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ARBITRAGE-FREE LIMIT ORDER BOOKS AND THE PRICING OF ORDER FLOW RISK

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ABSTRACT

This paper builds on the landmark contribution of Glosten (1994) by treating the determination of limit order supply schedules as an exercise in asset pricing theory with the possible sizes of incoming market orders as the value-relevant states of nature, yielding an analogue of the Fundamental Theorem of Asset Pricing. State prices and price impact prove to be proportional to the slope of the book and simple nonparametric and semiparametric models for limit order book dynamics arise when the price of order flow risk is constant over time, providing a comprehensive and coherent framework for organizing limit order book data.

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1. Introduction

In a landmark paper, Glosten (1994) showed that bid and offer prices in limit order books prior to the arrival of a market order are lower and upper expectations, respectively, conditional on trade size because limit order traders confront the winner's curse. His reasoning is deceptively simple. The marginal share of an order that walks up (down) the book is worth more (less) to that market order trader than the inferior offers (bids) behind it (Glosten's Assumption 1). The marginal valuations of uninformed traders imply nothing about asset values *per se*, making for no relation between their trades and asset values. However, if asset values are increasing in the marginal valuations of traders with value relevant private information (Glosten's Assumption 2), asset values are increasing in the sizes of their market orders. If there is adverse selection risk in all market orders (Glosten's Assumption 3), uninformed competitive risk neutral limit order traders will post bids and offers at prices below and above, respectively, their estimates of asset values as a function of trade size. The upper and lower tail expectation formulas then obtain.

Glosten is careful not to simply assume that asset values are increasing in order size so as not to make assumptions about the endogenous choices of traders confronting an endogenous limit order supply schedule. Yet it is clearly a plausible assumption if there is adverse selection risk in all market orders or, put differently, there would appear to be relatively little distance between Glosten's Assumptions 1 and 2 and this hypothesis in some sense.¹ Even so, this view would represent, at most, a minor semantic distinction or a matter of taste were it not for the fact that there is a substantial analytical benefit to be derived from making a primitive assumption of the hypothesis that asset values are an increasing function of market order size.

The benefit is that the economics of liquidity supply in limit order markets becomes an asset pricing exercise. Market orders subject limit order traders to order flow risk – the value

implications of market orders that blow through their bids and offers – making the possible sizes of incoming market orders the relevant states of nature with asset values potentially differing state by state. Since the exchange of given share quantities at given prices is triggered by the market order state that eventuates, limit orders can be viewed as contingent claims written on order flow – in particular as digital option portfolios – as was argued in Lehmann (2006).² Hence, the entire apparatus of arbitrage-free contingent claims pricing can be brought to bear on the problem of determining limit order supply schedules and their properties.

The basic assumptions associated with the no-arbitrage approach to valuation must be adopted to invoke these tools. The definition of arbitrage itself is problematic because limit orders cannot be sold short but this problem can be finessed by replacing infeasible arbitrage with feasible limit order substitution. The required absence of frictions is more challenging: no impediments to free trade in limit orders involves the freedom to cancel and replace them before the next market order arrives until all limit traders are satisfied with their positions or, put simply, there are no stale limit orders. The final requirement is a deterministic mapping between asset payoffs and states of nature, the link between market order flow states and asset values.

The assumption that limit order traders can freely cancel and replace all orders prior to the arrival of the next market order is not an inconsequential one: stale limit orders pervade theories of limit order market dynamics. Traders arrive sequentially in such models and face different trading constraints and market conditions: see, for example, Foucault, Kadan, and Kandel (2005), Goettler, Parlour, and Rajan (2004, 2005, 2006a,b), Hollifield, Miller, and Sandås (1999, 2004), Hollifield, Miller, Sandås, and Slive (2002, 2006), Large (2006), Parlour (1998), Parlour and Seppi (2003), Rosu (2004), and Wei (2006). All but one – Goettler, Parlour,

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¹ See Rock (1990) and note 12 of Back and Baruch (2006) but see also note 6 of Glosten (1994).

and Rajan (2004) – assume that no trader possesses value relevant private information. All but one – Hollifield, Miller, and Sandås (2004) – restrict trade sizes to unity. All but one – Rosu (2004) – assume either infinite or nontrivial cancellation costs (and the equilibrium in his model is such that no cancellations take place).³ In all of these models, limit orders become stale and confront a nontrivial risk of being picked off for reasons not related to asymmetric information.

As Glosten noted, the assumption of a market order state/asset value mapping is awkward due to its endogeneity, involving the strategies of market order traders and the constraints placed on them by the economic environment. The characterization of such strategies and the resulting marginal asset valuations implicit in market order states is the heavy lifting in microstructure models. This situation is akin to using pure endowment economies to approximate general equilibria with production: they can only approximate production economies that produce *that* sequence of endowments, which might require implausible constraints on production. By the same token, the constraints on market order placement implicit in a given schedule linking asset values and order flow states might rule out economically relevant trading rules. That said, the relations assumed below are essentially arbitrary upward sloping ones, although restrictions are placed on their evolution over time in the analysis in Section 3.

In my view, the benefits associated with making this assumption far outweigh the costs because of the economic insights garnered by so doing. The first such reward is an easy analogue of the *Fundamental Theorem of Asset Pricing*, which delivers state prices for order flow states that define the price of order flow risk.⁴ State prices and price impact prove to be proportional to

² Treating bids and offers as options originated with Copeland and Galai (1983). They reasoned that the best bids and offers are like call and put options, respectively, with strike prices equal to the associated quotes, an analogy quite different from that in Lehmann (2006).

³ Foucault (1999) is a model of a limit order book with price dynamics but each trader can only submit one market order or one limit order that will be cancelled at the end of the period.

⁴ See Lehmann (2006) for an informal analysis that shows when the prices in a market for betting on market order sizes are the appropriate state prices implicit in a limit order book.

the slope of the book for economically intelligible reasons. Market completion via limit orders is like market completion with options in asset pricing theory as is the fact that any upward sloping limit order schedule can always be rationalized as an arbitrage-free limit order book.

When the price of order flow risk is constant, limit order book dynamics have a simple structure. If all information arrives via order flow, state prices along with the asset value/order flow state and limit order schedules do not change over time but rather are recentered around cumulative net order flow after a trade. Alternatively, if there are zero (conditional risk neutral) mean shifts in the mapping between asset values and order flow states, limit order books and their slopes change unpredictably (in a risk neutral sense) for economically plausible reasons, save for a mechanical adjustment for the replenishment of the book. Moreover, the books in these settings prove to be somewhat bluff-proof in the sense of Black (1990) and can have nonlinear price impact functions, in contrast to the linearity of price impact in the arbitrage-free batch auction markets studied by Huberman and Stanzl (2004).⁵

The result is a comprehensive and coherent framework for organizing limit order book data. Price impact is such that the midquote after a trade is roughly equal to the asset value in that order flow state when all information arrives via order flow, permitting recovery of the asset value/order flow state relation without functional form assumptions. In contrast, both published analyses of the Glosten model, Sandås (2001) and de Jong et al. (1996), assume that this relation is linear and that the distribution of market order sizes is exponential. If, instead, this schedule shifts unpredictably in the risk neutral measure, the price of order flow risk follows an otherwise unconstrained (save for smoothness assumptions) semiparametric regression model when certain risk neutral expectations can be replaced by ones in the empirical measure. In either setting, the theoretical structure of arbitrage-free limit order books closely parallels its empirical counterpart.

The remainder of the paper is organized as follows. The next section proves an analogue of the *Fundamental Theorem of Asset Pricing* for limit order markets and discusses a number of its implications. The two subsequent sections are devoted to theoretical and empirical implications, respectively, of the hypotheses that all information does or does not arrive via order flow when the price of order flow risk is constant. The last section provides a brief conclusion.

2. The Nature of Arbitrage-Free Limit Order Books

The hypothesis that a market is arbitrage-free has proven to be a powerful source of restrictions on asset prices. There are five elements associated with the no-arbitrage approach to valuation: (1) the mapping between asset payoffs and underlying states of nature, (2) agreement on the possible, (3) the absence of frictions, (4) the definition of arbitrage, and (5) the resulting set of state prices compatible with asset prices and payoffs. In its usual formulation, the absence of both frictions and zero net investment portfolios that have no risk of loss and a positive probability of a positive payoff insures the existence of strictly positive state prices, not necessarily unique, that correctly value all assets in a given market.

This formulation of the no-arbitrage framework cannot be translated directly to the limit order market setting for obvious reasons. The concept of arbitrage must be amended to deal with the inability to sell limit buy and sell orders short and, hence, to potentially earn arbitrage profits. Market frictions that may be unimportant on the time scales of asset pricing tend are much more important on microstructure time scales. The states of nature in question are asset values in different order flow states, which are hardly observable quantities.

Fortunately, these difficulties prove to be far from insuperable. This section is devoted to the explication of a theory of arbitrage in limit order markets predicated on order substitution by

⁵ Price impact is linear in Glosten (1994) only in special cases, although curvature need not be pronounced. Nonlinear price impact also arises in the model studied by Rosu (2004).

limit order traders. The analysis yields analogues of the main implications of the absence of arbitrage in asset pricing theory: the existence of strictly positive state prices on which valuation can be based, which occupies the next subsection, and the incentive to create contingent claims that complete markets, which may be found in the second subsection.

A. The Pricing of Order Flow Risk in Arbitrage-Free Limit Order Books

A key ingredient of the analysis is the presumption that some market participants – the ones who determine the marginal behavior of the book – are active, perfectly competitive limit order traders. In order for their actual and potential trades to be marginal ones, their ability to earn arbitrage profits must not be affected by taxes, transactions costs, indivisibilities, and related market frictions. Taxes need not be a major issue if potential pre-tax arbitrage opportunities also represent after-tax arbitrages. For professional traders, transactions costs are largely a fixed cost of market participation amortized over many trades in many securities. Finally, indivisibilities are not important if a round lot represents a "small" trade, which is the case in liquid markets almost by definition. These frictions can probably be safely ignored.⁶

The related problems of short sales constraints and the nature of arbitrage opportunities are more nettlesome. Limit orders cannot be sold short, leaving no natural analogues of zero net investment portfolios or arbitrage profits. However, the payoff of a zero net investment portfolio always has a second interpretation: the payoff from a marginal change in an existing portfolio that is long all of the assets under consideration. The analogue in a limit order market involves the substitution possibilities available to traders: the ability to cancel and replace limit orders on the supply side and the possibility of breaking up market orders on the demand side. How these prospects affect the pricing of order flow risk depends, in turn, on the precise details of how and

⁶ In addition, the riskless rate is set to zero since it is a second order concern over (most) microstructure time scales. Alternatively, the numeraire can be taken to be a savings account.

when market participants can access the limit order book. That is, the set of allowable trading strategies is a crucial element of the analysis of arbitrage-free limit order books.

The mapping between order flow states and the value of the asset is the other problematic aspect of the analysis of arbitrage-free limit order books. In the usual setting, one can always distinguish states of nature by payoff patterns, with two states being different if the payoff on at least one asset differs across the two states. There might be thorny analytical issues arising from the treatment of endogenous quantities like future prices as states of the world but asset payoffs are observables and can be treated as defining the relevant states of nature for many purposes despite their endogeneity. In contradistinction, the value of an asset in a given order flow state is not observable, making the identification of asset values with order flow states problematic.

Nevertheless, the first assumption is that traders perceive a link between the size of an incoming market order and the value of the asset in question, the reasonableness of which will be discussed in different information environments in the next section. In particular:

Assumption 1: Let $V_t(q)$ denote the asset value if a market order of size q arrives at time t. $V_t(q)$ is strictly increasing in q and is common knowledge among market participants. This combination of Assumption 2 and Lemma 2 of Glosten (1994) is stronger than necessary: most of the results obtain if $V_t(q)$ is non-decreasing in q and if $V_t(q') > V_t(q)$ for some q' > q. There is no presumption that these values are objective or rational ones, although their evolution must follow Bayes' rule or else arbitrage opportunities will crop up. Finally, it is worth emphasizing that such mappings pervade market microstructure theory: no expectation of future asset values given current market conditions can be computed without them.

