁷Our formal proof follows the sketch just presented, but allows for cases where the choice correspondence is not single-valued. In particular, we can not use Lemma 1, as it does not allow us to characterize $C_{b(z^0)}((Z \setminus \{z^0\}) \cup A)$ if the choice correspondence $C_{b(z^0)}(Z \cup A)$ is not single-valued; rather, we need to prove an analogue to the conclusion of Lemma 1 which accounts for the fact that $C_{b(z^0)}(Z \cup A)$ may be multi-valued. Similarly, we need to prove an analogue to the the conclusion of Lemma 1 for the case in which the chain “self-crosses.”

by proceeding upstream and downstream from z^0 . Specifically, in a sequence of steps from z^0 , we grow a *quasi-removable chain*—i.e., a chain $W = \{z^{-m}, \dots, z^0, \dots, z^n\}$ such that $Z \setminus W$ is a blocking set except (possibly) for the buyer of z^n and the seller of z^{-m} . We first proceed downstream, showing that after each step, either $Z \setminus W$ behaves like a blocking set for the buyer of z^n —in which case z^n is a *terminal contract*—or we can extend the quasi-removable chain W at least one step further. We then proceed upstream, analogously. Once we have found the downstream and upstream terminal contracts, our quasi-removable chain W is in fact “removable” from the blocking set Z , in the sense that $Z \setminus W$ blocks A , as desired. We now formally define what it means for a chain to be quasi-removable.

Definition 7. A chain $W^{-m,n} = \{z^{-m}, \dots, z^n\}$ is *quasi-removable* if:

1. For all $i \in I \setminus \{s(z^{-m}), b(z^n)\}$, we have that $\{[Z \setminus W^{-m,n}]_i\} = \hat{C}_i(Z \setminus W^{-m,n}; A)$.
2. If $b(z^n) \neq s(z^{-m})$, then, when choosing from $Z \setminus W^{-m,n}$:
 - (a) The buyer of z^n never drops a contract for which he is the buyer and drops at most one contract for which he is the seller, i.e., for all $\hat{Z}^* \in \hat{C}_{b(z^n)}(Z \setminus W^{-m,n}; A)$, we have that

$$\hat{Z}_{\rightarrow b(z^n)}^* = [Z \setminus W^{-m,n}]_{\rightarrow b(z^n)}$$

and either

$$\hat{Z}_{b(z^n) \rightarrow}^* = [Z \setminus W^{-m,n}]_{b(z^n) \rightarrow}$$

or there exists a $z^{n+1} \in Z_{b(z^n) \rightarrow}$ such that

$$\hat{Z}_{b(z^n) \rightarrow}^* = [Z \setminus (W^{-m,n} \cup \{z^{n+1}\})]_{b(z^n) \rightarrow}.$$

- (b) The seller of z^{-m} never drops a contract for which he is the seller and drops at most one contract for which he is the buyer, i.e., for all $\hat{Z}^* \in \hat{C}_{s(z^{-m})}(Z \setminus W^{-m,n}; A)$, we have that

$$\hat{Z}_{s(z^{-m}) \rightarrow}^* = [Z \setminus W^{-m,n}]_{s(z^{-m}) \rightarrow}$$

and either

$$\hat{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus W^{-m,n}]_{\rightarrow s(z^{-m})}$$

or there exists a $z^{-m-1} \in Z_{\rightarrow s(z^{-m})}$ such that

$$\hat{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus (W^{-m,n} \cup \{z^{-m-1}\})]_{\rightarrow s(z^{-m})}.$$

3. If $b(z^n) = s(z^{-m}) = k$, then, when choosing from $Z \setminus W^{-m,n}$, agent k drops at most one contract for which he is the buyer and at most one contract for which he is the seller, i.e., for all $\hat{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n}; A)$, we have that both

(a) either

$$\hat{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n}]_{\rightarrow k}$$

or there exists a $z^{-m-1} \in Z_{\rightarrow k}$ such that

$$\hat{Z}_{\rightarrow k}^* = [Z \setminus (W^{-m,n} \cup \{z^{-m-1}\})]_{\rightarrow k},$$

and

(b) either

$$\hat{Z}_{k \rightarrow}^* = [Z \setminus W^{-m,n}]_{k \rightarrow}$$

or there exists a $z^{n+1} \in Z_{k \rightarrow}$ such that

$$\hat{Z}_{k \rightarrow}^* = [Z \setminus (W^{-m,n} \cup \{z^{n+1}\})]_{k \rightarrow}.$$

The first condition of Definition 7 ensures that each agent not associated with either end of the chain chooses all of the contracts in $Z \setminus W^{-m,n}$ that he is associated with. The second condition of Definition 7 ensures that, when each “end” of the chain is associated with a different agent, the agent at each end chooses all but one contract in $Z \setminus W^{-m,n}$ that he is associated with. The third condition of Definition 7 ensures that, when each “end” of the chain is associated with the same agent, that agent chooses all of the contracts in $Z \setminus W^{-m,n}$ that he is associated with except for possibly one contract as a buyer and possibly one contract as a seller.

We say that a quasi-removable chain $W^{-m,n} = \{z^{-m}, \dots, z^n\}$ is

1. *downstream terminal* if $b(z^n)$ strictly demands all of the contracts for which he is a seller, i.e., for all $\hat{Z}^* \in \hat{C}_{b(z^n)}(Z \setminus W^{-m,n}; A)$, we have that

$$\hat{Z}_{b(z^n) \rightarrow}^* = [Z \setminus W^{-m,n}]_{b(z^n) \rightarrow},$$

and

2. *upstream terminal* if $s(z^{-m})$ strictly demands all of the contracts for which he is a buyer, i.e., for all $\hat{Z}^* \in \hat{C}_{s(z^{-m})}(Z \setminus W^{-m,n}; A)$, we have that

$$\hat{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus W^{-m,n}]_{\rightarrow s(z^{-m})}.$$

We now present a series of five claims, all proven in Appendix A, that we combine to establish Lemma 2.

Claim 1. *Consider any $z^0 \in Z$. Then $W^{0,0} \equiv \{z^0\}$ is a quasi-removable chain.*

Claim 1 shows that for any arbitrary element $z^0 \in Z$, the set $W^{0,0} \equiv \{z^0\}$ is a quasi-removable chain. Now we show that any blocking chain that is not downstream terminal can be extended into a longer quasi-removable chain through the addition of a downstream contract.

Claim 2. *Suppose that $W^{-m,n} = \{z^{-m}, \dots, z^n\}$ is a quasi-removable chain that is not downstream terminal. Then there exists a z^{n+1} such that $s(z^{n+1}) = b(z^n)$ and such that $W^{-m,n+1} \equiv W^{-m,n} \cup \{z^{n+1}\}$ is a quasi-removable chain. Moreover, if $W^{-m,n}$ is upstream terminal, then $W^{-m,n+1}$ is upstream terminal.*

An analogous result holds upstream: any blocking chain that is not upstream terminal can be extended into a longer quasi-removable chain through the addition of an upstream contract.

Claim 3. *Suppose that $W^{-m,n} = \{z^{-m}, \dots, z^n\}$ is a quasi-removable chain that is not upstream terminal. Then there exists a z^{-m-1} such that $b(z^{-m-1}) = s(z^{-m})$ and such that $W^{-m-1,n} \equiv W^{-m,n} \cup \{z^{-m-1}\}$ is a quasi-removable chain. Moreover, if $W^{-m,n}$ is downstream terminal, then $W^{-m-1,n}$ is downstream terminal.*

Our next claim ensures that, once we have found a quasi-removable chain that is both upstream and downstream terminal, then that quasi-removable chain is in fact a blocking chain.

Claim 4. *If $W^{-m,n} = \{z^{-m}, \dots, z^n\}$ is an upstream and downstream terminal quasi-removable chain, then $Z \setminus W^{-m,n}$ blocks A .*

Our last claim verifies that any subset W of a blocking set Z blocks the set $A \cup (Z \setminus W)$.

Claim 5. *Any non-empty $W \subseteq Z$ blocks $A \cup (Z \setminus W)$.*

We now complete the proof of Lemma 2. Consider any $z^0 \in Z$; by Claim 1, we have that $W^{0,0} = \{z^0\}$ is a quasi-removable chain. If $W^{0,0}$ is not downstream terminal, then by Claim 2, there exists a z^1 such that $s(z^1) = b(z^0)$ and such that $W^{0,1} = \{z^0, z^1\}$ is a quasi-removable chain. Proceeding inductively, any quasi-removable chain $W^{0,n} = \{z^0, \dots, z^n\}$ that is not downstream terminal can be extended to a quasi-removable chain $W^{0,n+1} = W^{0,n} \cup \{z^{n+1}\}$ by adding one sell-side contract z^{n+1} for the buyer of z^n . Since Z is finite and all the quasi-removable chains are contained in Z , this downstream extension process must eventually end at a quasi-removable chain $W^{0,N}$ that is downstream terminal. Similarly, if $W^{0,N}$ is a quasi-removable chain that is downstream but not upstream terminal, then by Claim 3 there exists a z^{-1} such that $W^{-1,N} = W^{0,N} \cup \{z^{-1}\}$ is a downstream terminal quasi-removable chain. Again proceeding inductively, we can extend any downstream but not upstream terminal quasi-removable chain $W^{-m,N}$ to a downstream terminal quasi-removable chain $W^{-m-1,N}$, until we reach a quasi-removable chain $W^{-M,N}$ which is downstream and upstream terminal. Finally, by Claims 4 and 5, $Z \setminus W^{-M,N}$ must block A and $W^{-M,N}$ must block $A \cup (Z \setminus W^{-M,N})$.

4 Chain Stability and Competitive Equilibrium

The results of Section 3 hold for general sets of contracts and general monotone-substitutable utility functions. For an environment in which both

- prices are continuous and unrestricted, i.e., $X = \Omega \times \mathbb{R}$, and
- agents' preferences are quasilinear in prices,

Hatfield et al. (2013) showed that, when agents' preferences are fully substitutable, an outcome is stable if and only if it is consistent with competitive equilibrium. Thus, a corollary of Theorem 1 is that in the trading network setting of Hatfield et al. (2013), an outcome is consistent with competitive equilibrium if and only if it is not blocked by a chain of contracts; for a formal statement of this result, see Appendix B.

5 Quantifying the Simplicity Gain

A principal benefit of Theorem 1 is that it implies that checking whether an outcome is stable (or, in the quasilinear case, consistent with competitive equilibrium) reduces to checking whether that outcome is chain stable. Checking directly whether a given outcome Y is stable is computationally burdensome, as it requires checking $2^{|X \setminus Y|}$ possible blocking sets. Theorem 1 shows that checking stability is equivalent to checking chain stability under monotone–substitutability; here, we show that the reduction to chain stability leads to a significant asymptotic simplicity gain, in the sense that the proportion of possible blocking sets that are chains goes to 0 as the economy grows large.¹⁸

Formally, we define a *sequence of economies* $(I, \Omega^m)_{m=1}^\infty$ as a fixed set of agents I and a sequence of finite sets of trades $\Omega^1, \Omega^2, \dots$ such that $|\Omega^m| = m$. Here, we could in principle allow the set of agents I to be infinite as, since the set of contracts Ω^m is finite for all m , the set of “relevant” agents, i.e., those agents with at least one contractual opportunity, will be finite; this allows us to consider economies where the set of “relevant” agents grows with m .

For a given $\omega \in \cup_{m=1}^\infty \Omega^m$, let $\mathbb{P}(\omega) \subseteq \mathbb{R}$ be the set of possible prices for ω , that is, for the economy (I, Ω^m) the set of contracts is given by $X^m \equiv \cup_{\omega \in \Omega^m} \cup_{p \in \mathbb{P}(\omega)} \{(\omega, p)\}$; that is, we assume that the set of possible prices associated with a given trade ω does not vary with m .¹⁹

In principle, checking the stability of an outcome Y for the economy (I, Ω^m) may require checking blocking sets corresponding to any set of trades in

$$\mathfrak{B}^m(Y) \equiv \{\Psi \subseteq \Omega^m \setminus \tau(Y)\}.$$

By contrast, checking the chain stability of an outcome Y for the economy (I, Ω^m) requires checking blocking chains corresponding to any chain of trades in

$$\mathfrak{C}^m(Y) \equiv \{\Psi \subseteq \Omega^m \setminus \tau(Y) : \Psi \text{ is a chain}\}.$$

¹⁸Intuitively, we show that as we randomly add trades and the economy grows large, the probability that an arbitrary blocking set is a chain goes to 0.

¹⁹In principle, we could allow the set of prices for a given trade to vary with m but, as our results concern the number of chains and sets of trades that need to be considered, this additional generality would not affect our results.

We show that, for any fixed set of contracts Y , the ratio of [the number of distinct sets of chains of trades corresponding to possible blocking chains] to [the number of distinct sets of trades corresponding to possible blocking sets], i.e., $\frac{|\mathfrak{C}^m(Y)|}{|\mathfrak{B}^m(Y)|}$, goes to 0 as m grows large.

Theorem 3. *For any sequence of economies $(I, \Omega^m)_{m=1}^\infty$ such that $|\Omega^m| = m$ for all m , for any Y , we have that*

$$\frac{|\mathfrak{C}^m(Y)|}{|\mathfrak{B}^m(Y)|} = O\left(\frac{\sqrt{\log_2 m}}{\sqrt{m}}\right).$$

In particular, $\frac{|\mathfrak{C}^m(Y)|}{|\mathfrak{B}^m(Y)|} \rightarrow 0$ as $m \rightarrow \infty$.

Theorem 3 follows from a general graph-theoretic result proven by Shayani (2018) as a supplement to our work here. To understand why Theorem 3 holds, we consider a directed multi-graph with the set of vertices I and the set of edges that has one edge for each trade in Ω^m , directed from the seller to the buyer of that trade.

To consider what proportion of the subsets of Ω^m are chains, we proceed via a probabilistic argument: We consider a random set of trades Ψ chosen from Ω^m by including each trade $\omega \in \Omega^m$ in Ψ independently with probability $\frac{1}{2}$. For a random set of trades Ψ to be a chain the following two “balancedness” requirements have to be satisfied:

1. for each agent $i \in a(\Psi)$, the number of contracts in which he is the buyer differs by at most 1 from the number of contracts in which he is the seller, i.e. $||\Psi_{\rightarrow i}| - |\Psi_{i \rightarrow}|| \leq 1$, and
2. there are at most two distinct agents $j \in a(\Psi)$ who sign different numbers of contracts as a buyer and as a seller, i.e., there are at most two distinct agents $j \in a(\Psi)$ for whom $|\Psi_{\rightarrow j}| - |\Psi_{j \rightarrow}| \neq 0$.

These “balancedness” requirements follow directly from the definition of a chain (Definition 5), as the buyer of the first trade is the seller of the second trade, the buyer of the second trade is the seller of the third trade, \dots , and the buyer of the $(|\Psi| - 1)^{\text{st}}$ trade is the seller of the $|\Psi|^{\text{th}}$ trade; thus, only the seller of the first trade and the buyer of the $|\Psi|^{\text{th}}$ trade can sign different numbers of contracts as a buyer and a seller.

For the random set of trades Ψ , there are two cases to consider:

Large agent case: In this case, there is one “big” agent i , who is involved in many of the m trades in Ψ .

Many small agents case: In this case, there are many “small” distinct agents, each of whom is involved in a few trades in Ψ .

In the large agent case, we show that the probability that the first “balancedness” condition is satisfied for a “big” agent i is small, as it is unlikely that i will have roughly equal numbers of contracts in which he is a buyer and in which he is a seller, as he is involved in many trades in the random set Ψ . In the many small agents case, we show that the probability that Ψ is such that $|\Psi_{\rightarrow j}| - |\Psi_{j \rightarrow}| = 0$ for all but two agents j is small, so it is unlikely that the second “balancedness” condition is satisfied. Combining the preceding two results shows that, in the limit, very few random sets of trades will be chains.

For completeness, we adapt the proof of Theorem 3 by Shayani (2018) to our setting and include it in Appendix C.

Theorem 3 implies that for general trading networks, the ratio of chains to the total number of subsets converges to 0 as the number of trades grows large. Thus, the set of chains is asymptotically a vanishingly small fraction of the set of potential blocking sets; consequently, checking stability by considering each possible blocking chain is asymptotically much simpler than checking stability by considering each possible blocking set.²⁰ In fact, even for settings for which the existence of stable outcomes is not guaranteed,²¹ Theorem 1 implies that checking for the existence of chain stable outcomes is sufficient, and Theorem 3 implies that checking chain stability is substantially easier than checking stability.

If the trading network has additional structure, then the simplicity gain can be much higher than that implied by the bound in Theorem 3. For instance, consider the case of *multi-layered supply chains*, à la Ostrovsky (2008). In a multi-layered supply chain, there are $L + 1$ layers $(I^\ell)_{\ell=1}^{L+1}$, which partition the set of agents; every trade “flows” one layer down the supply chain, i.e., for any trade $\omega \in \Omega$, if $s(\omega) \in I^\ell$, then $b(\omega) \in I^{\ell+1}$. Thus, there are L layers of trades, $\Omega^1, \dots, \Omega^L$ such that $s(\Omega^\ell) \subseteq I^\ell$

²⁰However, for arbitrarily complex trading networks Shayani (2018) showed that the bound in Theorem 3 is almost tight.

²¹For example, if prices are not allowed to vary freely and preferences are not quasilinear, monotone-substitutability is not in general sufficient to guarantee the existence of stable outcomes; see, e.g., Hatfield and Kominers (2012).

and $b(\Omega^\ell) \subseteq I^{\ell+1}$. In this case, the total number of chains of trades is bounded by $\prod_{\ell=1}^L (|\Omega^\ell| + 1)$, while the total number of sets of trades is given by $2^{|\Omega^1| + \dots + |\Omega^L|}$.

Our results also imply (by combining Corollary B.1 and Theorem 3) that checking whether an outcome is consistent with competitive equilibrium becomes straightforward in the Sun and Yang (2006, 2009) environment with gross substitutes and complements. In such an environment, one side of the market is comprised of buyers while the other side of the market is comprised of two distinct groups of objects. Buyers view objects in the same group as substitutes for each other, but view objects in different groups as complements; such preferences arise naturally when a firm has two types of complementary inputs. As Hatfield et al. (2013) showed, the Sun and Yang (2006, 2009) environment is a special case of the Hatfield et al. (2013) trading network framework.²² Moreover, chains in the Sun and Yang (2006, 2009) environment are particularly simple: they consist either of one buyer and one object (or more formally, one contract between a buyer and an object) or of one buyer and one object from each of the two groups (again, more formally, two contracts, involving the same buyer and two objects from different groups). Thus, checking for consistency with competitive equilibrium reduces to checking one- and two-contract blocking chains.