Now consider a limit order market for a single asset in which market orders of size Q_t are executed against standing limit orders. Market order sizes are random variables taking

values in some set $\mathbb{Q}_t \subseteq \mathbb{R} \setminus 0$, a countable set if there is a minimum lot size, where Q_t is positive for market buy and limit sell orders and negative for market sell and limit buy orders. The book has no minimum tick and has a marginal price schedule $P_t(q) \in \mathbb{P}_t \subseteq \mathbb{R}^+$ where q is the cumulative volume up to that quantity. Due to the absence of a minimum tick and the presence of adverse selection at all tiers of the book, there will be an order for at most one lot at any price in a minimum lot size market and no "atoms" – that is, there are orders for only infinitesimal quantities – if there is no minimum lot size. The absence of a minimum tick also obviates the need for secondary priority rules, about which a bit more will be said at the end of this subsection.

Hence, the overall cost of a market order for Q_t shares is $\int_0^{Q_t} P_t(q) dq$. That is, it walks up or down the book unless it exhausts the depth in the book, which is a summation in a minimum lot size market. Put differently, dq is Lebesgue notation, making it equal to 1 (-1) for market buy (sell) orders in a minimum lot size market. Limit orders are placed before time t and so $P_t(q) \in \mathcal{T}_{t-1}$ where \mathcal{T}_{t-1} is public information available before time t. More formally, $P_t(q)$ and Q_t are defined on a common probability space $(\Omega, \mathcal{T}, \mathcal{P})$ with $P_t(q), Q_{t-1} \in \mathcal{T}_{t-1}$ where $\mathcal{T}_1, \mathcal{T}_2, \dots, \mathcal{T}_{t-1}, \mathcal{T}_t$ is a sequence of σ -fields belonging to \mathcal{T} such that $\mathcal{T}_{t-1} \subset \mathcal{T}_t$.

The analysis requires a second assumption, one that is almost, but not quite, an implication of Assumption 1: $P_t(q) > V_t(q)$ for q > 0 and $P_t(q) < V_t(q)$ for q < 0. Such a condition is unnecessary if limit order traders are unwilling to lose money on limit orders but nothing in Assumption 1 prevents a liquidity trader from choosing to incur such a loss. Such private sources of value in limit orders are assumed away in:

Assumption 2: $\operatorname{sgn}_{\mathfrak{a}}[P_t(q) - V_t(q)] > 0 \ \forall q \in \mathbb{Q}_t$, where sgn_x is the sign of its argument.

The structure of the inequality serves to accommodate buy and sell orders in one expression.⁷

Sufficiently free trade in this limit order market arises when limit order traders have preferential access to the book. In particular, suppose they can "lock" the market, preventing the arrival of market orders while they cancel and replace their limit orders. In other words:

Assumption 3: A market order can only arrive and be executed against the book after all limit order traders are satisfied with their order placements.

This possibility arises, for example, if market orders arrive according to a continuous time jump process, giving limit order traders time to refresh the book.⁸ The ability of traders to swap limit orders is a *de facto* substitute for the absence of *de jure* arbitrage trading in this setting.

There is one trade size that is not in \mathbb{Q}_t that merits special mention: $\mathbf{Q}_t = 0$. It is natural to interpret this "null trade" as the arrival of non-trade-related information.⁹ In the present setting, information arrival restarts the tatônnement-like process during which limit order traders can freely cancel and submit orders, making it possible for their orders to dynamically complete the market for order flow contingent claims. This issue will occupy the next subsection.

Now consider swapping an order at tier q of the book for one at the next tier – that is, at $q + sgn_q dq$, again to accommodate both purchases and sales in one expression. $V_t(q)$ is strictly increasing at q and price priority insures that the book is upward sloping, which, taken together, imply that $P_t(q + sgn_q dq) - P_t(q)$ and $P_t(q + sgn_q dq) - V_t(q)$ have the same sign and so:

$$P_t(q + \operatorname{sgn}_q dq) - P_t(q) = \lambda_t(q) [P_t(q + \operatorname{sgn}_q dq) - V_t(q)] \ \forall \ q \in \mathbb{Q}_t$$
(1)

⁷ I am grateful to Shmuel Baruch for insisting on the need for some such assumption. It can be dispensed with if other limit order traders can submit marketable limit orders to exploit any overpriced buy orders or underpriced sell orders (i.e., those for which $sgn_a[P_t(q) - V_t(q)] < 0$).

⁸ Back and Baruch (2004) take this approach in their comparison of limit order books with their continuous time version of the Glosten-Milgrom model. Most purely statistical limit order book models assume that market order arrivals follow a continuous time jump process.

⁹ See Lehmann (2006) for a detailed analysis of the role of null trades in this setting.

with $\lambda_t(q) > 0$. Rearranging this expression bounds $\lambda_t(q)$ from above since:

$$\mathbf{P}_{t}(\mathbf{q}) = \lambda_{t}(\mathbf{q})\mathbf{V}_{t}(\mathbf{q}) + [1 - \lambda_{t}(\mathbf{q})]\mathbf{P}_{t}(\mathbf{q} + \mathbf{sgn}_{\mathbf{q}}\,\mathbf{dq})$$
(2)

implies that:

$$P_{t}(q) - V_{t}(q) = [\lambda_{t}(q) - 1]V_{t}(q) + [1 - \lambda_{t}(q)]P_{t}(q + sgn_{q} dq)$$

= $[1 - \lambda_{t}(q)][P_{t}(q + sgn_{q} dq) - V_{t}(q)]$ (3)

and, with it, $\lambda_t(q) < 1$ since both differences have the same sign.

By the same token, suppose that limit order prices satisfy the linear pricing rule (2) with $0 < \lambda_t(q) < 1$. Then (3) and $\lambda_t(q) < 1$ imply that the limit order book is upward sloping and that $P_t(q) - V_t(q)$ and $P_t(q + sgn_q dq) - V_t(q)$ have the same sign. Similarly, (1) coupled with $\lambda_t(q) > 0$ imply that $P_t(q + sgn_q dq) - P_t(q)$ and $P_t(q + sgn_q dq) - V_t(q)$ also have the same sign and thus $P_t(q) > V_t(q)$ for q > 0 while $P_t(q) < V_t(q)$ for q < 0. That is, there are no arbitrage opportunities if and only if limit order prices satisfy the linear pricing rule (2).

The constants $\{\lambda_t(q): 1 > \lambda_t(q) > 0, \lambda_t(q) \in \mathscr{T}_{t-1}, q \in \mathbb{Q}_t\}$ are, in turn, supported by risk neutral probabilities $\psi_t(q) = \Pr[Q_t = q | \mathscr{F}_{t-1}]$ for each possible market order size conditional only on \mathscr{F}_{t-1} , which are state prices due to the riskless rate normalization. There are two possible states at tier q of the book: the market order is for exactly q shares or for more than q shares. Hence, these constants are conditional probabilities that are given by:

$$\lambda_{t}(q) = \Pr\left[Q_{t} = q \middle| \operatorname{sgn}_{q} \times Q_{t} \ge |q|, \mathscr{F}_{t-1}\right] = \frac{\psi_{t}(q)}{\int_{\operatorname{sgn}_{q} u \ge |q|} \psi_{t}(u) du}$$
(4)

which are termed hazard functions in survival analysis.

Iterating (2) forward using (4) reveals that arbitrage-free marginal price schedules satisfy:

$$P_{t}(q) = \frac{\psi_{t}(q)}{\int_{\text{sgn}_{q}u \ge |q|} \psi_{t}(u) du} V_{t}(q) + \left[1 - \frac{\psi_{t}(q)}{\int_{\text{sgn}_{q}u \ge |q|} \psi_{t}(u) du} \right] P_{t}(q + \text{sgn}_{q} dq)$$

$$= \frac{\int_{\text{sgn}_{q}u \ge |q|} \psi_{t}(u) V_{t}(u) du}{\int_{\text{sgn}_{q}u \ge |q|} \psi_{t}(u) du} = \frac{E[\tilde{V}1_{\text{sgn}_{q}Q_{t} \ge |q|} |\mathscr{T}_{t-1}]}{E[1_{\text{sgn}_{q}Q_{t} \ge |q|} |\mathscr{T}_{t-1}]} = E_{\psi}[\tilde{V} | \text{sgn}_{q}Q_{t} \ge |q|, \mathscr{T}_{t-1}]$$
(5)

as in Glosten (1994) with risk neutral probabilities $\psi_t(q)$ replacing the actual ones in his paper and where \tilde{V} is the random value of the asset on some future date. That is, offers are upper tail expectations $E_{\psi}[\tilde{V}|Q_t \ge q > 0, \mathcal{T}_{t-1}]$ and bids are lower tail expectations $E_{\psi}[\tilde{V}|Q_t \le q < 0, \mathcal{T}_{t-1}]$.¹⁰

Accordingly, arbitrage-free limit order books satisfy the following proposition.

Proposition 1: If Assumptions 1 - 3 hold, there is a positive pricing rule supported by a set of unique state prices $\psi_t(q) > 0 \forall q \in \mathbb{Q}_t$ if and only if there are no arbitrage opportunities.¹¹

Implicit in this theorem is a striking observation, one with an exact parallel in the usual analysis of arbitrage-free markets: any upward sloping marginal price schedule can always be rationalized as being arbitrage-free in the sense of Proposition 1.¹² Ross (1976) showed that arbitrage-free asset prices can always be rationalized as the outcome of utility maximization by a

¹⁰ As Glosten emphasizes, the form of (5) reflects the discriminatory nature of the book. In contrast, $P_t(q) = E_{\psi}[\tilde{V} | Q_t = q, \mathscr{F}_{t-1}]$ is the schedule in a nondiscriminatory book. Most markets open with a single price auction in which market orders are aggregated into a single net order and executed against the book at the same price. The next auction price can be treated as the "liquidating" asset value \tilde{V} embedded in the expectations $V_t(q) = E_{\psi}[\tilde{V} | Q_t = q, \mathscr{F}_{t-1}]$.

¹¹ Uniqueness follows from the self-referential definition of states; see recursions (8) - (10) below. See the next subsection for economic reasons to expect dynamic spanning to obtain. ¹² Both are versions of the Sonnenschein, Debreu, Mantel Theorem (see Greene, Mas-Collell, and Whinston (1995)), the notion that the hypothesis that an economy is in competitive equilibrium is vacuous in a particular sense: any set of downward sloping aggregate excess demand curves is consistent with utility maximization by a consumer whose utility function satisfies the weak axiom of revealed preference. Ross noted that the version for arbitrage-free markets need only hold at the point of zero excess demand, not over entire excess demand schedules, where state prices per unit probability equal indirect marginal utilities of wealth. Fictitious state dependent preferences can always be fabricated to produce any such numbers.

hypothetical investor with rational expectations and state dependent preferences. As long as the book is upward sloping, the analysis leading from (1) to (5) makes it clear that any marginal price schedule can be produced by a suitably fabricated asset value/order flow state relation. Just as a positive asset pricing theory is really a theory of the functional form of investor preferences in this sense, so is a positive theory of limit order prices a theory of the functional form of the $V_t(q)$ mapping. There is no need to leave this framework unless one finds any implications for this mapping or the values of the associated state prices to be economically implausible.

The idea that limit orders are order flow derivatives explains why Proposition 1 is a close cousin of the *Fundamental Theorem of Asset Pricing*. Lehmann (2006) noted that a limit buy (sell) order for X_t shares involves receipt (expenditure) of P_tX_t dollars in exchange for (delivery of) X_t shares. In the language of exotic options markets, the first payoff is that of X_t cash-ornothing digital calls struck at P_t and the second is that on X_t asset-or-nothing digital calls struck at P_t and the second is that on X_t asset-or-nothing digital calls struck at P_t as well. Since a transaction only occurs at price $P_t(q)$ when a market order is large enough (i.e., when $sgn_qQ_t \ge |q|$), one can view these implicit derivatives as digital options on order flow.

Moreover, the values of these implicit cash-or-nothing and asset-or-nothing digital call options must be equal since limit order transactions are voluntary. The value of the cash-or-nothing digital option that pays a dollar when $sgn_qQ_t \ge |q|$ is:

$$E_{\psi}[1_{\text{sgn}_{q}Q_{t} \ge |q|}P_{t}(q) | \mathscr{F}_{t-1}] = P_{t}(q) \int_{\text{sgn}_{q}u \ge |q|} \psi_{t}(u) du$$
(6)

while that of the asset-or-nothing digital option for one share that pays off in the same states is:

$$\mathbf{E}_{\psi}\left[\int_{\mathrm{sgn}_{q} u \ge |q|} \mathbf{1}_{Q_{t}=u} \mathbf{V}_{t}(u) \mathrm{d}u \,|\, \mathcal{F}_{t-1}\right] = \int_{\mathrm{sgn}_{q} u \ge |q|} \psi_{t}(u) \mathbf{V}_{t}(u) \mathrm{d}u \tag{7}$$

Equating the values of these implicit options yields (5).

Now the replicating portfolio for a digital call (put) is a bull (bear) spread in conventional

calls (puts) with an infinitesimal spread between the strike prices. The replicating portfolio for a spread in digital calls (puts) is a spread in bull (bear) spreads in conventional calls (puts), that is, a butterfly spread. Breeden and Litzenberger (1978) showed that the payoff on a butterfly is proportional to that of a pure Arrow-Debreu claim that pays off only when the asset price on expiration equals the intermediate strike price. By this reasoning, the slope of the book is a spread in the digital options implicit in limit orders and, hence, its payoff is proportional to the relevant state price or risk neutral probability. Treating limit orders as portfolios of order flow derivatives delivers new insights into the role of the slope of the limit order book.

More precisely, rearranging (4) and (5) reveals that the risk neutral probabilities $\psi_t(q)$ can be recovered via the recursion:

$$\psi_{t}(q) = \frac{P_{t}(q + sgn_{q} dq) - P_{t}(q)}{P_{t}(q) - V_{t}(q)} \int_{gn_{q} u \ge |q|} \psi_{t}(u) du$$

$$= \frac{P_{t}(q + sgn_{q} dq) - P_{t}(q)}{P_{t}(q) - V_{t}(q)} \{ 1_{q < 0} \Psi_{t}(q) + 1_{q > 0} [1 - \Psi_{t}(q)] \}$$

$$\rightarrow \frac{P_{t}'(q)}{P_{t}(q) - V_{t}(q)} \{ 1_{q < 0} \Psi_{t}(q) + 1_{q > 0} [1 - \Psi_{t}(q)] \}$$
(8)

in the no-minimum lot size limit where $\Psi_t(q)$ is the cumulative risk neutral distribution function evaluated at q.¹³ It will be convenient in what follows to abuse notation slightly and let $P'_t(q)$ also denote the first difference $P_t(q + \text{sgn}_q dq) - P_t(q)$ when there is a minimum lot size since (8) then covers both limit buy and sell orders in both discrete and continuous order size markets. Note also that state prices can be recovered from risk neutral hazard functions via:

¹³ The first line of (8) on the offer side of the book is identical to the expression for state prices in Banz and Miller (1978) for conventional options with the option price set to zero, the underlying asset value set to $V_t(q)$, and the strike price set to $P_t(q)$. This makes sense since the limit order is a portfolio of two options that requires no initial investment. Note that the last line of (8) can be obtained by differentiating (5) and applying Leibniz's rule.

$$\psi_{t}(q) = \lambda_{t}(q) \prod_{u=sgn_{q}}^{q-sgn_{q}} [1 - \lambda_{t}(u)] \{1_{q<0} \Psi_{t}(-dq) + 1_{q>0} [1 - \Psi_{t}(-dq)] \}$$

$$\rightarrow \psi_{t}(q) = \lambda_{t}(q) \exp - \int_{0}^{q} \lambda_{t}(u) du \{1_{q<0} \Psi_{t}(0) + 1_{q>0} [1 - \Psi_{t}(0)] \}$$
(9)

in the no minimum lot size limit, this last being familiar from survival analysis as well, where the risk neutral expected price must equal the corresponding expected asset value, implying that:

$$0 = \int \psi_{t}(u) [P_{t}(u) - V_{t}(u)] du \equiv \int \{1_{q<0} \Psi_{t}(-dq) + 1_{q>0} [1 - \Psi_{t}(-dq)] \} \phi_{t}(u) [P_{t}(u) - V_{t}(u)] du$$

$$\Rightarrow \Psi_{t}(-dq) = \frac{\int_{u>0} \phi_{t}(u) [P_{t}(u) - V_{t}(u)] du}{\int_{u>0} \phi_{t}(u) [P_{t}(u) - V_{t}(u)] du - \int_{u<0} \phi_{t}(u) [P_{t}(u) - V_{t}(u)] du}$$
(10)

where $\phi_t(q) = \lambda_t(q) \prod_{u=\text{sgn}_q}^{q-\text{sgn}_q} [1 - \lambda_t(u)] \rightarrow \lambda_t(q) \exp - \int_0^q \lambda_t(u) du$.¹⁴

The slope of the book at the marginal trade of a market order plays a crucial role in its price impact. The value of the asset immediately after the arrival of a market order of size Q_{t-1} is given by $V_{t-1}(Q_{t-1})$ while the asset value immediately before the arrival of the next one is:

$$P_{t}(0) = E_{\psi}[\tilde{V} | \mathscr{F}_{t-1}] \equiv E_{\psi}[\tilde{V} | \mathscr{F}_{t-1}] - E_{\psi}[\tilde{V} | Q_{t-1}, \mathscr{F}_{t-2}] + E_{\psi}[\tilde{V} | Q_{t-1}, \mathscr{F}_{t-2}]$$

$$\equiv V_{t-1}(Q_{t-1}) + E_{\psi}[\tilde{V} | \mathscr{F}_{t-1}] - E_{\psi}[\tilde{V} | Q_{t-1}, \mathscr{F}_{t-2}]$$

$$\equiv V_{t-1}(Q_{t-1}) + v_{t}(0); E_{\psi}[v_{t}(0) | Q_{t-1}, \mathscr{F}_{t-2}] = 0$$
(11)

since $v_t(0)$ is a risk neutral martingale increment by the law of iterated expectations and $P_t(0)$ is the midquote if the small trade spread is small and a risk-neutral-probability-weighted average of the best bid and offer in general (see 3A below). The slope of the book is given by:

$$\mathbf{P}'_{t}(\mathbf{q}) = \lambda_{t}(\mathbf{q})[\mathbf{P}_{t}(\mathbf{q} + \mathbf{sgn}_{q} \, \mathbf{dq}) - \mathbf{V}_{t}(\mathbf{q})]$$
(12)

after manipulation of (8) which, coupled with (11), yields the risk neutral regression relation:

$$P_{t}(0) = P_{t-1}(Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq) - \frac{P_{t-1}'(Q_{t-1})}{\lambda_{t-1}(Q_{t-1})} + v_{t}(0)$$
(13)

in which the inverse of the risk neutral hazard function $\lambda_{t-1}(Q_{t-1})$ is the slope coefficient.

In the parlance of Huberman and Stanzl's (2004) analysis of batch auction markets, (13) combines a price update and impact function, equations (2) in their paper. They are generally distinct in their setting because orders are submitted before the demands of other traders and, hence, market clearing prices are known. The price impact function is $P_t(q)$ in a limit order market, a known function of the size of the next market order. More will be said about the links between equations (11) and (13) and their batch auction relatives in Section 3D below.

Finally, a comment is in order regarding the impact of secondary priority rules on (5) when there is a binding minimum tick. In one sense, the answer is "not much": the Appendix shows that the form of the pricing relation is unchanged. Limit order substitution insures that depth at each tier is governed by the priority rule: the marginal order earns no rents under strict priority rules while the marginal order insures that no order earns rents under symmetric rules.¹⁵

The problem is that the implicitness of depth determination makes for no clear relation between the fraction of depth exhausted in the marginal tier and state prices or price impact as codified in (8) through (13). One cannot answer the most basic question about the book: how would it be refreshed if no information arrived except for that implicit in a given trade? The answer to such questions is central to the analysis of price dynamics in the next section and so minimum price variation will be assumed away in what follows. One fig leaf for such an assumption is the fact that tick sizes have become quite small in most but not all markets.¹⁶

B. Spanning and Completeness in Arbitrage-Free Limit Order Books

One natural question is whether this market should be thought of as one in which all possible order flow states are spanned. Put differently, might limit order traders leave "holes" in arbitrage-free limit order books? Clearly, limit order traders might be unwilling to incur the

¹⁴ See part i of Proposition 3 of Glosten (1994).

¹⁵ The reasoning in the Appendix applies in both the discrete and continuous order size cases.

adverse selection risk in very large orders – one reason why block trading markets are not completely anonymous – but such considerations merely make \mathbb{Q}_t bounded. Should we expect traders to post limit orders at all possible market order sizes within any such bounds?

Limit order books cannot have holes given unfettered limit order substitution.¹⁷ To be precise, a hole between q" and q' with $V_t(q'') < V_t(q')$ when a marginal price function jumps from $P_t(q'')$ to $P_t(q')$ when there are feasible trade sizes q with q" < q < q' at which no orders are posted. The trader with the last order in the queue at $P_t(q'')$ in front of the hole has every reason to cancel it and replace it with one at any price between $P_t(q'')$ and $P_t(q')$ as long as the execution probability is unchanged.¹⁸ If there were no further changes in the book, the revised order dominates the original one due to its unambiguously higher price and identical execution probability, making this trader better off if the order executes and no worse off if it doesn't. If one trader wants to swap positions in this fashion, all will want to do so until they are satisfied at the margin with their positions between tiers q" and q' of the book. This tatônnement-like process would continue until the hole in the book was filled in. Once again, the ability to cancel and replace limit orders is a perfect substitute for explicit arbitrage.

A related question is whether $P_t(q)$ will be continuous between q" and q' if orders can be broken up arbitrarily finely. Clearly, continuity cannot obtain if $V_t(q)$ is discontinuous so assume it is continuous between q" and q'. If there was a jump at q between $P_t(q")$ and $P_t(q')$, the trader with the order at $P_t(q)$ could cancel and repost at a slightly higher price, which would once again yield a higher payoff with the same execution probability if the book was opened up right after the new order was submitted. Since the book is closed during the tatônnement-like

¹⁷ See Rosu (2004) for an analysis in a related setting in which traders arrive sequentially and choose both the hole and the price point in which to place a single limit order for a single share. ¹⁸ This argument requires the existence of only one such price and quantity.

¹⁶ A counterexample is the Tokyo Stock Exchange with a minimum tick as high as 1%.

adjustment process, the book would be filled in until $P_t(q)$ was continuous between q'' and q'.

More formally, limit order markets are complete in the following sense.

Proposition 2: Under the assumptions of Proposition 1, the limit order book spans \mathbb{Q}_t if there are no arbitrage opportunities. Moreover, the marginal price schedule is continuous in q at any $q \neq 0$ if $V_t(q)$ is continuous and if there are no indivisibilities in market order sizes.

This implication is clearly counterfactual: actual limit order books typically have holes and spreads are often wider than the minimum tick. It is hard to decide whether the assumption of a tatônnement-like process that ensures rapid replenishment of the book or of the existence of the $V_t(q)$ schedule is the most likely culprit. It is equally hard to assess *a priori* what manner of deviations from the theory would be sufficiently significant economically so as to affect limit order valuation. This issue will be addressed to some extent in the penultimate section.

All of these results illustrate both the strengths and weaknesses of the present approach. The great strength is the simple arithmetic of natural cancel-and-replace strategies along the slope of the book. The great weakness is the stringent requirement that no market order can arrive while traders adjust their limit order portfolios, an assumption that flies in the face of the common concern that limit orders require costly monitoring. This assumption would appear to be particularly implausible with respect to spanning in a market with no (or with a small) minimum tick since we do observe holes in real world limit order books. Fortunately, these market access assumptions, at least, prove to be far more reasonable than it would at first appear.

3. Limit Order Book Dynamics

The analysis in the previous section established that arbitrage-free limit order books are a lot like arbitrage-free markets in general. That is, there is a positive linear pricing operator underlying the marginal price schedule that is supported by strictly positive state prices. Moreover, the economic incentive to complete markets with options in conventional markets provides the same motive for posting orders that span possible market order states. All of this is reasonably straightforward once one equates states of nature in limit order markets with the possible sizes of incoming market orders and arbitrage with unfettered limit order substitution.

This section is devoted to a search for additional restrictions on the evolution of limit order books over time. To be sure, the analysis in the last section involved dynamics due to the conditioning of risk neutral probabilities on the generic public information set \mathscr{T}_t and in light of the updating relations (13). More can be had, however, by imposing natural assumptions that yield market settings that are perhaps best described as ones in which the price of order flow risk provides market order traders with a clear disincentive to engage the practice of order splitting.¹⁹

The four subsections that follow are devoted to some of the economics of such market environments and some of their implications. The next two subsections describe two such settings: one in which both order-flow-dependent asset values and state prices depend only on cumulative signed order flow and another in which only state prices have this property. The penultimate subsection discusses whether bluffing – what Black (1990) termed intentional noise trading – will be undertaken by rational risk-averse uninformed traders in these settings. The last subsection briefly compares and contrasts the arbitrage-free limit order markets studied here with Huberman and Stanzl's (2004) analysis of arbitrage-free batch auction markets.