Similarly, our results imply as a natural corollary that in two-sided markets in which agents' preferences are monotone–substitutability, checking stability reduces to checking whether individual contracts constitute blocks. In particular, we need only consider blocks comprised of a single contract when checking stability in the setting of Kelso and Crawford (1982).

In addition to the simplicity analysis provided here, in work subsequent to ours, Candogan et al. (2016) developed a polynomial-time algorithm for the quasilinear case, that, for a given outcome, either constructs a blocking chain or verifies that no such chain exists. Combining the Candogan et al. (2016) result with our Theorem 1, we obtain a polynomial-time algorithm for checking stability in the case when preferences are quasilinear in a numeraire.

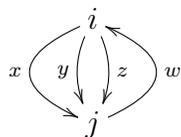
²²The embedding of Hatfield et al. (2013) allows for much more general environments than those considered by Sun and Yang (2006, 2009): e.g., “objects” may have preferences over whom they match with, and may be involved in multiple contracts.

6 Examples

The proof of our main equivalence result (Theorem 1) requires monotone–substitutability—the conjunction of full substitutability and the Laws of Aggregate Supply and Demand. In this section, we show that, when either preferences are not fully substitutable or fail the Laws of Aggregate Supply and Demand, our equivalence result may not hold. We also show that it is essential that the definition of chain stability allow chains to cross themselves, i.e., that we allow an agent to be involved in more than two contracts in a chain.²³

We start with an example of preferences that are fully substitutable, but for which the Laws of Aggregate Supply and Demand do not hold—and the equivalence result does not hold either.²⁴

Example 1. There are two agents, i and j . There are four contracts between these two agents: x , y , z , and w . Agent i is the seller of x , y , and z , and is the buyer of w , while agent j is thus the buyer of x , y , and z , and the seller of w . The economy is depicted in the diagram below, with each arrow denoting a contract from a seller to a buyer:



The preferences of the agents are as follows. Informally, agent i is happy to sign contract w in which he is the buyer, regardless of what his options are on the other side of the market, and if (and only if) he is able to sign contract w , then he is also happy to sign any subset of the other three contracts (in which he is the seller)—the more, the better. Formally, the preferences of i over acceptable bundles of contracts are as follows:

$$\{w, x, y, z\} \succ \{w, x, y\} \succ \{w, x, z\} \succ \{w, y, z\} \succ \{w, x\} \succ \{w, y\} \succ \{w, z\} \succ \{w\} \succ \emptyset.$$

²³For convenience, we give our examples in terms of ordinal preference relations over sets of contracts. In these examples, it is straightforward to construct corresponding cardinal utility functions over sets of contracts that give rise to these ordinal preference relations, and we omit those constructions.

²⁴As shown by Hatfield and Kominers (2012), the Laws of Aggregate Supply and Demand are not necessary for the equivalence of stability and chain stability in the supply chain setting. The need to impose monotone–substitutability in our setting is because we need to allow for chains to be self-crossing.

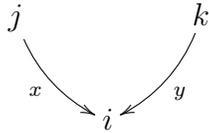
Agent j is happy to sign any subset of $\{x, y, z\}$ (in which he is the buyer)—the more, the better—no matter what his options are on the other side of the market. If (and only if) he has access to all three of these contracts, then he is also happy to sign contract w (in which he is the seller). Formally, the preferences of j over acceptable bundles of contracts are as follows:

$$\{w, x, y, z\} \succ \{x, y, z\} \succ \{x, y\} \succ \{x, z\} \succ \{y, z\} \succ \{x\} \succ \{y\} \succ \{z\} \succ \emptyset.$$

Note first that the preferences of agents i and j are fully substitutable (but also note that the preferences of agent i do not satisfy the Law of Aggregate Demand). Consider now the empty set of contracts. It is not stable: it is blocked by the full set of contracts in the economy, $\{w, x, y, z\}$, which is the most preferred set of contracts for both agents. At the same time, the empty set of contracts is not blocked by any chain, and is therefore chain stable. To see this, note first that any blocking set would of course have to involve both agents. Second, every non-empty set acceptable to agent i must include contract w , so w would have to be a part of the blocking chain. Third, the only set of contracts involving contract w that is acceptable to agent j is the full set of contracts $\{w, x, y, z\}$. Thus, $\{w, x, y, z\}$ is the only blocking set in this example—and it cannot be represented as a chain.

Our second example shows that full substitutability likewise plays a critical role for the equivalence result: without it, chain stability is strictly weaker than stability, even when all agents' preferences satisfy the Laws of Aggregate Supply and Demand.

Example 2. There are three agents: i , j , and k . There are two contracts, x and y . Agent i is the buyer of both x and y , agent j is the seller of x , and agent k is the seller of y . The economy is depicted in the diagram below:



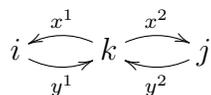
The preferences of agents j and k are straightforward, and satisfy full substitutability: each one prefers to sign the contract in which he is the seller to not signing it: $\{x\} \succ_j \emptyset$ and $\{y\} \succ_k \emptyset$. The preferences of agent i are not fully substitutable: i prefers signing both contracts to signing none, but prefers not signing any contracts

to signing only one. That is, the preferences of agent i over acceptable bundles of contracts are given by $\{x, y\} \succ_i \emptyset$.

Consider now the empty set of contracts. It is not stable: it is blocked by the full set of contracts in the economy, $\{x, y\}$. At the same time, the empty set is chain stable: any chain in this market involves agent i and contains exactly one contract—which is not an acceptable deviation for agent i .

Our third and final example shows that even when preferences are monotone–substitutable it may not be sufficient to restrict attention to blocking chains that do not “cross” themselves. Specifically, if attention is restricted to chains in which each agent appears in at most two consecutive contracts, then an outcome that is robust to deviations by such chains may be blocked by richer sets of contracts.²⁵

Example 3. There are three agents: i , j , and k . There are four contracts: x^1 , x^2 , y^1 , and y^2 . Agent i is the buyer in contract x^1 and the seller in contract y^1 . Agent j is the buyer in contract x^2 and the seller in contract y^2 . Agent k is the seller in contracts x^1 and x^2 and the buyer in contracts y^1 and y^2 . The economy is depicted in the diagram below:



The preferences of agents i and j are straightforward: each one prefers to sign both contracts that he is associated with and is not interested in any other non-empty set of contracts. The preferences of agent k are as follows:

$$\{x^1, x^2, y^1, y^2\} \succ \{x^1, y^2\} \succ \{x^2, y^1\} \succ \emptyset;$$

agent k finds other non-empty sets of contracts unacceptable.

In this example, all agents’ preferences are monotone–substitutable. Also, the empty set of contracts is unstable: it is blocked by the chain $\{x^1, y^1, x^2, y^2\}$. Note, however, that this chain is “self-crossing”—it involves agent k in all four contracts. If attention were restricted to chains that do not cross themselves (i.e., in this particular

²⁵However, the necessity of considering self-crossing chains is only present in fully general trading networks. In particular, in the supply chain setting of Ostrovsky (2008), self-crossing chains are not even possible as each agent only buys from agents upstream and only sells to agents downstream. In the supply chain setting, stability and chain stability are also equivalent to the *tree stability* concept of Ostrovsky (2008).

example, chains that involve agent k in at most two contracts), the empty set would be robust to deviations by such chains. For example, the chain $\{x^1, y^1\}$ does not block the empty set, because $C_k(\{x^1, y^1\}) = \{\emptyset\}$, and so $\{x^1, y^1\}_k = \{x^1, y^1\} \notin C_k(\{x^1, y^1\})$.

7 Conclusion

In this paper, we show that when all agents have monotone–substitutable preferences every chain stable outcome is stable. As a corollary, we also show that in quasilinear environments with transferable utility and fully substitutable preferences, an outcome is consistent with competitive equilibrium if and only if it is chain stable. Moreover, checking whether an outcome is chain stable is meaningfully easier than checking whether an outcome is stable directly.

In practice, blocking chains may be relatively easy to form: they require much less coordination than general blocking sets, and do not rely on “hypothetical,” “unobserved” prices for untraded goods; our work shows that under standard assumptions on preferences, ruling out these particularly natural blocks in fact guarantees that there are no possible blocks by groups of agents. It also ensures that every chain stable outcome is consistent with competitive equilibrium, and satisfies the various properties of competitive equilibria (such as, e.g., efficiency).

Our results may also be useful in facilitating empirical and econometric work in trading environments beyond two-sided markets, i.e., analogous to pairwise stability in two-sided settings, chain stability may serve as a basis for constructing structural estimators for trading networks. Furthermore, in situations when an econometrician can only observe the contracts that are actually signed, if selection issues cause concerns (e.g., issues of partial identification or slow rates of convergence), the fact that chain stable allocations are essentially equivalent to stable allocations and to competitive equilibria may help alleviate these concerns.