A. Limit Order Book Sequences When All Information Is Trade-related

Consider a continuous order size market and suppose a market order to buy Q_{t-1} shares arrives at time t–1. If the order does not exhaust the depth on the buy side, it will walk up the marginal price schedule until it reaches $P_{t-1}(Q_{t-1})$. The post-trade asset value will be $V_{t-1}(Q_{t-1})$.

What will the new marginal price schedule $P_t(q)$ be if no additional information arrives?

¹⁹ Alternatively, all price impact is permanent in these settings. Obizhaeva and Wang (2006) study order splitting with mean-reverting books and (mostly) linear price impact functions.

The largest unexecuted offer – the one at $P_{t-1}(Q_{t-1})$ – will be the new best ask $P_t(0^+) = \lim_{q \to 0} P_t(q)$ while the original best bid $P_{t-1}(0^-) = \lim_{q \to 0} P_{t-1}(q)$ will be Q_{t-1} shares from the new best bid since it would take a market order that size to reach it. In fact, this reasoning applies to all of the unexecuted orders in the time t–1 book and so:

$$P_{t}(q) = P_{t-1}(q + Q_{t-1}) \mathbf{1}_{q \notin BF(Q_{t-1})}$$
(14)

for $q \notin BF(Q_{t-1})$ where $BF(Q_{t-1}) = (0, Q_{t-1}]$ is the portion of the book that is backfilled.²⁰

This is so because order flow state prices and values are essentially unchanged when no additional information hits the market save for the arrival and execution of this market order. The word *essentially* reflects the fact that the new state prices and values for $q \notin BF(Q_{t-1})$ are:

$$V_{t}(q) = V_{t-1}(q + Q_{t-1})$$

$$\psi_{t}(q) = \psi_{t-1}(q + Q_{t-1})$$
(15)

or, in other words, they are translated by the size of the market order Q_{t-1} . The reason why is straightforward: from the perspective of limit order traders, the risk that a market order for Q_{t-1} shares at time t–1 will be followed by one for q lots at time t is identical to the risk that a market order of size $q + Q_{t-1}$ will arrive at time t–1 under this restriction on market information flows.

The only remaining question is how limit order traders will backfill the portion of the book that was cleared out by the market order, the new bid prices at which they will be willing to buy up to Q_{t-1} shares,. The order flow risk confronting these orders has changed: the original risk came from a market buy order but the new risk is that a market sell order will arrive. A straightforward calculation in the Appendix shows that these new best bids are given by:

²⁰ Glosten (1994) observed that such orders need not be cancelled after a market order execution.

$$P_{t}(q) = \frac{\Psi_{t-1}(0)P_{t-1}(0^{-}) + [1 - \Psi_{t-1}(0)]P_{t-1}(0^{+}) - [1 - \Psi_{t-1}(q + Q_{t-1})]P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})}$$

$$\equiv \frac{P_{t-1}(0) - [1 - \Psi_{t-1}(q + Q_{t-1})]P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})} \forall q \in BF(Q_{t-1})$$
(16)

where $P_{t-1}(0)$ will be close to the midquote if the small trade spread is small.²¹

As is readily apparent, the backfilled best bids are weighted averages of the prior best bids and offers along with the prior offer at $q + Q_{t-1}$ shares. This makes perfect sense: appropriately scaled, P_{t-1} (0⁻) inserts the portion of the lower tail expectation below $-Q_{t-1}$ into these new best bids, P_{t-1} (0⁺) puts the entire upper tail expectation into them, and subtraction of $[1 - \Psi_{t-1}(q + Q_{t-1})]P_{t-1}(q + Q_{t-1})$ completes the conversion of prior best offers into new best bids. That is, the new best bids equal the unconditional expected asset value before the next market order arrives less the right amount of the appropriate prior best offer.

Taken together, (14) and (16) paint a simple picture of the impact of this trade in these circumstances. Combining them and adding and subtracting $P_{t-1}(q+Q_{t-1})I_{q\in BF(Q_{t-1})}$ yields:

$$P_{t}(q) = P_{t-1}(q + Q_{t-1})l_{q \notin BF(Q_{t-1})} + P_{t-1}(q + Q_{t-1})l_{q \in BF(Q_{t-1})} - \frac{P_{t-1}(0) - [1 - \Psi_{t-1}(q + Q_{t-1})]P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})}l_{q \in BF(Q_{t-1})} - P_{t-1}(q + Q_{t-1})l_{q \in BF(Q_{t-1})} = P_{t-1}(q + Q_{t-1}) - \frac{P_{t-1}(0) - P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})}l_{q \in BF(Q_{t-1})}$$
(17)

and the obvious symmetry implies that $P_t(q)$ is given by:

$$P_{t}(q) = P_{t-1}(q+Q_{t-1}) - \frac{P_{t-1}(0) - P_{t-1}(q+Q_{t-1})}{\Psi_{t-1}(q+Q_{t-1})l_{Q_{t-1}>0} + [1 - \Psi_{t-1}(q+Q_{t-1})]l_{Q_{t-1}<0}}l_{q\in BF(Q_{t-1})}$$
(18)

after either a market buy or sell order. That is, the new marginal price equals the translated old one plus a simple backfilling adjustment for the part of the book cleared out by the market order. While the basic structure is the same, the minimum lot size case is a bit messier because a discontinuity at zero arises when order flow states go from -1 lot to 1 lot. A tedious calculation in the Appendix shows that the variant of (18) that applies to both purchases and sales in both the absence and presence of a minimum lot size is given by:

$$P_{t}(q) = P_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) + \frac{P_{t-1}(0) - P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{1_{Q_{t-1} > 0} - sgn_{Q_{t-1}} \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} + \Phi(q, Q_{t-1}) 1_{q \in BF(Q_{t-1})}$$
(19)

where $BF(Q_{t-1}) = [sgn_{Q_{t-1}}, Q_{t-1}]$ in the discrete case. The first two terms are identical to (18) if there is no minimum lot size while the discontinuity at zero requires both incrementing the indices in the second term by $sgn_{Q_{t-1}} dq$ and the endpoint adjustment in the last term in the minimum lot size case. Note also that the corresponding state prices and values are given by:

$$V_{t}(q) = V_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$$

$$\psi_{t}(q) = \psi_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$$
(20)

which incorporates the required adjustment in the backfilling region in the discrete lot size case.

There is a stronger conclusion to be drawn here. The market order for Q_{t-1} lots could just as easily have been net order flow from some earlier time to time t–1 with the proviso that information in this market arrived only via market orders with (20) governing the evolution of state prices and valuations. These considerations suggest the following definition of an information regime, an epoch within which information arrives only via order flow:

Definition 1: An information regime or epoch is a period during which it is common knowledge that asset values and state prices in different order flow states satisfy:

²¹ As Glosten (1994) emphasized, the small trade spread will be positive because prices are tail expectations. That is, $P_t(0^+) > V_t(0^+)$ and $P_t(0^-) < V_t(0^-)$ implies that $P_t(0^+) > P_t(0^-)$.

$$V_{t-1}(q+q') \equiv E_{\psi}[V | Q_{t-1} = q+q', \mathscr{T}_{t-2}] = E_{\psi}[V | Q_{t} = q', Q_{t-1} = q, \mathscr{T}_{t-2}] \equiv V_{t}(q' | Q_{t-1} = q)$$

$$\psi_{t-1}(q+q') \equiv E_{\psi}[1_{Q_{t-1}=q+q'} | \mathscr{T}_{t-2}] = E_{\psi}[1_{Q_{t}=q'} | Q_{t-1} = q, \mathscr{T}_{t-2}] \equiv \psi_{t}(q' | Q_{t-1} = q)$$
(21)

where $\mathcal{F}_{t-2} = Q_{t-2}, \dots, Q_2, Q_1, \mathcal{F}_0$ and $\{q, q', q+q'\} \in \mathbb{Q}_{t-1} \subset \mathbb{Q}_t$.²²

The pairwise restrictions (21) imply that trade-related valuations, state prices, and risk neutral hazard functions across a sequence of market orders within an information regime must satisfy:

$$V_{t}(q) = V_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) = \dots = V_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq)$$

$$\psi_{t}(q) = \psi_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) = \dots = \psi_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq)$$
(22)

where $Q_1^{t-1} \equiv \sum_{s=1}^{t-1} Q_s \in \mathscr{F}_{t-1}$ is cumulative signed volume since time 1 with $Q_1^t \in \mathbb{Q}_1 \forall t$ and the backfilling adjustment is only required in the discrete lot size case.²³ This constraint on Bayes' formula for updating asset values between trades within an information regime makes valuations path independent and dependent only on cumulative signed order flow.

How should arbitrage-free limit order books evolve when it is common (and correct) knowledge that the market is in an information epoch? The answer is that relations (22) connect the sequence of books between times 0 and t while (19) adds the required backfilling adjustment, so that a sequence of arbitrage-free limit order books within an information regime satisfies:

Proposition 3: Under the assumptions of Proposition 1, the marginal price schedule $P_t(q)$ is related to its time one counterpart by:

²² If $\mathbb{Q}_{t-1} \not\subset \mathbb{Q}_t$, $P_{t-1}(q+Q_{t-1})$ is simply a construct, not an actual price schedule for any $q \in \mathbb{Q}_t$ for which $q + Q_{t-1} \notin \mathbb{Q}_{t-1}$. Fear of adverse selection might make \mathbb{Q}_t bounded for each t, permitting the uninformed to partially separate themselves by trading patiently and thus forcing informed traders to partially reveal their information by trading over time. See note 36. ²³ Definition 1 guarantees $Q_1^t \in \mathbb{Q}_1 \forall t$ via $\mathbb{Q}_{t-1} \subset \mathbb{Q}_t$. It can be dispensed with if the book spans \mathbb{Q}_t for each t, the analogue of dynamically complete markets in this setting.

$$P_{t}(q) = P_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} sgn_{Q_{1}^{t-1}} dq) + \frac{P_{1}(0) - P_{1}(q + Q_{1}^{t-1} + sgn_{Q_{1}^{t-1}} dq)}{1_{Q_{1}^{t-1}>0} - sgn_{Q_{1}^{t-1}} \Psi_{1}(q + Q_{1}^{t-1} + sgn_{Q_{1}^{t-1}} dq)} 1_{q \in BF(Q_{1}^{t-1})} + \Phi(q, Q_{1}^{t-1}) 1_{q \in BF(Q_{1}^{t-1})}$$
(23)

when the market is in an information regime as defined in Definition 1.

It is as though time does not elapse during an information epoch but rather that there is instead a single market order in the amount of cumulative signed volume that walks up or down the time one limit order book. That is, movement up and down the book at a point in time is isomorphic to trading over time for the purpose of determining prices when all information arrives via trades. Of course, this observation is a direct consequence of the discriminatory nature of the book and the structure of information arrival within an information regime. Alternatively, it is a result of the fact that all price impact is permanent.

It is quite reasonable to assume that limit order traders act as if they can freely cancel and replace limit orders prior to the arrival of the next market order since it is easy to automate the limit order management process over time in an information epoch. Moreover, there is no risk of being picked off when the information regime changes so long as this event is common knowledge. Traders can simply cancel all limit orders at that time and resubmit new ones when they figure out the appropriate new marginal price schedule, a condition weaker than assuming that they can cancel and replace arbitrarily quickly. The assumption of a tatônnement-like limit order adjustment process is much more plausible when it is easy to program appropriate dynamic limit order trading strategies *ex ante* as it is in these circumstances.

Expected cumulative signed order flow within an information regime is zero under the risk neutral measure, an observation with a sharp implication for market order trading strategies. In particular, it does not pay for rational, risk averse, uninformed market order traders to split up

their orders unless there is insufficient depth in the book.²⁴ The reasoning is straightforward. There is no benefit to splitting up an order if it simply marches up or down the book. However, the trades of others might disrupt its execution and, while their *expected* price impact is zero in a risk neutral sense, the *actual* price impact of any intervening trades will be positive or negative *ex post*. Since unexpected signed order flow adds Rothschild-Stiglitz noise to the revenues or costs of a fragmented order, no uninformed risk averse market order trader who understands the costs of order splitting will engage in this practice unless market order trader preferences are order flow state dependent.²⁵ More will be said on this topic in the subsection on bluffing.