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A Appendix: Proofs Omitted from the Main Text

A.1 Proof of Lemma 1

To prove the first part of Lemma 1, we consider the case in which $\bar{y} \in [X \setminus Y]_{\rightarrow i}$. Since the preferences of i are monotone–substitutable, we have from Condition 1a of the definition of monotone–substitutability that there exists a $\bar{Y}_i^* \in C_i(Y \cup \{\bar{y}\})$ such that

$$Y_{\rightarrow i} \setminus Y_{\rightarrow i}^* \subseteq (Y_{\rightarrow i} \cup \{\bar{y}\}) \setminus \bar{Y}_i^*;$$

thus, we have

$$\bar{Y}_i^* \subseteq Y_{\rightarrow i}^* \cup \{\bar{y}\}. \tag{3a}$$

Moreover, we have from Condition 1a of the definition of monotone–substitutability that

$$\bar{Y}_{i \rightarrow}^* \supseteq Y_{i \rightarrow}^*, \quad (3b)$$

which implies that

$$|\bar{Y}_{i \rightarrow}^*| - |Y_{i \rightarrow}^*| \geq 0;$$

Condition 1b of the definition of monotone–substitutability then implies that

$$|\bar{Y}_{\rightarrow i}^*| - |Y_{\rightarrow i}^*| \geq |\bar{Y}_{i \rightarrow}^*| - |Y_{i \rightarrow}^*| \geq 0. \quad (4)$$

There are two cases to consider:

Case 1: $\bar{y} \notin \bar{Y}^*$. Then (3a) implies that $\bar{Y}_{\rightarrow i}^* \subseteq Y_{\rightarrow i}^*$ and so $|\bar{Y}_{\rightarrow i}^*| - |Y_{\rightarrow i}^*| \leq 0$. As (4) implies that $|\bar{Y}_{\rightarrow i}^*| - |Y_{\rightarrow i}^*| \geq 0$, we must then have that $|\bar{Y}_{\rightarrow i}^*| = |Y_{\rightarrow i}^*|$; hence, $\bar{Y}_{\rightarrow i}^* = Y_{\rightarrow i}^*$. Then (4) can only hold if $|\bar{Y}_{i \rightarrow}^*| = |Y_{i \rightarrow}^*|$, and so (3b) implies that $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^*$. Thus $\bar{Y}^* = Y^*$, which is the possibility stated in Possibility (a) in the lemma.

Case 2: $\bar{y} \in \bar{Y}^*$. Then (3a) implies that $|\bar{Y}_{\rightarrow i}^*| \leq |Y_{\rightarrow i}^*| + 1$.

If $|\bar{Y}_{\rightarrow i}^*| \leq |Y_{\rightarrow i}^*|$, then (as in the preceding case), (4) can only hold if

$$|\bar{Y}_{\rightarrow i}^*| - |Y_{\rightarrow i}^*| = |\bar{Y}_{i \rightarrow}^*| - |Y_{i \rightarrow}^*| = 0,$$

which implies that $\bar{Y}_{\rightarrow i}^* = (Y_{\rightarrow i}^* \cup \{\bar{y}\}) \setminus \{y\}$ for some $y \in Y_{\rightarrow i}^*$ (from (3a)) and $Y_{i \rightarrow}^* = \bar{Y}_{i \rightarrow}^*$ (from (3b)), which is the possibility stated in Possibility (c) in the lemma.

Otherwise, $|\bar{Y}_{\rightarrow i}^*| = |Y_{\rightarrow i}^*| + 1$ and so (3a) implies that $\bar{Y}_{\rightarrow i}^* = Y_{\rightarrow i}^* \cup \{\bar{y}\}$. Thus, $|\bar{Y}_{\rightarrow i}^*| - |Y_{\rightarrow i}^*| = 1$ and so (4) can only hold if either $|\bar{Y}_{i \rightarrow}^*| - |Y_{i \rightarrow}^*| = 0$ or $|\bar{Y}_{i \rightarrow}^*| - |Y_{i \rightarrow}^*| = 1$. In the former case, we have (from (3b)) that $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^*$ and so $\bar{Y}^* = Y^* \cup \{\bar{y}\}$, which is the possibility stated in Possibility (b) in the lemma. In the latter case, we have (from (3b)) that $\bar{Y}_{i \rightarrow}^* = Y_{i \rightarrow}^* \cup \{z\}$ for some $z \in [Y \setminus Y^*]_{i \rightarrow}$, which is the possibility stated in Possibility (d) in the lemma.

The proof of the second part of Lemma 1 is completely analogous to the proof of the first part.

A.2 Proof of Claim 1

The first condition of Definition 7 holds immediately.

To prove that part (a) of the second condition of Definition 7 holds, we proceed as follows: Choose an arbitrary $Y^* \in C_{b(z^0)}((Z \setminus \{z^0\}) \cup A)$. Since $C_{b(z^0)}$ is monotone-substitutable, there exists a $Z^* \in C_{b(z^0)}(Z \cup A)$ such that

$$[((Z \setminus \{z^0\}) \cup A) \setminus Y^*]_{\rightarrow b(z^0)} \subseteq [(Z \cup A) \setminus Z^*]_{\rightarrow b(z^0)} \quad (5)$$

$$Y_{b(z^0) \rightarrow}^* \subseteq Z_{b(z^0) \rightarrow}^* \quad (6)$$

$$|Z_{\rightarrow b(z^0)}^*| - |Y_{\rightarrow b(z^0)}^*| \geq |Z_{b(z^0) \rightarrow}^*| - |Y_{b(z^0) \rightarrow}^*|. \quad (7)$$

Partition Y^* into $\hat{Y}^* \equiv Y^* \cap (Z \setminus \{z^0\})$ and $\check{Y}^* \equiv Y^* \cap A$, and Z^* into $\hat{Z}^* \equiv Z^* \cap Z$ and $\check{Z}^* \equiv Z^* \cap A$.²⁶ Note that since Z is a blocking set, we must have $\hat{Z}_{b(z^0)}^* = Z_{b(z^0)}$.

We argue first that when z^0 is no longer available, every optimal choice by $b(z^0)$ includes all of the remaining contracts in Z for which he is a buyer, i.e., $\hat{Y}_{\rightarrow b(z^0)}^* = [Z \setminus \{z^0\}]_{\rightarrow b(z^0)}$. Using the notation introduced above, we can rewrite (5) as

$$[((Z \setminus \{z^0\}) \cup A) \setminus (\hat{Y}^* \cup \check{Y}^*)]_{\rightarrow b(z^0)} \subseteq [(Z \cup A) \setminus (\hat{Z}^* \cup \check{Z}^*)]_{\rightarrow b(z^0)},$$

or, equivalently,

$$[((Z \setminus \{z^0\}) \setminus \hat{Y}^*) \cup (A \setminus \check{Y}^*)]_{\rightarrow b(z^0)} \subseteq [A \setminus \check{Z}^*]_{\rightarrow b(z^0)}. \quad (8)$$

Here, we have used the fact that $[Z \setminus \hat{Z}^*]_{\rightarrow b(z^0)} = \emptyset$ since Z is a blocking set. From (8), we can immediately infer that $[(Z \setminus \{z^0\}) \setminus \hat{Y}^*]_{\rightarrow b(z^0)} \subseteq A$. Given that Z is a blocking set, we must have $Z \cap A = \emptyset$ and thus $[(Z \setminus \{z^0\}) \setminus \hat{Y}^*]_{\rightarrow b(z^0)} = \emptyset$. Hence, $[Z \setminus \{z^0\}]_{\rightarrow b(z^0)} \subseteq \hat{Y}^*$. Since $\hat{Y}^* = Y^* \cap (Z \setminus \{z^0\})$, we obtain that $[Z \setminus \{z^0\}]_{\rightarrow b(z^0)} = \hat{Y}_{\rightarrow b(z^0)}^*$.

Next, we argue that when z^0 is no longer available, every optimal choice by $b(z^0)$ excludes at most one of his contracts in Z for which he is a seller, i.e., either $\hat{Y}_{b(z^0) \rightarrow}^* = Z_{b(z^0) \rightarrow}$ or there exists a $z^1 \in Z$ such that $\hat{Y}_{b(z^0) \rightarrow}^* = [Z \setminus \{z^1\}]_{b(z^0) \rightarrow}$. Note first that (5) implies that $b(z^0)$ chooses at most one fewer contract as a buyer when z^0 is no longer available, i.e., $|Z_{\rightarrow b(z^0)}^*| \leq |Y_{\rightarrow b(z^0)}^* \cup \{z^0\}| = |Y_{\rightarrow b(z^0)}^*| + 1$, and so $|Z_{\rightarrow b(z^0)}^*| - |Y_{\rightarrow b(z^0)}^*| \leq 1$. Hence, (7) implies that $|Z_{b(z^0) \rightarrow}^*| - |Y_{b(z^0) \rightarrow}^*| \leq 1$; we rewrite

²⁶To see that these are partitions, recall that $A \cap Z = \emptyset$ as Z is a blocking set.

this last inequality as

$$(|\hat{Z}_{b(z^0)\rightarrow}^*| - |\hat{Y}_{b(z^0)\rightarrow}^*|) + (|\check{Z}_{b(z^0)\rightarrow}^*| - |\check{Y}_{b(z^0)\rightarrow}^*|) \leq 1. \quad (9)$$

Now by (6), we have that $Y_{b(z^0)\rightarrow}^* \subseteq Z_{b(z^0)\rightarrow}^*$ and thus $\check{Y}_{b(z^0)\rightarrow}^* \subseteq \check{Z}_{b(z^0)\rightarrow}^*$; combining this with (9) implies that $|\hat{Z}_{b(z^0)\rightarrow}^*| - |\hat{Y}_{b(z^0)\rightarrow}^*| \leq 1$. Moreover, by (6), we have that $Y_{b(z^0)\rightarrow}^* \subseteq Z_{b(z^0)\rightarrow}^*$ and thus $\hat{Y}_{b(z^0)\rightarrow}^* \subseteq \hat{Z}_{b(z^0)\rightarrow}^*$; hence, either $\hat{Y}_{b(z^0)\rightarrow}^* = \hat{Z}_{b(z^0)\rightarrow}^* = Z_{b(z^0)\rightarrow}$ or there exists a $z^1 \in Z$ such that $\hat{Y}_{b(z^0)\rightarrow}^* = [\hat{Z}^* \setminus \{z^1\}]_{b(z^0)\rightarrow} = [Z \setminus \{z^1\}]_{b(z^0)\rightarrow}$.

Part (b) of the second condition of Definition 7 follows analogously to part (a).

The third condition of Definition 7 holds vacuously as $b(z^0) \neq s(z^0)$.

A.3 Proof of Claim 2

Since $W^{-m,n}$ is a quasi-removable chain that is not downstream terminal, there exist $\tilde{Z}^* \in \hat{C}_{b(z^n)}(Z \setminus W^{-m,n}; A)$ and $z^{n+1} \in [Z \setminus W^{-m,n}]_{b(z^n)\rightarrow}$ such that $\tilde{Z}_{b(z^n)\rightarrow}^* = [(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{b(z^n)\rightarrow}$. We will argue that $W^{-m,n+1} \equiv W^{-m,n} \cup \{z^{n+1}\}$ is a quasi-removable chain.

To see that $W^{-m,n+1}$ satisfies the first condition of Definition 7, we note that:

- For all $i \in I \setminus \{s(z^{-m}), b(z^n), b(z^{n+1})\}$, we have that

$$\{[Z \setminus W^{-m,n+1}]_i\} = \hat{C}_i(Z \setminus W^{-m,n+1}; A),$$

as $W^{-m,n}$ is quasi-removable and $[Z \setminus W^{-m,n+1}]_i = [Z \setminus W^{-m,n}]_i$ for each such i .

- We show here that if $b(z^n) \neq s(z^{-m})$ then $\{[Z \setminus W^{-m,n+1}]_{b(z^n)}\} = \hat{C}_{b(z^n)}(Z \setminus W^{-m,n+1}; A)$.^{27,28} Let $\tilde{Z} \subsetneq [Z \setminus W^{-m,n+1}]_{b(z^n)}$ be arbitrary. We claim that $\tilde{Z} \notin \hat{C}_{b(z^n)}(Z \setminus W^{-m,n+1}; A)$. To see this, note first that part (a) of the second condition of Definition 7 applied to $W^{-m,n}$ implies that $\tilde{Z} \notin \hat{C}_{b(z^n)}(Z \setminus W^{-m,n}; A)$; meanwhile, $[(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{b(z^n)} \in \hat{C}_{b(z^n)}(Z \setminus W^{-m,n}; A)$ by assumption. Thus,

$$\hat{U}_{b(z^n)}([(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{b(z^n)}) > \hat{U}_{b(z^n)}(\tilde{Z}).$$

²⁷We consider the case where $b(z^n) = s(z^{-m})$ below.

²⁸If $b(z^n) \neq s(z^{-m})$, we have that $b(z^n) \in I \setminus \{s(z^{-m}), b(z^{n+1})\}$ since $s(z^{n+1}) = b(z^n)$ and $s(z^{n+1}) \neq b(z^{n+1})$. Hence, we also have to establish the first condition of Definition 7 for $b(z^n)$ if $b(z^n) \neq s(z^{-m})$.

Hence, since $[(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{b(z^n)}$ is available from $[(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{b(z^n)}$ and provides a higher utility than \tilde{Z} , we have that $\tilde{Z} \notin \hat{C}_{b(z^n)}(Z \setminus W^{-m,n+1}; A)$.

To finish the proof, we consider two cases, depending on whether both ends of the chain $W^{-m,n+1}$ are associated to the same agent. In the first case, we suppose the ends of the chain are associated with distinct agents, i.e., $b(z^{n+1}) \neq s(z^{-m})$. In the second case, we suppose the ends of the chain are associated with the same agent, i.e., $b(z^{n+1}) = s(z^{-m})$.

Case 1: $b(z^{n+1}) \neq s(z^{-m})$. If $b(z^{n+1}) \neq s(z^{-m})$, then we need to check the second condition of Definition 7. We prove first that part (a) of the second condition is satisfied. We proceed via an argument analogous to that used to prove Claim 1: Choose an arbitrary $Y^* \in C_{b(z^{n+1})}((Z \setminus W^{-m,n+1}) \cup A)$. Note first that since $C_{b(z^{n+1})}$ is monotone-substitutable, there exists a $Z^* \in C_{b(z^{n+1})}((Z \setminus W^{-m,n}) \cup A)$ such that

$$[((Z \setminus W^{-m,n+1}) \cup A) \setminus Y^*]_{\rightarrow b(z^{n+1})} \subseteq [((Z \setminus W^{-m,n}) \cup A) \setminus Z^*]_{\rightarrow b(z^{n+1})} \quad (10)$$

$$Y_{b(z^{n+1}) \rightarrow}^* \subseteq Z_{b(z^{n+1}) \rightarrow}^* \quad (11)$$

$$|Z_{\rightarrow b(z^{n+1})}^*| - |Y_{\rightarrow b(z^{n+1})}^*| \geq |Z_{b(z^{n+1}) \rightarrow}^*| - |Y_{b(z^{n+1}) \rightarrow}^*|. \quad (12)$$

Partition Y^* into $\hat{Y}^* \equiv Y^* \cap (Z \setminus W^{-m,n+1})$ and $\check{Y}^* \equiv Y^* \cap A$, and Z^* into $\hat{Z}^* \equiv Z^* \cap (Z \setminus W^{-m,n})$ and $\check{Z}^* \equiv Z^* \cap A$.²⁹

We argue first that when z^{n+1} is no longer available, every optimal choice by $b(z^{n+1})$ includes all of his remaining contracts in Z for which he is a buyer, i.e., $\hat{Y}_{\rightarrow b(z^{n+1})}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow b(z^{n+1})}$. Using the notation just introduced, we can rewrite (10) as

$$[((Z \setminus W^{-m,n+1}) \cup A) \setminus (\hat{Y}^* \cup \check{Y}^*)]_{\rightarrow b(z^{n+1})} \subseteq [((Z \setminus W^{-m,n}) \cup A) \setminus (\hat{Z}^* \cup \check{Z}^*)]_{\rightarrow b(z^{n+1})},$$

or, equivalently,

$$[((Z \setminus W^{-m,n+1}) \setminus \hat{Y}^*) \cup (A \setminus \check{Y}^*)]_{\rightarrow b(z^{n+1})} \subseteq [A \setminus \check{Z}^*]_{\rightarrow b(z^{n+1})}. \quad (13)$$

²⁹Recall that $A \cap Z = \emptyset$, and so $A \cap (Z \setminus W^{-m,n+1}) = \emptyset$.

Here, we have used the fact that $[(Z \setminus W^{-m,n}) \setminus \hat{Z}^*]_{\rightarrow b(z^{n+1})} = \emptyset$ since $\hat{C}_{b(z^{n+1})}(Z \setminus W^{-m,n}; A) = \{[Z \setminus W^{-m,n}]_{b(z^{n+1})}\}$ (which follows from the fact that $W^{-m,n}$ is a quasi-removable chain and applying the first condition of Definition 7). From (13), we can immediately infer that $[(Z \setminus W^{-m,n+1}) \setminus \hat{Y}^*]_{\rightarrow b(z^{n+1})} \subseteq A$. Given that Z is a blocking set, we must have $Z \cap A = \emptyset$ and thus $[(Z \setminus W^{-m,n+1}) \setminus \hat{Y}^*]_{\rightarrow b(z^{n+1})} = \emptyset$. Hence, $[Z \setminus W^{-m,n+1}]_{\rightarrow b(z^{n+1})} \subseteq \hat{Y}^*$. Since $\hat{Y}^* = Y^* \cap (Z \setminus W^{-m,n+1})$ we obtain $[Z \setminus W^{-m,n+1}]_{\rightarrow b(z^{n+1})} = \hat{Y}^*_{\rightarrow b(z^{n+1})}$.

Next, we argue that when z^{n+1} is no longer available, every optimal choice by $b(z^{n+1})$ excludes at most one of his contracts in $Z \setminus W^{-m,n+1}$ for which he is a seller, i.e., either $\hat{Y}^*_{b(z^{n+1})\rightarrow} = [Z \setminus W^{-m,n+1}]_{b(z^{n+1})\rightarrow}$ or there exists a $z^{n+2} \in Z$ such that $\hat{Y}^*_{b(z^{n+1})\rightarrow} = [(Z \setminus W^{-m,n+1}) \setminus \{z^{n+2}\}]_{b(z^{n+1})\rightarrow}$. Note first that (10) implies that $b(z^{n+1})$ chooses at most one fewer contract as a buyer when z^{n+1} is no longer available, i.e., $|Z^*_{\rightarrow b(z^{n+1})}| - |Y^*_{\rightarrow b(z^{n+1})}| \leq 1$. Hence, (12) implies that $|Z^*_{b(z^{n+1})\rightarrow}| - |Y^*_{b(z^{n+1})\rightarrow}| \leq 1$; we can rewrite this last inequality as

$$(|\hat{Z}^*_{b(z^{n+1})\rightarrow}| - |\hat{Y}^*_{b(z^{n+1})\rightarrow}|) + (|\check{Z}^*_{b(z^{n+1})\rightarrow}| - |\check{Y}^*_{b(z^{n+1})\rightarrow}|) \leq 1. \quad (14)$$

Now by (11), we have that $Y^*_{b(z^{n+1})\rightarrow} \subseteq Z^*_{b(z^{n+1})\rightarrow}$ and thus $\check{Y}^*_{b(z^{n+1})\rightarrow} \subseteq \check{Z}^*_{b(z^{n+1})\rightarrow}$; combining this with (14) implies that $|\hat{Z}^*_{b(z^{n+1})\rightarrow}| - |\hat{Y}^*_{b(z^{n+1})\rightarrow}| \leq 1$. Moreover, by (11), we have that $Y^*_{b(z^{n+1})\rightarrow} \subseteq Z^*_{b(z^{n+1})\rightarrow}$ and thus $\hat{Y}^*_{b(z^{n+1})\rightarrow} \subseteq \hat{Z}^*_{b(z^{n+1})\rightarrow}$; hence, either $\hat{Y}^*_{b(z^{n+1})\rightarrow} = \hat{Z}^*_{b(z^{n+1})\rightarrow}$ or there exists a z^{n+2} such that $\hat{Y}^*_{b(z^{n+1})\rightarrow} = [\hat{Z}^* \setminus \{z^{n+2}\}]_{b(z^{n+1})\rightarrow}$.