Finally, the assumption that all information is trade-related is the norm in dynamic market microstructure models. For example, the Kyle (1985) sequential batch auction model and the Easley, Kiefer, and O'Hara (1996) and Easley, Kiefer, O'Hara, and Paperman (1997) versions of the Glosten-Milgrom (1985) model and their descendants such as Back and Baruch's (2004) synthesis assume that all information arrives via trading. Hence, it seems obvious that this special case should be taken seriously. Moreover, Proposition 3 makes predictions about the link between observed prices and cumulative signed order flow in contrast to sequential trade models in which signed order flow is *assumed* counterfactually to be equal to the net buy/sell trade imbalance. That is, the time one book would appear to be a more empirically relevant "likelihood function" than that found in the various Easley et al. papers and their progeny.

B. Limit Order Book Sequences within Pricing Regimes

All information arrives via trades in an information regime and the price of order flow risk is constant. The $R^2 = 1$ prediction of Proposition 3 – the absence of an error term in (23) –

²⁴ A trader with an order that exceeds the depth in the book will generally want to fill the unexecuted portion as quickly as possible for these reasons, although there are doubtless mechanisms governing market order submissions that vitiate this intuition. In fact, the remainder of a market order is automatically converted into a limit order in many markets.

vanishes if the former assumption is relaxed.²⁶ This subsection introduces a different sort of epoch - a pricing regime - in which changes in the book are risk neutral martingale increments.

If state prices but not asset values satisfy (22), the marginal price schedule (5) is given by:

$$P_{t}(q) = \frac{\int_{ggn_{q}u \ge |q|} \psi_{t}(u) V_{t}(u) du}{\int_{ggn_{q}u \ge |q|} \psi_{t}(u) du} = \frac{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) V_{t}(u) du}{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) du}$$

$$= \frac{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) V_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) du}{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) du}$$

$$+ \frac{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) \psi_{t}(u) du}{\int_{ggn_{q}u \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) \psi_{t}(u) du}$$

where $V_t(u) \equiv V_{t-1}(u + Q_{t-1} + 1_{u \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) + v_t(u)$. The integrands in the first term are the determinants of tier $q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq$ of the time t–1 book: that is, $P_{t-1}(q + Q_{t-1})$ outside the backfilling region and the unconditional (on order size) expected time t–1 asset value less an appropriate backfilling adjustment. By definition, the second term is the change in the book given the new information contained in the order flow state specific innovations $v_t(q)$.

This relation is an orthogonal decomposition if $v_t(q)$ is a risk neutral martingale increment. After incorporating the backfilling adjustment from (19) in (24), it is given by:

$$\begin{split} P_{t}(q) &= P_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) \\ &+ \frac{P_{t-1}(0) - P_{t-1}(q + Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq)}{1_{Q_{t-1} > 0} - \operatorname{sgn}_{Q_{t-1}} \Psi_{t-1}(q + Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} + \Phi(q, Q_{t-1}) 1_{q \in BF(Q_{t-1})} + \varepsilon_{t}(q) \ (25) \\ \varepsilon_{t}(q) &= \frac{\int_{\operatorname{sgn}_{q}Q_{t} \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) \upsilon_{t}(u) du}{\int_{\operatorname{sgn}_{q}Q_{t} \ge |q|} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) du}; \ E_{\psi}[\varepsilon_{t}(q) \mid \mathscr{F}_{t-1}] = 0 \end{split}$$

²⁵ For example, this observation applies when preferences depend only on end-of-regime wealth.

where $\Psi_{t-1}(q + Q_{t-1} + \text{sgn}_{Q_{t-1}} \, dq)$ can be replaced with $\Psi_1(q + Q_1^{t-1} + \text{sgn}_{Q_1^{t-1}} \, dq)$. The martingale increments $\varepsilon_t(q)$ eliminate the mechanical linkages across limit order books over time and, with them, the nettlesome $\mathbb{R}^2 = 1$ prediction of Proposition 3.

These considerations motivate the following definition of a pricing regime:

Definition 2: A pricing regime or epoch is a period during which it is common knowledge that state prices satisfy $\psi_t(q) = \psi_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$ across order flow states with $\mathbb{Q}_{t-1} \subset \mathbb{Q}_t$ while order-flow-dependent asset valuations are given by:

$$V_{t}(q) = V_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) + v_{t}(q); E_{\psi}[v_{t}(q) \mid \mathscr{F}_{t-1}] = 0$$
(26)

where $V_t(q) > 0$ and $V'_t(q) > 0$ for all t and q.

All new information in pricing epochs is about asset values and not about the price of order flow risk. As is readily apparent, (26) is definitional: innovations in asset values are *always* martingale increments under the risk neutral measure in asset pricing so (26) simply serves to define the conditional mean of $V_t(q)$ to be $V_{t-1}(q+Q_{t-1}+1_{q\in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$.²⁷

This would appear to be natural given the order splitting and limit order substitution arguments that have populated these pages. All price impact is permanent in pricing regimes because expected increments to signed order flow are zero. Accordingly, no rational, risk averse, uninformed market order trader will engage in order splitting in pricing epochs either, an observation that figures prominently in the next subsection.

Moreover, the slope of the limit order book is an (appropriately translated and backfill-

²⁶ Changes in state prices can be permitted as well but innovations in state prices from $\psi_t(q) = \psi_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) + \eta_t(q)$ would have to satisfy $E_{\psi}[v_t(q)\eta_t(q) | \mathcal{F}_{t-1}] = 0$ in order for the results of this subsection to hold without additional nontrivial assumptions. ²⁷ This was trivially true in information epochs since $V_t(q) = V_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$. Exact equality would hold sometimes if, for example, asset values followed pure jump processes.

adjusted) risk neutral martingale in a pricing epoch as well. Since $\lambda_t(q)$ can be replaced by $\lambda_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)$ in (12), the translated change in the slope of the book is:

$$\begin{split} \Delta P_{t}'(q) &\equiv P_{t}'(q) - P_{t-1}'(q' + Q_{t-1} + 1_{q' \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) \\ &= \lambda_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) \{ [P_{t}(q') - V_{t}(q)] \\ &- [P_{t-1}(q' + Q_{t-1} + 1_{q' \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) - V_{t-1}(q + Q_{t-1})] \} \\ &= \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) [P_{t}(q') - P_{t-1}(q' + Q_{t-1} + 1_{q' \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)] \\ &- \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) [V_{t}(q) - V_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)] \\ &\equiv \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) [V_{t}(q) - \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq)] \\ &\equiv \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) \Delta P_{t}(q') - \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) v_{t}(q) \end{split}$$

where $q' = q + sgn_q dq$. The regressor $\Delta P_t(q') = P_t(q') - P_{t-1}(q' + Q_{t-1} + 1_{q' \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq)$ is a risk neutral martingale increment outside the backfilling region as is the residual $v_t(q)$.

These restrictions make economic sense: the slope of the book cannot change rapidly without a nontrivial *unexpected* change in market conditions. Otherwise, limit order traders would have no incentive to post orders when the slope was shallow because they would know that they would be picked off by traders who split market or marketable limit orders in succession. Similarly, limit order traders would have a strong incentive to post orders when the slope was too steep since they would earn arbitrage profits via order substitution toward the steeply sloped portion of the book, eventually altering the slope back to the no-arbitrage level.

Hence, in pricing epochs, limit order books satisfy:

Proposition 4: Under the assumptions of Proposition 1, the innovations in the (appropriately translated) marginal price schedule and in its slope are martingale increments under the risk neutral measure save for appropriate backfilling adjustments when it is common knowledge that the limit order market is in a pricing regime in the sense of Definition 2.

When might a limit order market experience a pricing regime? One generic setting arises when there are market order traders who can gain preferential access to the book when its level and slope fail to be martingale increments. Natural candidates include limit order traders themselves or the virtual trading crowd comprised of traders who peruse limit order books for profitable trading opportunities. Both have an incentive to transport liquidity over time when it is expected to be cheaper or more dear in the future than in the present.

In particular, suppose a market or marketable limit order trader can temporarily "lock" others out of the market at any time, essentially giving that trader a free option to split an order into smaller trades and to submit each of them *after* the book is refreshed. Both standing limit orders and those that have replenished the book can then be "picked off" if they are mispriced in the sense codified in Proposition 4. This putative ability to split orders over time on the demand side within pricing epochs is a perfect substitute for arbitrage trading. That said, this mechanism is much less plausible than that underlying information regimes.²⁸

Finally, it is worth noting a simple corollary of Proposition 4 that broadens the basic framework to accommodate linear changes in the mapping from order flow states to asset values in pricing epochs. Suppose the mapping from order flow states to asset values changes to:

$$V_{t}(q \mid \alpha_{t}, \beta_{t}) = \alpha_{t} + \beta_{t} V_{t}(q); \alpha_{t}, \beta_{t} \in \mathscr{F}_{t-1}$$

$$(28)$$

at time t-1. If state prices do not change when the asset value/order flow state mapping changes, the marginal price schedule experiences an alteration in location and scale as well since:

$$P_{t}(q \mid \alpha_{t}, \beta_{t}) = \frac{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) V_{t}(q \mid \alpha_{t}, \beta_{t}) du}{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) du}$$

$$= \frac{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) \alpha_{t} du}{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) du} + \frac{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) \beta_{t} V_{t}(u) du}{\int_{\mathrm{sgn}_{q}Q_{t} \geq |q|} \psi_{t}(u) du} = \alpha_{t} + \beta_{t} P_{t}(q)$$
(29)

which is yet another example of the value additivity proposition that pervades financial economics.

This simple observation adds considerable flexibility to this framework by permitting the economic significance of a market order of a given size to change without altering the basic economics of the underlying marginal price schedule. Diurnal effects – the well-documented time-of-day effects in liquidity in virtually all markets – can be handled easily by modeling them as deterministic shifts in price impact. Price impact that changes mechanically with market conditions can be accommodated as well, making it easy, for example, to allow for a distinction between fast and slow markets or for links between the marginal price schedules of different securities. Moreover, (28) can be augmented with multiple value factors and their associated scale coefficients. These simple modifications greatly enrich the structure of pricing epochs.

C. Bluffing in Information or Pricing Epochs

Early versions of Black (1995) (see, for example, Black (1990)) were largely concerned with the circumstances in which bluffing distorted trading and the price of immediacy under different market structures, perhaps even causing market breakdowns. In Black's lexicon, bluffers are traders who place orders, the sole information content of which is that the trader in question does not possess value-relevant private information and knows it.²⁹ The circumstances in which bluffing works are intimately related to the notion of arbitrage in limit order books: a market will break down if zero net supply bluffing strategies represent arbitrage opportunities.

The role of zero expected future signed order flow in information and pricing regimes or, equivalently, the permanence of price impact, suggests that this analysis might have something to say about bluffing in limit order markets. In fact, any arbitrage opportunities arising from bluffing were implicitly assumed away in Assumption 1. The purpose of this subsection is to make the implications of bluffing in information or pricing epochs a bit more explicit.

 $^{^{28}}$ Limit order substitution is even more implausible since it involves swapping time t for time t+1 limit orders, straining credulity in one direction and violating the arrow of time in the other.

Bluffing with limit orders within an information or pricing regime has no effect almost by definition since $P_t(q)$ and $V_t(q)$ are common knowledge among market participants. That is, any bid or offer that is not on the $P_t(q)$ schedule signals that the epoch is over, that the former mapping between order flow states and asset valuation is no longer operative. Put differently, a rational limit order trader cannot simultaneously believe that a market is in an information or pricing epoch and that there is a limit order posted off of the $P_t(q)$ schedule.

To be sure, informed traders will naturally submit limit orders when their real or illusory value-relevant information indicates that these orders are overvalued or undervalued. Unless they want to signal the end of an information or pricing regime, they will post sell orders only when their information suggests that $P_t(q) = E_{\psi}[\tilde{V} | Q_t \ge q, \mathscr{F}_{t-1}] > E_{\psi^1}[\tilde{V} | Q_t \ge q, \mathscr{F}_{t-1}]$, where ψ^1 denotes the personal state prices – the product of informed investor beliefs and the corresponding indirect marginal utilities in most models – and \mathscr{F}_{t-1}^1 denotes the corresponding private information of a generic informed investor I. Similarly, informed traders will only submit the corresponding limit buy orders when this inequality is reversed. However, these orders do not represent bluffing and the possibility that informed investors might submit orders on $P_t(q)$ schedule is implicitly embedded in the order-flow-dependent asset values $V_t(q)$, again by assumption. Put differently, the analysis will fail unless there is a well-defined mapping from order flow states to asset values in the presence of this adverse selection problem.