To prove that part (b) of the second condition of Definition 7 is satisfied, as well as that extending the chain conserves upstream terminality, we distinguish two cases:

- If $s(z^{-m}) \neq b(z^n)$, we have that $W_{s(z^{-m})}^{-m,n} = W_{s(z^{-m})}^{-m,n+1}$ as we have assumed by hypothesis $b(z^{n+1}) \neq s(z^{-m})$; thus, since $W^{-m,n}$ is a quasi-removable chain by assumption, we have that part (b) of the second condition of Definition 7 is satisfied for $s(z^{-m})$ and $W^{-m,n+1}$.

Moreover, if $W^{-m,n}$ is upstream terminal, then for all $\bar{Z}^* \in \hat{C}_{s(z^{-m})}(Z \setminus W^{-m,n}; A)$ we have that

$$\bar{Z}^*_{\rightarrow s(z^{-m})} = [Z \setminus W^{-m,n}]_{\rightarrow s(z^{-m})}. \quad (15)$$

Combining (15) with the fact that $W_{s(z^{-m})}^{-m,n} = W_{s(z^{-m})}^{-m,n+1}$ yields that for all $\bar{Z}^* \in \hat{C}_{s(z^{-m})}(Z \setminus W^{-m,n+1}; A)$, we have that

$$\bar{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow s(z^{-m})},$$

and thus $W^{-m,n+1}$ is upstream terminal by definition.

- If $s(z^{-m}) = b(z^n) = k$, recall first that $\tilde{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n}; A)$ and z^{n+1} were chosen such that $\tilde{Z}_{k \rightarrow}^* = [(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{k \rightarrow}$. Since $\tilde{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n}; A)$,

$$\hat{U}_i(\tilde{Z}^*; A) > \hat{U}_i(Y; A)$$

for all $Y \subseteq Z \setminus W^{-m,n}$ such that $Y \notin \hat{C}_i(Z \setminus W^{-m,n}; A)$; that is, \tilde{Z}^* provides a higher utility to i than any $Y \subseteq Z \setminus W^{-m,n}$ that was *not* chosen when $Z \setminus W^{-m,n}$ was available. Thus, since $\tilde{Z}_{k \rightarrow}^* = [(Z \setminus W^{-m,n}) \setminus \{z^{n+1}\}]_{k \rightarrow}$ (and thus $\tilde{Z}^* \subseteq Z \setminus W^{-m,n+1}$), we have that

$$\hat{C}_k(Z \setminus W^{-m,n+1}; A) \subseteq \hat{C}_k(Z \setminus W^{-m,n}; A). \quad (16)$$

We now show that when z^{n+1} is no longer available the seller of z^{-m} never drops a contract for which he is the seller, i.e., for all $\bar{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n+1}; A)$, we have that

$$\bar{Z}_{k \rightarrow}^* = [Z \setminus W^{-m,n+1}]_{k \rightarrow}.$$

Since $W^{-m,n}$ was a quasi-removable chain, there does not exist $Y \in \hat{C}_k(Z \setminus W^{-m,n}; A)$ such that $|Y_{k \rightarrow}| < |[Z \setminus W^{-m,n}]_{k \rightarrow}| - 1$. Thus, using (16), we have that there does not exist $Y \in \hat{C}_k(Z \setminus W^{-m,n+1}; A)$ such that $|Y_{k \rightarrow}| < |[Z \setminus W^{-m,n}]_{k \rightarrow}| - 1 = |[Z \setminus W^{-m,n+1}]_{k \rightarrow}|$. Therefore, k must now choose as a seller all of the contracts in $Z \setminus W^{-m,n+1}$, i.e.,

$$\bar{Z}_{k \rightarrow}^* = [Z \setminus W^{-m,n+1}]_{k \rightarrow}.$$

Next, we show that when z^{n+1} is longer available the seller of z^{-m} drops at

most one contract as a buyer, i.e., for all $\bar{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n+1}; A)$ either

$$\bar{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}$$

or there exists a $z^{-m-1} \in Z$ such that

$$\bar{Z}_{\rightarrow k}^* = [Z \setminus (W^{-m,n+1} \cup \{z^{-m-1}\})]_{\rightarrow k}.$$

Since $W^{-m,n}$ was a quasi-removable chain, there does not exist $Y \in \hat{C}_k(Z \setminus W^{-m,n}; A)$ such that $|Y_{\rightarrow k}| < |[Z \setminus W^{-m,n}]_{\rightarrow k}| - 1$. Thus, using (16), we have that there does not exist $Y \in \hat{C}_k(Z \setminus W^{-m,n+1}; A)$ such that $|Y_{\rightarrow k}| < |[Z \setminus W^{-m,n}]_{\rightarrow k}| - 1$. Therefore, k must now choose all but one of his contracts as a buyer, i.e., either

$$\bar{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus W^{-m,n}]_{\rightarrow s(z^{-m})}$$

or there exists a $z^{-m-1} \in Z$ such that

$$\bar{Z}_{\rightarrow s(z^{-m})}^* = [Z \setminus (W^{-m,n} \cup \{z^{-m-1}\})]_{\rightarrow s(z^{-m})}.$$

Since $s(z^{n+1}) = b(z^n) = s(z^{-m})$, we have that $[Z \setminus W^{-m,n}]_{\rightarrow s(z^{-m})} = [Z \setminus W^{-m,n+1}]_{\rightarrow s(z^{-m})}$ and thus obtain the desired statement.

Finally, we show that if $W^{-m,n}$ is upstream terminal, then $W^{-m,n+1}$ is upstream terminal. If $W^{-m,n}$ is upstream terminal, then for all $\bar{Z}^* \in \hat{C}_k(Z \setminus W^{-m,n}; A)$, we have that

$$\bar{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n}]_{\rightarrow k}. \tag{17}$$

Combining (17) with (16) yields that for all $\bar{Z}^* \in \hat{C}_{s(z^{-m})}(Z \setminus W^{-m,n+1}; A)$, we have that

$$\bar{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}.$$

Thus, $W^{-m,n+1}$ is upstream terminal by definition.

Case 2: $b(z^{n+1}) = s(z^{-m})$. If $b(z^{n+1}) = s(z^{-m}) \equiv k$, then we need to check the third condition of Definition 7. As in Case 1, choose an arbitrary $Y^* \in C_k((Z \setminus W^{-m,n+1}) \cup A)$. Note first that since $C_{b(z^{n+1})}$ is monotone-substitutable, there

exists a $Z^* \in C_{b(z^{n+1})}((Z \setminus W^{-m,n}) \cup A)$ such that

$$[((Z \setminus W^{-m,n+1}) \cup A) \setminus Y^*]_{\rightarrow k} \subseteq [((Z \setminus W^{-m,n}) \cup A) \setminus Z^*]_{\rightarrow k} \quad (18)$$

$$Y_{k \rightarrow}^* \subseteq Z_{k \rightarrow}^* \quad (19)$$

$$|Z_{\rightarrow k}^*| - |Y_{\rightarrow k}^*| \geq |Z_{k \rightarrow}^*| - |Y_{k \rightarrow}^*|. \quad (20)$$

Partition Y^* into $\hat{Y}^* \equiv Y^* \cap (Z \setminus W^{-m,n+1})$ and $\check{Y}^* \equiv Y^* \cap A$, and Z^* into $\hat{Z}^* \equiv Z^* \cap (Z \setminus W^{-m,n})$ and $\check{Z}^* \equiv Z^* \cap A$.³⁰ Note that either $\hat{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n}]_{\rightarrow k}$ or $\hat{Z}_{\rightarrow k}^* = [(Z \setminus W^{-m,n}) \setminus \{z^{-m-1}\}]_{\rightarrow k}$ for some $z^{-m-1} \in [Z \setminus W^{-m,n}]_{\rightarrow k}$ as $W^{-m,n}$ is a quasi-removable chain and $b(z^n) \neq s(z^{-m})$ in the case we consider here.³¹

We argue first that Condition 3(a) of Definition 7 is satisfied: When z^{n+1} is no longer available, every optimal choice by k excludes at most one of his remaining contracts as a buyer, i.e., either $\hat{Y}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}$ or there exists a $z^{-m-1} \in Z$ such that $\hat{Y}_{\rightarrow k}^* = [(Z \setminus W^{-m,n+1}) \setminus \{z^{-m-1}\}]_{\rightarrow k}$. We can rewrite (18) as

$$[[(Z \setminus W^{-m,n+1}) \cup A]_{\rightarrow k} \setminus [\hat{Y}^* \cup \check{Y}^*]_{\rightarrow k}] \subseteq [[(Z \setminus W^{-m,n}) \cup A]_{\rightarrow k} \setminus [\hat{Z}^* \cup \check{Z}^*]_{\rightarrow k}]$$

or, equivalently,

$$[[(Z \setminus W^{-m,n+1}) \setminus \hat{Y}^*]_{\rightarrow k} \cup [A \setminus \check{Y}^*]_{\rightarrow k}] \subseteq [[(Z \setminus W^{-m,n}) \setminus \hat{Z}^*]_{\rightarrow k} \cup [A \setminus \check{Z}^*]_{\rightarrow k}];$$

given that $Z \cap A = \emptyset$, this subset relation implies that

$$[(Z \setminus W^{-m,n+1}) \setminus \hat{Y}^*]_{\rightarrow k} \subseteq [(Z \setminus W^{-m,n}) \setminus \hat{Z}^*]_{\rightarrow k}. \quad (21)$$

If $\hat{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n}]_{\rightarrow k}$, then (21) implies that $\hat{Y}_{\rightarrow k}^* \supseteq [Z \setminus W^{-m,n+1}]_{\rightarrow k}$; but $\hat{Y}^* \equiv Y^* \cap (Z \setminus W^{-m,n+1})$ and so $\hat{Y}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}$. Consequently, if $W^{-m,n}$ is upstream terminal (i.e., $\hat{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n}]_{\rightarrow k}$), then $W^{-m,n+1}$ is upstream terminal (i.e., $\hat{Z}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}$). If $\hat{Z}_{\rightarrow k}^* = [(Z \setminus W^{-m,n}) \setminus \{z^{-m-1}\}]_{\rightarrow k}$ for some $z^{-m-1} \in [Z \setminus W^{-m,n}]_{\rightarrow k}$, then (21) implies that $\hat{Y}_{\rightarrow k}^* \supseteq$

³⁰Recall that $A \cap (Z \setminus W^{-m,n+1}) = \emptyset$.

³¹In this case, we have assumed that $b(z^{n+1}) = s(z^{-m})$ and so, since $b(z^n) = s(z^{n+1})$ and $s(z^{n+1}) \neq b(z^{n+1})$, we have that $b(z^n) \neq s(z^{-m})$.

$[(Z \setminus W^{-m,n+1}) \setminus \{z^{-m-1}\}]_{\rightarrow k}$; but $\hat{Y}^* \equiv Y^* \cap (Z \setminus W^{-m,n+1})$ and so either $\hat{Y}_{\rightarrow k}^* = [Z \setminus W^{-m,n+1}]_{\rightarrow k}$ or $\hat{Y}_{\rightarrow k}^* = [(Z \setminus W^{-m,n+1}) \setminus \{z^{-m-1}\}]_{\rightarrow k}$. Hence, when z^{n+1} is no longer available, every optimal choice by k as a buyer includes all but at most one of the contracts in $[Z \setminus W^{-m,n+1}]_{\rightarrow k}$.

We argue second that Condition 3(b) of Definition 7 is satisfied: When z^{n+1} is no longer available, every optimal choice by k excludes at most one of his remaining contracts as a seller, i.e., either $\hat{Y}_{k \rightarrow}^* = [Z \setminus W^{-m,n+1}]_{k \rightarrow}$ or there exists a $z^{n+2} \in Z_{k \rightarrow}$ such that $\hat{Y}_{k \rightarrow}^* = [(Z \setminus W^{-m,n+1}) \setminus \{z^{n+2}\}]_{k \rightarrow}$. Note first that (18) implies that k chooses at most one fewer contract as a buyer when z^{n+1} is no longer available, i.e., $|Z_{\rightarrow k}^*| - |Y_{\rightarrow k}^*| \leq 1$. Hence, (20) implies that $|Z_{k \rightarrow}^*| - |Y_{k \rightarrow}^*| \leq 1$; we can rewrite this last inequality as

$$(|\hat{Z}_{k \rightarrow}^*| - |\hat{Y}_{k \rightarrow}^*|) + (|\check{Z}_{k \rightarrow}^*| - |\check{Y}_{k \rightarrow}^*|) \leq 1. \quad (22)$$

Now by (19), we have that $Y_{k \rightarrow}^* \subseteq Z_{k \rightarrow}^*$ and thus $\check{Y}_{k \rightarrow}^* \subseteq \check{Z}_{k \rightarrow}^*$; combining this with (22) implies that $|\hat{Z}_{k \rightarrow}^*| - |\hat{Y}_{k \rightarrow}^*| \leq 1$. Moreover, by (19), we have that $Y_{k \rightarrow}^* \subseteq Z_{k \rightarrow}^*$ and thus $\hat{Y}_{k \rightarrow}^* \subseteq \hat{Z}_{k \rightarrow}^*$; hence, either $\hat{Y}_{k \rightarrow}^* = \hat{Z}_{k \rightarrow}^*$ or there exists a z^{n+2} such that $\hat{Y}_{k \rightarrow}^* = [\hat{Z}_{k \rightarrow}^* \setminus \{z^{n+2}\}]_{k \rightarrow}$.

This completes the proof of Claim 2.

A.4 Proof of Claim 3

The proof is analogous to the proof of Claim 2.

A.5 Proof of Claim 4

As $W^{-m,n}$ is quasi-removable, we know that for all $i \in I \setminus \{s(z^{-m}), b(z^n)\}$ we have that $\{[Z \setminus W^{-m,n}]_i\} = \hat{C}_i(Z \setminus W^{-m,n})$ (from Condition 1 of Definition 7). There are two cases to consider:

Case 1: $b(z^n) \neq s(z^{-m})$. Since $W^{-m,n}$ is upstream terminal, we have that

$$\{Z_{s(z^{-m})} \setminus \{z^{-m}, \dots, z^n\}\} = \hat{C}_{s(z^{-m})}(Z \setminus \{z^{-m}, \dots, z^n\}; A).$$

Furthermore, since $W^{-m,n}$ is downstream terminal, we have that

$$\{Z_{b(z^n)} \setminus \{z^{-m}, \dots, z^n\}\} = \hat{C}_{b(z^n)}(Z \setminus \{z^{-m}, \dots, z^n\}; A).$$

Thus, $Z \setminus W^{-m,n}$ blocks A .

Case 2: $b(z^n) = s(z^{-m})$. In this case, since $W^{-m,n}$ is upstream and downstream terminal, we have that

$$\{Z_{b(z^n)} \setminus \{z^{-m}, \dots, z^n\}\} = \hat{C}_{b(z^n)}(Z \setminus \{z^{-m}, \dots, z^n\}; A).$$

Thus, $Z \setminus W^{-m,n}$ blocks A .

This completes the proof of Claim 4.

A.6 Proof of Claim 5

As Z blocks A , for all $i \in a(Z)$, for each $Y \in C_i(A \cup Z)$, we have that $Z_i \subseteq Y$. Since $W \subseteq Z$, for all $i \in a(Z)$, for each $Y \in C_i(A \cup Z)$, we have that $W_i \subseteq Y$. Thus, for all $i \in a(W) \subseteq a(Z)$, for each $Y \in C_i(A \cup Z) = C_i((A \cup (Z \setminus W)) \cup W)$, we have that $W_i \subseteq Y$. Thus, by definition, W blocks $A \cup (Z \setminus W)$.

B Chain Stability and Competitive Equilibrium

In this appendix, we show that in the trading network setting of Hatfield et al. (2013), an outcome is consistent with competitive equilibrium if and only if it is not blocked by a chain of contracts.

The Hatfield et al. (2013) is a special case of ours that requires that

- prices are continuous and unrestricted, i.e., $X = \Omega \times \mathbb{R}$, and
- agents' preferences are quasilinear in prices.

Formally, a utility function U_i is *quasilinear in prices* if there exists a valuation function u_i from the sets of trades involving agent i to $\mathbb{R} \cup \{-\infty\}$ such that for any feasible set $Y \subseteq X_i$,

$$U_i(Y) = u_i(\tau(Y)) + \sum_{(\omega, p_\omega) \in Y_{i \rightarrow}} p_\omega - \sum_{(\omega, p_\omega) \in Y_{\rightarrow i}} p_\omega.$$

Definition 8. An outcome Y is *consistent with competitive equilibrium* if there exists a vector of prices for all trades in the economy, $p \in \mathbb{R}^\Omega$, such that

- for every $\omega \in \tau(Y)$, $(\omega, p_\omega) \in Y$, and
- for every agent i , for every set of trades $\Phi \subseteq \Omega_i$,

$$U_i(Y_i) \geq u_i(\Phi) + \sum_{\omega \in \Phi_{i \rightarrow}} p_\omega - \sum_{\omega \in \Phi_{\rightarrow i}} p_\omega.$$

An outcome Y only specifies prices for the trades that are in fact executed under the outcome, while a competitive equilibrium specifies prices for all the trades in the economy. For an outcome to be consistent with competitive equilibrium it has to be the case that one can specify prices for the trades that are not executed in such a way that under the resulting vector of prices p , for each agent i , selecting the trades associated with the outcome Y is in fact consistent with utility maximization. Definition 8 formalizes this requirement.

We are now ready to state our competitive equilibrium equivalence result.