Bluffing with market orders is also not profitable when it is common knowledge that a market is in an information or pricing epoch. Clearly, bluffing exactly breaks even when a market buy order is immediately reversed with a sale if there is no information arrival in the meanwhile. More generally, the discriminatory nature of the book forces the bluffer to expect to

²⁹ Bluffing by informed traders is probably more properly thought of as manipulation.

pay (receive) the same average price when buying (selling) as that received (paid) when selling (buying). Just as there is a disincentive to split up orders in information or pricing regimes, there is no incentive to "split up" a zero net order flow trade into market buy and sell orders within such epochs as well. In an information regime, the price at any time depends entirely on net order flow since it began and bluffing does not affect net order flow by design. The same holds for pricing epochs in a forward looking sense: the risk neutral expectation of net order flow is zero and the associated expected price change is zero as well.

This reasoning suggests that a "rational" bluffer – that is, an expected-utility-maximizing bluffer with rational beliefs – will choose not to bluff within a given regime. Any sequence of transactions that generates zero net order flow is subject to price risk from the intervening trades of others. Hence, any such trading strategy has an uncertain payoff with an expectation of zero, increasing the volatility of the indirect marginal utility of wealth of such an investor and thus reducing expected utility. That is, the payoff to bluffing is expected-utility-decreasing Rothschild-Stiglitz noise if preferences are not directly order-flow-state dependent. Any trader who understands these costs will not bluff with market orders within an epoch.

Of course, there might be "irrational" bluffers – those who fail to realize that bluffing lowers expected utility – who can survive in equilibrium and their trades will look those of other traders who think they possess value relevant private information but who do not.³⁰ The only difference between their behavior and that of other similar noise traders is that their trades will have no net effect on prices during an epoch since they generate zero net order flow. However, bluffing transactions will generally have a temporary effect on signed volume and price volatility within a regime. Hence, an arbitrage-free limit order book functions well in the sense that bluffing has no permanent effect on the price of immediacy within an epoch but any such trading can add noise to prices, suggesting that it can have an effect on the welfare of traders.³¹

Of course, the assumption that traders know that they are in a given regime is crucial. As noted earlier, it is a commonly made assumption and it is an internally consistent one as well: the notion that traders perceive a deterministic mapping between market order states and security values in those states makes little sense otherwise. A less charitable interpretation is that said deterministic mapping merely pushes the bluffing problem down one level. Hence, the application of arbitrage reasoning is intimately tied to the question of whether bluffers can cause limit order traders to perceive changes in epochs when they have not, in fact, occurred or to miss changes that have happened. It is hard to think of a variable that would signal to uninformed limit order traders that a change in the marginal price schedule or in order flow represents a bluff, not a change in regime, save, perhaps, for expected or unexpected market closures.

Not much more can be said at this level of generality as is often the case with arbitrage arguments. Much more must be known about the determinants of equilibrium in order to say something substantive about market behavior around regime changes. For example, a sufficiently great risk of a "true" regime shift that depreciated the value of private information might be enough to make informed traders forego bluffing. Similarly, the risk of such a regime shift or that the bluff will not be believed might deter rational bluffers who might otherwise trade to distort beliefs about market conditions. One simply cannot identify any such circumstances without endogenizing trading strategies in a more fully explicated model of market conditions.

Finally, it is perhaps worth emphasizing once again that the end of regimes of these sorts is an observable event in most dynamic microstructure models. That is, the risk neutral

³⁰ Traders who mistakenly think they have value relevant private might well behave in every way like informed traders and, hence, would likely forego irrational bluffing.

³¹ It is not easy to design regulations that mitigate the impact of welfare-decreasing noise traders. For example, a wash sale (or purchase) tax or regulation would penalize welfare-increasing *de*

probability laws that are relevant for assessing the extent of adverse selection present in the marketplace in mainstream market microstructure models is assumed to be known by market makers and other suppliers of immediacy *ex ante* as is the case in most rational expectations models. At the very least, the bluff-proof nature of limit order books within information and pricing regimes coupled with the observation that rational traders will forego bluffing in these circumstances has broadened the class of market settings within which such results obtain.

D. A Comparison with Batch Auction Markets

It is interesting to compare and contrast these results with Huberman and Stanzl's (2004) characterization of batch auction markets that do not permit statistical arbitrage. To be sure, the setting is different: they study the profits of risk neutral traders who place market orders before the demands of other traders – whose behavior is modeled as independently and identically distributed zero mean noise – and public information, also in the form of iid noise, is revealed. There is also a difference in nomenclature: their price impact functions correspond to marginal price schedules while their price update functions correspond to the shifts in these schedules generated by market orders. Finally, the very notion of arbitrage itself is necessarily different as well because traders place orders before prices are revealed in their market setting.

That said, the major difference would appear to be the market mechanism: a single price auction as opposed to the discriminatory auction implicit in a limit order market. Their main conclusion is that price update functions must be linear in expectation (given that their slopes and intercepts are iid) or statistical arbitrage – that is, limiting infinite Sharpe ratios for feasible zero net investment trading strategies – opportunities will arise. As is well known, the market price in a uniform price auction is the expectation of the asset value.

facto market makers who generically sought to be flat at the end of the trading day along with any such noise traders, with an ambiguous effect on the welfare of other market participants.

As Huberman and Stanzl (2004) note, the economics of their price updating result was described well in Black (1995): "If we could hold market conditions fixed, the price impact of a limit order at a given level of urgency would be proportional to order size...A 10,000-share order would move the price ten times as much as a 1,000-share order." They show that the permanent price impact has to be proportional to the size of the market order or traders could reliably profit over time through manipulation when the mechanism is a batch auction.³²

The economics here is that emphasized in Glosten (1994) – permanent price impact is governed by the marginal trade, not the average trade, in a limit order market. That is, linearity of market impact is not necessary because of the discriminatory nature of the book. In an information epoch, one 10,000-share order moves prices by the same amount as *a sequence of ten* 1,000-share orders when market conditions are held constant at \mathcal{F}_0 but the marginal price schedule itself need not be linear. In a pricing regime, the large market order moves prices by the same amount as the expected (risk neutral) price impact of the ten smaller orders, again with no linearity requirement. This is merely a restatement of the idea arbitrage-free limit order books do not permit traders to reliably profit by splitting up orders over time in the settings discussed in the preceding subsection. Black's intuition works very differently in a limit order market.

More specifically, consider the updating equation that determines the post-trade market value $P_t(0)$ defined in (11) above. In an information regime, it is the value of the asset at the marginal share – that is, $P_t(0) = V_{t-1}(Q_{t-1})$ – but, according to Definition 1 and (22), this is equal to $V_1(Q_{t-1} + Q_1^{t-2} + 1_{Q_{t-1} \in BF(Q_1^{t-2})} \operatorname{sgn}_{Q_1^{t-2}} dq)$. Hence, repackaging any set of trades between times 1

³² Back and Baruch (2004) show that uniform price auctions are equivalent to limit order markets in their version of the Glosten-Milgrom model because informed traders endogenously choose the smallest feasible order size in batch auction markets, making the price update function proportional to size and, thus, linear. Note also that the notion that order splitting generically destroys the ability of single price auctions to clear continuous markets is not a new one; see, for example, Section 6.4.2 of Harris (2003).

and t–1 in a way that does not alter net order flow Q_1^{t-1} leaves the cumulative impact of that set of trades unchanged. Similarly, the time t–1 value of the asset in a pricing regime is:

$$V_{t-1}(Q_{t-1}) = V_{t-2}(Q_{t-1} + Q_{t-2} + 1_{Q_{t-1} \in BF(Q_{t-2})} sgn_{Q_{t-2}} dq) + \upsilon_{t-1}(Q_{t-1})$$

= $V_{t-3}(Q_{t-1} + Q_{t-2} + Q_{t-3} + 1_{Q_{t-1} \in BF(Q_{t-3}^{t-2})} sgn_{Q_{t-3}^{t-2}} dq) + \upsilon_{t-1}(Q_{t-1}) + \upsilon_{t-2}(Q_{t-1})$ (30)
= $V_1(Q_{t-1} + Q_1^{t-2} + 1_{Q_{t-1} \in BF(Q_1^{t-2})} sgn_{Q_1^{t-2}} dq) + \sum_{j=1}^{t-1} \upsilon_{t-j}(Q_{t-1})$

according to Definition 2 and (26) and so the expected market impact of any trade during a pricing epoch is identical irrespective of how the trade is broken up over time since the residuals are risk neutral martingale differences. This outcome need not occur in an otherwise identical batch auction market because of the discriminatory nature of the book.

This is an observation of some importance for a couple of reasons. First, Obizhaeva and Wang (2006) use the Huberman and Stanzl results to support the assumption of linear price impact functions in limit order markets. Price impact might well be linear in limit order markets but its source does not lie in quasi-arbitrage reasoning. It must instead be an empirically relevant approximation – as in Sandås (2001) and de Jong et al. (1996) – or the result of a more tightly parameterized model of the behavior of market and limit order traders. Second, it suggests that Huberman and Stanzl are a bit hasty in suggesting that the nonlinear price-update functions that have been documented in empirical work by Hasbrouck (1991), Hausman, Lo, and MacKinlay (1992), and Kempf and Korn (1999) imply the feasibility of profitable manipulation. The New York Stock Exchange is a hybrid market that functions, in part, as a limit order market while the DAX futures market is a pure limit order market. There is no *a priori* reason to think that these markets should behave like sequences of batch auction markets.

4. Empirical Implications

Perhaps the most interesting aspect of this analysis is its implications for empirical work on limit order books. To be sure, there is a major stumbling block to its straightforward application: the absence of a direct measure of $V_t(q)$. While this problem can be solved by specifying a parametric model for asset values in different order flow states as is done, for example, in Sandås (2001) and de Jong et al. (1996), the economic settings studied in the previous section provide a semiparametric framework for learning about the price of order flow risk under much weaker assumptions. Accordingly, the next two subsections briefly sketch the empirical implications of information and pricing epochs, respectively.³³

A. Information Regimes

The most restrictive assumptions given earlier are those codified in Definition 1, the hypothesis that observations come from a limit order market in an information regime. Since it is an $R^2 = 1$ theory, it provides sharp potentially falsifiable restrictions that make it testable even with limited data. It also is a useful framework for organizing data from limit order books.

For example, a limited data set containing only total trade sizes and subsequent midquotes can reveal a great deal about marginal valuations. The reason is quite simple: the post-trade asset value $P_t(0)$ – the subsequent midquote to a first approximation – is equal to the marginal valuation $V_{t-1}(Q_{t-1})$ on the last part of the market order of size Q_{t-1} , which, in turn, is equal to $V_1(\hat{Q}_1^{t-1})$ in an information regime where $\hat{Q}_1^{t-1} = Q_1^{t-1} + 1_{Q_{t-1} \in BF(Q_1^{t-2})} \operatorname{sgn}_{Q_1^{t-2}} dq$. Moreover, realized net order flow \hat{Q}_1^{t-1} will span \mathbb{Q}_1 in large samples under weak regularity conditions.

Perhaps surprisingly, these limited data alone can be used to test the hypothesis that they

³³ The relevant regularity conditions are reasonably straightforward. A number of empirical issues are not addressed here, including the presence of binding minimum ticks. One strategy for dealing with minimum price variation is to smooth the order flow state/asset value mapping at each tier of the book, an interpolation that can be rigorously justified under symmetric priority rules such as pro rata or random allocation which are analyzed in the Appendix. The relevant premiums under strict priority might be negligible if the tick size is sufficiently small compared with price levels and order flow volatility so that traders with high priority orders in different queues expect to cancel them before they are filled. In this case, the sequence of orders in the queue is typically random *ex post*, resulting in an *ex ante* time priority premium close to zero.

are from a single information regime. There is nothing in these calculations that insures that translated time t midquotes will result in marginal valuations that are ordered correctly. That is, the model implies that $V_1(\hat{Q}_1^{t-1})$ is strictly increasing in \hat{Q}_1^{t-1} and, hence, it is rejected if the rank correlation between the two is less than one.³⁴

While the information regime hypothesis can be rejected easily from these data, estimates of $V_1(q)$ alone are not sufficient to estimate the price of order flow risk or to test hypotheses about it. However, knowledge of at least one book permits the estimation of state prices and risk-neutral hazard ratios from (8) and (12), respectively, via:

$$\hat{\psi}_{1}(\hat{Q}_{1}^{t-1}) = \frac{P_{1}'(\hat{Q}_{1}^{t-1})}{P_{1}(\hat{Q}_{1}^{t-1} + sgn_{\hat{Q}_{1}^{t-1}} dq) - P_{t}(0)} [1_{\hat{Q}_{1}^{t-1} > 0} - sgn_{\hat{Q}_{1}^{t-1}} \hat{\Psi}_{1}(\hat{Q}_{1}^{t-1} + sgn_{\hat{Q}_{1}^{t-1}} dq)]$$

$$P_{1}'(\hat{Q}_{1}^{t-1}) = \hat{\lambda}_{1}(\hat{Q}_{1}^{t-1})[P_{1}(\hat{Q}_{1}^{t-1} + sgn_{\hat{Q}_{1}^{t-1}} dq) - P_{t}(0)]$$
(31)

if the book has no holes (i.e., satisfies Proposition 2).³⁵ If asset values inferred from midquotes span the book in large samples, these estimates converge pointwise to their population analogs.³⁶ They can also be smoothed to fill in holes in the time one book created by sampling.³⁷

³⁴ $V_s(\hat{Q}_s^{t-1})$ is also strictly increasing in \hat{Q}_s^{t-1} and has a rank correlation of one $\forall s < t \in [2,T]$ too. ³⁵ Note that (8) and (10) can be used to link risk neutral probabilities and hazard ratios. ³⁶ Another issue concerns cumulative order flows \hat{Q}_1^{t-1} for which there is no time one quote $P_i(\hat{Q}_1^{t-1})$. In this eventuality, observations on a time s book with a quote at $P_s(\hat{Q}_s^{t-1})$ will provide the relevant information. This ability to splice together parts of books at different times makes the assumption that $\mathbb{Q}_{t-1} \subset \mathbb{Q}_t$ in Definition 1 of negligible importance empirically. ³⁷ Other data can facilitate estimation of the price of order flow risk. For example, overall order prices (i.e., quantity times average price) are related to the time one marginal price schedule via: $\overline{P}_t(Q_t) \equiv \frac{1}{Q_t} \int_0^{Q_t} P_t(q) dq = \frac{1}{Q_t} \int_0^{Q_t} P_1(q + \hat{Q}_1^{t-1}) dq = \frac{1}{\hat{Q}_1^t - \hat{Q}_1^{t-1}} \int_{\hat{Q}_1^{t-1}}^{\hat{Q}_1^t} P_1(q + \hat{Q}_1^{t-1}) dq$

and $P_1(q)$ can be estimated via step functions such as the left or right endpoints $\overline{P}_1(\hat{Q}_1^{t_{k-1}})$ or $\overline{P}_1(\hat{Q}_1^{t_k})$, respectively, for $q \in (\hat{Q}_1^{t_{k-1}}, \hat{Q}_1^{t_k})$ with $\hat{Q}_1^{t_k}$ ordered so that $\{\hat{Q}_1^{t_k}: \hat{Q}_1^{t_k} \ge \hat{Q}_1^{t_{k-1}}, k = 2,...,T\}$ or the averages can be smoothed. This is a bit like estimating a distribution function, save for the

Of course, the hypothesis that the market was in a single information epoch will seldom survive the presence of data on two or more limit order books or on the overlapping range of parts of two or more books because they must imply the same time one book. This situation is like that arising in the analysis of conventional options: two options on the same underlying asset must have the same implied volatility if the Black-Scholes model is true. As with all $R^2 =$ 1 theories, one cannot speak of a distribution theory under either the null or a vague alternative hypothesis, only that empirical violations of the model reject the joint hypotheses that these data are from a sufficiently frictionless, arbitrage-free market in a single information epoch.

However, even if the data do not line up perfectly, it can be reasonable to organize limit order book data in this fashion under the alternative hypothesis that the data come from a pricing regime. In this case, the difference between (31) and its population analogue:

$$\psi_{1}(Q_{1}^{t-1}) = \frac{P_{t-1}'(Q_{t-1})}{P_{t-1}'(Q_{t-1} + sgn_{Q_{t-1}} dq) - V_{t-1}(Q_{t-1})} [1_{Q_{t-1}>0} - sgn_{Q_{t-1}} \Psi_{1}(Q_{t-1} + sgn_{Q_{t-1}} dq)]$$

$$P_{t-1}'(Q_{t-1}) = \lambda_{t-1}(Q_{t-1})[P_{t-1}(Q_{t-1} + sgn_{Q_{t-1}} dq) - V_{t-1}(Q_{t-1})]$$
(32)

depends on three differences: $P'_{t-1}(Q_{t-1}) - P'_{t}(\hat{Q}_{1}^{t-1})$, $P_{t-1}(Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq) - P_{1}(\hat{Q}_{1}^{t-1} + \operatorname{sgn}_{Q_{1}^{t-1}} dq)$, and $v_{t+1}(0) = P_{t+1}(0) - V_{t}(Q_{t})$. The first two are observable and the third has conditional mean zero in the risk neutral measure even if the information and pricing epoch hypotheses are false. If $v_{t+1}(0)$ is taken to have conditional mean zero in the empirical measure as well, any gaps between the time t–1 and time 1 translated slopes and marginal price schedules can be examined to see if they are economically significant for the purposes of estimating order flow state specific asset values and the price of order flow risk. More observations on marginal price schedules further sharpen the assessment of the economic significance of any violations of the information

presence of additional information when $(\hat{Q}_1^{t_{k-1}}, \hat{Q}_1^{t_k}) \cap (\hat{Q}_1^{t_{j-1}}, \hat{Q}_1^{t_j}) \neq \emptyset$ for one or more dates t_j

regime hypothesis. They can also serve to identify transitions between information epochs.

Of course, there is another alternative hypothesis that is of interest: the possibility that market traders trade sufficiently quickly so as to violate Assumption 3. In principle, there might be two senses in which market order traders might be trading too quickly: they might be too impatient to let limit order traders backfill the book or they might be exploiting stale orders in the book due to slow backfilling over several trades. However, the latter cannot occur in an information epoch so long as the decision calculus of limit order traders is not altered – that is, as long as the mapping from order flow states to value are not affected by slow backfilling – for the same reason that standing limit orders outside of the backfilling region would naturally remain posted in (14): the discriminatory nature of the book and the fact that bids and offers are lower and upper tail expectations insures that no order left standing is stale.

As a consequence, data on several limit order books can be used to splice together a time one limit order book. If the market was truly in an information regime, this time one book will be unique and it can be used to backfill any book in the sample, thus permitting recovery of the midquotes necessary to estimate the order flow state/asset value mapping and the price of order flow risk via (31). If it is not, there will be no unique upward sloping time one book but one can still be cobbled together via averaging. In this case, the economic significance of any departures from the information regime hypothesis can be assessed via the comparison of (31) with (32).

B. Pricing Regimes

Of course, another way to proceed if the information regime hypothesis fails empirically is to impose the weaker assumption that a given sample is drawn from a pricing epoch. The pricing regime hypothesis, in conjunction with (12), implies that $V_t(q)$ and $V'_t(q)$ are given by:

and t_k . $P_t(q)$ is overdetermined with overlapping data which makes for testing possibilities.

$$V_{t}(q) = P_{t}(q) - \frac{P_{t}'(q)}{\lambda_{1}(q+Q_{1}^{t-1})}$$

$$V_{t}'(q) = P_{t}'(q) - \frac{P_{t}''(q)}{\lambda_{1}(q+Q_{1}^{t-1})} + \frac{P_{t}'(q)}{\lambda_{1}(q+Q_{1}^{t-1})^{2}} \lambda_{1}'(q+Q_{1}^{t-1})$$
(33)

for all q and t where, for simplicity, $V'_t(q)$ is calculated only for the no minimum lot size case. The first equality can be solved for risk neutral hazard ratios if $P_t(q) - V_t(q)$ or $P_t(q)/V_t(q)$ is a known function of observables. The second is a Bernoulli differential equation that can be solved explicitly for $\lambda_1(q + \hat{Q}_1^{t-1})$ if $P'_t(q) - V'_t(q)$ or $P'_t(q)/V'_t(q)$ can be written solely in terms of observables. In the absence of such restrictions, the fact that $V_t(q)$ and $V'_t(q)$ are both positive implies that risk neutral hazard ratios satisfy:

$$1 > \lambda_{1}(q + \hat{Q}_{1}^{t-1}) > \frac{P_{t}'(q)}{P_{t}(q)}$$

$$\lambda_{1}(q + \hat{Q}_{1}^{t-1})^{2} + \lambda_{1}'(q + \hat{Q}_{1}^{t-1}) - \frac{P_{t}''(q)}{P_{t}'(q)}\lambda_{1}(q + \hat{Q}_{1}^{t-1}) > 0$$
(34)

which depend on the semi-elasticity $P'_t(q)/P_t(q)$ and the curvature coefficient $P''_t(q)/P'_t(q)$.

Of course, these constraints will not suffice to estimate the price of order flow risk without additional information. $P_t(0)$ – roughly speaking, the midquote – is equal to $V_{t-1}(Q_{t-1}) + v_t(0)$ by (11) but cannot be translated back to a common date under the pricing epoch hypothesis. Instead, the estimation of the price of order flow risk is an econometric problem, one that can be solved by exploiting the moment conditions underlying Proposition 4. Of course, econometric use of said moment conditions requires a model of the link between the risk neutral and empirical measures.

The pricing regime hypothesis makes it possible to learn about risk neutral hazard functions from the updating equations (13) when the risk neutral martingale increment $v_t(0)$ is

unpredictable in the empirical measure as well. In this case, the updating equations are given by:

$$P_{t}(0) = P_{t-1}(Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq) - \frac{P_{t-1}'(Q_{t-1})}{\lambda_{1}(Q_{1}^{t-1})} + v_{t}(0)$$
(35)

which is in the form of the semiparametric smooth coefficient regression model studied by Li et al. (2002) with two main differences: there is no intercept and the regressors $P'_{t-1}(Q_{t-1})$ and Q_1^{t-1} are risk-neutral martingales which will require amendment of the relevant regularity conditions. Methods developed for such models – ones that exploit the fact that observations t and s for which Q_1^t is close to Q_1^s should have similar hazard rates – can, in principle, deliver estimates of the inverse hazard function, which, in turn, can be used to estimate state prices. The usual nonparametric suspects are natural candidates for the functional form of $\lambda_1(Q_1^{t-1})^{-1}$: kernel functions, piecewise polynomials, neural networks, and the like. Tests of the pricing regime hypothesis can be based on the residuals, which are martingale differences in a pricing regime but which will generally be correlated with information available prior to time t–1 since $\frac{P'_{t-1}(Q_{t-1})}{\lambda_1(Q_1^{t-1})} - \frac{P'_{t-1}(Q_{t-1})}{\lambda_{t-1}(Q_{t-1})}$ is present in the residuals when the pricing regime hypothesis fails.

Another place to look for moment conditions is in the dynamic asset valuation relation (26) in Definition 2. Since these dynamics are on market microstructure time scales, it is reasonable to hypothesize that the risk neutral martingale increments $v_t(q)$ are not predictable in the empirical measure as well. Proposition 4 provides two ways to test this hypothesis. The conditional mean of $P_t(q)$ is $P_{t-1}(q+Q_{t-1})$ outside of the backfilling region according to (25) and so the associated innovations $\varepsilon_t(q)$ are unpredictable. Similarly, the translated change in the slope of the limit order book as given in (27) is a martingale increment outside the backfilling region in these circumstances as well. It is worth emphasizing that these martingale hypotheses can be tested without estimating the price of order flow risk.

The conditional mean of $P_t(q)$ inside the backfilling region is given explicitly in (25), making it possible to estimate the cumulative distribution function of state prices in a pricing epoch when $\varepsilon_t(q)$ is unpredictable. In particular, (25) can be conveniently rewritten as:

$$P_{t}(q) - P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq) = \frac{P_{t-1}(0) - P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{1_{Q_{t-1} < 0} + sgn_{Q_{t-1}} \Psi_{1}(q + Q_{1}^{t-1})} + \Phi(q, Q_{t-1}) + \varepsilon_{t}(q) (36)$$

inside the backfilling region. This too is a version of the semiparametric smooth coefficient regression model studied by Li et al. (2002) with the regression coefficient given by the inverse or one minus the inverse of the cumulative distribution function of state prices. Accordingly, the recovery of state prices will require inversion of this regression coefficient.³⁸

One final approach builds on this martingale increment hypothesis by assuming that a pricing regime mimics an information epoch in a particular sense. Imagine that the transaction record separately reports the execution of each share of a market order without a time stamp, making the record a sequence of 1's or -1's, with each sequence ending at "time" $Q_{t-1} = q$. A market order will look like it was a sequence of trades in a market with one share bid and offered with runs of buys and sells as it walked up or down the book.