Corollary B.1. *Suppose that the set of contracts is $X = \Omega \times \mathbb{R}$, and that all agents' preferences are fully substitutable and quasilinear in prices. Then, an outcome is consistent with competitive equilibrium if and only if it is chain stable.*

Proof. Under the assumed conditions on X and agents' preferences, Theorem 10 of Hatfield et al. (2019) implies that all agents' utility functions are monotone-substitutable. Thus, by our Theorem 1, an outcome is chain stable if and only if it is stable. Moreover, by Theorems 5 and 6 of Hatfield et al. (2013), an outcome is stable if and only if it is consistent with competitive equilibrium. Thus, an outcome is chain stable if and only if it is consistent with competitive equilibrium. \square

C Proof of Theorem 3

Here, we implicitly use I as the set of agents who have trades in Ω^m .

For a set of agents $J \subseteq I$, for any set of trades $\Phi \subseteq \Omega^m$, let

$$\Phi_J \equiv \cup_{j \in J} \Phi_j = \{\varphi \in \Phi : b(\varphi) \in J \text{ or } s(\varphi) \in J\}.$$

For a set of agents $J \subseteq I$, an agent $i \in I \setminus J$ *expands* Ω_J^m if $\Omega_{\{i\} \cup J}^m \setminus \Omega_J^m \neq \emptyset$. An *expanding* sequence of agents is a sequence of agents (i_1, \dots, i_R) such that i_r expands $\Omega_{\{i_1, \dots, i_{r-1}\}}^m$ for all $r = 1, \dots, R$. A *complete* expanding sequence of agents is a sequence of agents (i_1, \dots, i_R) such that $\Omega_{\{i_1, \dots, i_R\}}^m = \Omega^m$. Note that every set of trades can be constructed by sequentially choosing sets of trades in $\Omega_{i_1, \dots, i_r} \setminus \Omega_{i_1, \dots, i_{r-1}}$ for $r = 1, \dots, R$.

We complete the proof by considering two mutually exclusive cases: in the first case, we assume that there exists an agent associated with at least $\frac{m}{\log_2(m)}$ trades. In the second case, since no agent is associated with $\frac{m}{\log_2(m)}$ or more trades, any complete expanding sequence must contain at least $\log_2(m)$ agents. In each case, we construct a bound on the ratio of the number of chains to the number of potential blocking sets.

Case 1: A large agent. Here, we suppose that there exists an agent i such that

$$|\Omega_i^m| \geq \frac{m}{\log_2(m)}.$$

For a set of trades $\Phi \subseteq \Omega^m$ to be a chain, it must be the case that either $|\Phi_{\rightarrow i}| = |\Phi_{i \rightarrow}|$, $|\Phi_{\rightarrow i}| = |\Phi_{i \rightarrow}| + 1$ (when i is at the “downstream end” of the chain), or $|\Phi_{\rightarrow i}| + 1 = |\Phi_{i \rightarrow}|$ (when i is at the “upstream end” of the chain). We compute that

- the number of the sets of trades satisfying the first of these three criteria is

$$\sum_{n=0}^{|\Omega_{\rightarrow i}^m|} \binom{|\Omega_{\rightarrow i}^m|}{n} \binom{|\Omega_{i \rightarrow}^m|}{n} = \binom{|\Omega_i^m|}{|\Omega_{\rightarrow i}^m|} \leq \binom{|\Omega_i^m|}{\frac{|\Omega_i^m|}{2}};$$

- the number of the sets of trades satisfying the second of these three criteria is

$$\sum_{n=0}^{|\Omega_{\rightarrow i}^m|} \binom{|\Omega_{\rightarrow i}^m|}{n+1} \binom{|\Omega_{i \rightarrow}^m|}{n} = \binom{|\Omega_i^m|}{|\Omega_{\rightarrow i}^m| - 1} \leq \binom{|\Omega_i^m|}{\frac{|\Omega_i^m|}{2}};$$

- the number of the sets of trades satisfying the third of these three criteria is

$$\sum_{n=0}^{|\Omega_{\rightarrow i}^m|} \binom{|\Omega_{\rightarrow i}^m|}{n} \binom{|\Omega_{i \rightarrow}^m|}{n+1} = \binom{|\Omega_i^m|}{|\Omega_{\rightarrow i}^m| + 1} \leq \binom{|\Omega_i^m|}{\frac{|\Omega_i^m|}{2}}.$$

Summing the three previous expressions, we find that the number of sets of

trades satisfying one of our three conditions is no greater than

$$3 \binom{|\Omega_i^m|}{\frac{|\Omega_i^m|}{2}}.$$

Thus, using Stirling's bounds, we find that the number of chains of trades is no greater than

$$3 \sqrt{\frac{2}{\pi}} \binom{2^{|\Omega_i^m|}}{\sqrt{|\Omega_i^m|}}.$$

Thus, as the number of subsets of trades is simply $2^{|\Omega_i^m|}$, we have that $\frac{|\mathfrak{C}^m(Y)|}{|\mathfrak{B}^m(Y)|} = O\left(\frac{\sqrt{\log_2 m}}{\sqrt{m}}\right)$ as $|\Omega_i^m| \geq \frac{m}{\log_2(m)}$.

Case 2: Small agents. Here, we suppose that $|\Omega_i^m| < \frac{m}{\log_2(m)}$ for all $i \in I$. Thus, there must exist a complete expanding sequence of agents (i_1, \dots, i_R) such that $R \geq \log_2(m)$.

It is easy to compute that, as $\Omega_{i_1}^m$ is nonempty, the following holds:³²

$$\frac{\{W^1 \subseteq \Omega_{i_1}^m : |W_{\rightarrow i_1}^1| = |W_{i_1 \rightarrow}^1|\}}{\{W^1 \subseteq \Omega_{i_1}^m\}} \leq \frac{1}{2}.$$

That is, the number of subsets of $\Omega_{i_1}^m$ that are ‘‘balanced for i_1 ’’ (i.e., such that i_1 is associated with the same number of buy and sell contracts) is at most half of the number of subsets of $\Omega_{i_1}^m$. We can also compute, taking any sequence W^1, \dots, W^{r-1} where $W^{r'}$ is chosen from $\Omega_{\{i_1, \dots, i_{r'}\}}^m$, that (recalling that (i_1, \dots, i_R) is an expanding sequence)

$$\frac{\{W^r \subseteq \Omega_{\{i_1, \dots, i_r\}}^m \setminus \Omega_{\{i_1, \dots, i_{r-1}\}}^m : |[\cup_{s=1}^r W^s]_{\rightarrow i_r}| = |[\cup_{s=1}^r W^s]_{i_r \rightarrow}|\}}{\{W^r \subseteq \Omega_{\{i_1, \dots, i_r\}}^m \setminus \Omega_{\{i_1, \dots, i_{r-1}\}}^m\}} \leq \frac{1}{2}.$$

That is, taking any sequence W^1, \dots, W^{r-1} where $W^{r'}$ is chosen from $\Omega_{\{i_1, \dots, i_{r'}\}}^m$, the number of subsets of $\Omega_{\{i_1, \dots, i_r\}}^m \setminus \Omega_{\{i_1, \dots, i_{r-1}\}}^m$ such that $\cup_{s=1}^r W^s$ is ‘‘balanced

³²This follows as we can compute $\{W^1 \subseteq \Omega_{i_1}^m : |W_{\rightarrow i_1}^1| = |W_{i_1 \rightarrow}^1|\}$ as the sum over

$$\sum_{n=0}^{|\Omega_{\rightarrow i_1}^m|} \binom{|\Omega_{\rightarrow i_1}^m|}{n} \binom{|\Omega_{i_1 \rightarrow}^m|}{n} = \binom{|\Omega_{i_1}^m|}{|\Omega_{\rightarrow i_1}^m|} \leq \binom{|\Omega_{i_1}^m|}{\lfloor \frac{|\Omega_{i_1}^m|}{2} \rfloor} \leq 2^{|\Omega_{i_1}^m| - 1}.$$

for i_r ” is at most half of the number of subsets of $\Omega_{\{i_1, \dots, i_r\}}^m \setminus \Omega_{\{i_1, \dots, i_{r-1}\}}^m$.

Using the preceding two observations, if we construct a set by choosing trades in this way along the complete expanding sequence, the overall probability that each agent i_r is “balanced” is bounded by

$$\left(\frac{1}{2}\right)^R.$$

Similarly, the overall probability that each agent i_r except one is “balanced” is bounded by

$$\binom{R}{1} \left(\frac{1}{2}\right)^{R-1}.$$

Finally, the overall probability that each agent i_r except for two is “balanced” is bounded by

$$\binom{R}{2} \left(\frac{1}{2}\right)^{R-2}.$$

Summing the three preceding expressions, we compute that the probability that a set of trades constructed by choosing each trade in Ω^m with probability $\frac{1}{2}$ is a chain is no more than

$$\left(\frac{1}{2}\right)^R + \binom{R}{1} \left(\frac{1}{2}\right)^{R-1} + \binom{R}{2} \left(\frac{1}{2}\right)^{R-2} \leq 4R^2 \left(\frac{1}{2}\right)^R.$$

Recalling that $R \geq \log_2(m)$, we have that $\frac{|\mathfrak{C}^m(Y)|}{|\mathfrak{B}^m(Y)|} = O\left(\frac{(\log_2(m))^2}{m}\right) \ll O\left(\frac{\sqrt{\log_2 m}}{\sqrt{m}}\right)$.