The pricing epoch analogue arises when changes in asset values are martingale increments up and down the book. Under this hypothesis, the risk neutral martingale increments $v_t(q)$ are unpredictable, not only over time, but over q as well so that $E[v_t(q) | v_t(r), sgn_q r \ge |q|; P_t(0), \mathscr{F}_{t-1}] = 0 \forall q \in \mathbb{Q}$ as information "evolves" in anticipation of a market order walking the book. Hence, (27) is yet another semiparametric smooth coefficient regression model given by:

³⁸ Alternatively, (36) can be converted into a normal equation by multiplying both sides by $1_{Q_{t-1}<0} + \text{sgn}_{Q_{t-1}} \Psi_1(q + Q_1^{t-1})$. Generalized method of moments analogues of the methods given in Li et al. (2002) will produce consistent estimates under suitable regularity conditions.

$$\Delta P'_{t}(q) = \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) \Delta P_{t}(q') - \lambda_{1}(q + Q_{1}^{t-1} + 1_{q \in BF(Q_{1}^{t-1})} \operatorname{sgn}_{Q_{1}^{t-1}} dq) v_{t}(q) (37)$$

where $\mathbf{q}' = \mathbf{q} + \mathrm{sgn}_{q} \mathrm{dq}$, which is a well-posed regression outside of the backfilling region because $v_t(\mathbf{q})$ is uncorrelated with $\Delta P_t(\mathbf{q}') = P_t(\mathbf{q}') - P_{t-1}(\mathbf{q}' + \mathbf{Q}_{t-1} + \mathbf{1}_{\mathbf{q}'\in BF(\mathbf{Q}_{t-1})} \operatorname{sgn}_{\mathbf{Q}_{t-1}} \mathrm{dq})$ in the discrete lot size case while it is negligible when \mathbb{Q} is uncountable. It has the virtue that it has the risk neutral hazard ratio and not its inverse or $\mathbf{1}_{\mathbf{Q}_{t-1}<0} + \operatorname{sgn}_{\mathbf{Q}_{t-1}} \Psi_1(\mathbf{q} + \mathbf{Q}_1^{t-1})$ as the coefficient. Moreover, there are two natural specification tests implicit in this model: the absence of an intercept and the presence of the explicit backfilling relation given in (25) as a function of the risk neutral CDF that can be recovered from $\lambda_1(\mathbf{q} + \mathbf{Q}_1^{t-1} + \mathbf{1}_{\mathbf{q}\in BF(\mathbf{Q}_1^{t-1})} \operatorname{sgn}_{\mathbf{Q}_1^{t-1}} \operatorname{dq})$. Note that the composite residual $\lambda_1(\mathbf{q} + \mathbf{Q}_1^{t-1} + \mathbf{1}_{\mathbf{q}\in BF(\mathbf{Q}_1^{t-1})} \operatorname{sgn}_{\mathbf{Q}_1^{t-1}} \operatorname{dq})v_t(\mathbf{q})$ will exhibit heteroskedasticity related to the time one hazard unless changes in the variance of $v_t(\mathbf{q})$ offset it.

Finally, one hypothesis will nearly always be of interest in this setting: the hypothesis that the risk neutral and empirical measures are the same in a pricing regime. Sandås (2002) concluded that the book was too steep on average to be consistent with the Glosten (1994) model, a conclusion that could be taken to be evidence that risk aversion is implicit in bids and offers and not as evidence of model failure. Differences between the cumulative distribution function of state prices and the empirical distribution of cumulative net order flow in the sample can potentially provide an economic interpretation of the "excessive" steepness of the book.³⁹

5. Conclusion

This paper has barely scratched the surface of the applicability of the idea that limit orders can be viewed as contingent claims – more precisely, digital options – written on order flow. It has established a basic framework for the theoretical and empirical analysis of limit order markets when it is reasonable to treat them as sufficiently frictionless with an underlying mapping from market order size to asset value from the perspective of uninformed limit order traders. Much can be said about the supply of immediacy in limit order markets in these circumstances taking these features of the market for immediacy as given.

The economics and econometrics of limit order markets prove to be tightly linked in these circumstances because the analysis is an exercise in asset pricing theory. The economics is that of risk neutral valuation based on state prices associated with order flow states. Just as a menu of options can complete the market and facilitate the calculation of the state prices, so can a limit order book facilitate the calculation of state prices for order flow states. When the price of order flow risk is constant, signed volume plays a central role in limit order market dynamics due to the economics of order splitting and the discriminatory nature of the book. The econometrics is that arising from the associated moment conditions, which link state prices, the slope of the book, and price impact. In the general environment and in both types of regimes, price impact is not mechanical but rather is an integral part of price discovery.

I will close with two observations on the prospects for future research in this framework, one empirical and one theoretical. On the empirical side, the analogy with asset pricing can be further explored – and, for that matter, exploited – by formulating models for limit order price schedules in terms of stochastic discount factors, which will permit the importation of the numerous methods developed for their analysis. On the theoretical side, equilibrium models for limit order markets can be based on the observation that, like conventional derivatives, order flow derivatives are in zero net supply – that is, trading is in zero net supply – as opposed to models that tightly parameterize the economic environment, especially with regard to preferences (i.e., constant absolute risk aversion or risk neutrality) and beliefs (i.e., rational

³⁹ The relevant regularity conditions for the empirical distribution of cumulative net order flow

expectations coupled with normally distributed signals). These developments can only serve to improve our understanding of a market structure that has become ubiquitous.

are those that apply to time series data. See, for example, Bosq (1998) and Györfi et al. (1989).

Appendix

Strict priority rules and minimum price variation: Suppose there is no minimum order size, since accounting for one will just make for bounds instead of equalities in what follows, and consider first the case of a strict priority rule like time priority. In this case, limit order substitution at a point in time can only go in one direction: from an order in the queue at one tier to the end of the queue at that or any other tier. Hence, limit order substitution among the lowest priority orders across tiers of the book characterizes implicit state prices.

Accordingly, consider two adjacent tiers of the book k and $k + sgn_k$ with prices $P_k \forall q \in (\underline{q}_{k-sgn_k}, \underline{q}_k]$ and $P_{k+sgn_k} \forall q \in (\underline{q}_k, \underline{q}_{k+sgn_k}]$, respectively, where \underline{q}_k is the quantity posted at the lowest priority of tier k and where the tick size $c_k = P_{k+sgn_k} - P_k > 0$ can vary with the price level. Since $P_k > V_t(\underline{q}_k)$ and $c_k > 0$, depth is implicitly determined at each tier via:⁴⁰

$$P_{k} = \lambda_{t}(\underline{q}_{k})V_{t}(\underline{q}_{k}) + [1 - \lambda_{t}(\underline{q}_{k})]P_{k+sgn_{k}} \Longrightarrow P_{k} = \frac{\sum_{j \ge |k|} \psi_{t}(\underline{q}_{j \times sgn_{k}})V_{t}(\underline{q}_{j \times sgn_{k}})}{\sum_{j \ge |k|} \psi_{t}(\underline{q}_{j \times sgn_{k}})}$$

by iterating the first expression forward. The analogue of (12) in this case implies that:

$$\lambda_{t}(\underline{\mathbf{q}}_{k}) = \frac{\mathbf{P}_{k+\mathrm{sgn}_{k}} - \mathbf{P}_{k}}{[\mathbf{P}_{k+\mathrm{sgn}_{k}} - \mathbf{V}_{t}(\underline{\mathbf{q}}_{k})]} = \frac{\mathbf{c}_{k}}{\mathbf{P}_{k} + \mathbf{c}_{k} - \mathbf{V}_{t}(\underline{\mathbf{q}}_{k})} \Longrightarrow \psi_{t}(\underline{\mathbf{q}}_{k}) = \frac{\mathbf{c}_{k}}{\mathbf{P}_{k} + \mathbf{c}_{k} - \mathbf{V}_{t}(\underline{\mathbf{q}}_{k})} \sum_{j \ge |k|} \psi_{t}(\underline{\mathbf{q}}_{j \times \mathrm{sgn}_{k}})$$

which is similar to the solution of (12) when c_k is small in percentage terms but can be quite different when it is not. Note that risk neutral probabilities within the queue are not determined in the absence of a model for the rents generated by strict priority.

⁴⁰ This characterization of depth is at a point in time, begging the question of how the order sequence in the queue was determined in the first place. Black (1995) argued that there can be no equilibrium in a limit order market with time priority and no cancellation costs: all traders would try to place all orders that they might like to make at the beginning of the day and later cancel any limit order that they did not want executed but there can be only one order at the front of the queue and, hence, there can be no equilibrium. Frictions of various sorts can be invoked to circumvent this problem.

Pro rata priority rules and minimum price variation: Glosten (1994) analyzed minimum price variation with a pro rata secondary priority rule with an infinite number of perfectly competitive risk neutral limit order traders so what follows will be brief. In tier k, $\frac{\min(Q_t, \underline{q}_k) - \underline{q}_{k-1}}{\underline{q}_k - \underline{q}_{k-1}}$ percent of each order is executed when a market order for $Q_t \ge \underline{q}_{k-1} > 0$

shares arrives. The analogue of the risk neutral benefit (6) in this case is:

$$P_{k}\left[\int_{\underline{q}_{k-1}}^{\underline{q}_{k}}\frac{q-\underline{q}_{k-1}}{\underline{q}_{k}-\underline{q}_{k-1}}\psi_{t}(q)dq+\int_{q\geq\underline{q}_{k}}\psi_{t}(q)dq\right]$$

while the corresponding analogue of the risk neutral cost (7) is:

$$\int_{\underline{q}_{k-\text{sgn}_{k}}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-\text{sgn}_{k}}}{\underline{q}_{k} - \underline{q}_{k-\text{sgn}_{k}}} \psi_{t}(q) V_{t}(q) dq + \int_{q \ge \underline{q}_{k}} \psi_{t}(q) V_{t}(q) dq$$

where the second integral in both expressions is unweighted because each limit order is fully executed if the market order exhausts the depth at tier q. Hence, the tier k price is given by:

$$P_{k} = \frac{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) V_{t}(q) dq + \int_{q \ge \underline{q}_{k}} \psi_{t}(q) V_{t}(q) dq}{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) dq + \int_{q \ge \underline{q}_{k}} \psi_{t}(q) dq}$$

under the pro rata priority rule. Note that $\frac{q-\underline{q}_{k-1}}{\underline{q}_k-\underline{q}_{k-1}}$ is also the cumulative uniform distribution

function over the range $\underline{q}_k - \underline{q}_{k-1}$ so random allocation has the same pricing implications as pro rata execution. The marginal order in tier k is placed such that limit order traders do not earn rents and, hence, the right derivative of this expression at \underline{q}_k is equal to zero:

$$0 = \frac{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) V_{t}(q) dq}{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) dq + \int_{\underline{q} \ge \underline{q}_{k}} \psi_{t}(q) dq} - P_{k} \frac{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) dq}{\int_{\underline{q}_{k-1}}^{\underline{q}_{k}} \frac{q - \underline{q}_{k-1}}{\underline{q}_{k} - \underline{q}_{k-1}} \psi_{t}(q) dq + \int_{\underline{q} \ge \underline{q}_{k}} \psi_{t}(q) dq}$$

which can be solved for the numerator of the first term in the revised upper tail expectation. Substitution of the solution into the numerator yields the simple upper tail expectation:

$$P_{k} = \frac{\int_{q \ge \underline{q}_{k}} \psi_{t}(q) V_{t}(q) dq}{\int_{q \ge \underline{q}_{k}} \psi_{t}(q) dq} = E_{\psi} [\tilde{\mathbf{V}} | Q_{t} \ge \underline{q}_{k}, \mathscr{F}_{t-1}]$$

which is identical to the valuation formula for the unfettered limit order book. As Glosten (1998) emphasized, free entry coupled with perfect competition insures that the orders at tier k exactly break even, which is equivalent to the force of arbitrage in this context.

Derivation of (16): The combination of (5) and (15) yields:

$$\begin{split} P_{t}(q) &= \frac{\int_{u \leq q} \psi_{t}(u) V_{t}(u) du}{\int_{u \leq q} \psi_{t}(u) du} = \frac{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) V_{t-1}(u + Q_{t-1}) du}{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) du} \\ &= \frac{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) V_{t-1}(u + Q_{t-1}) du}{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) du} + \frac{\int_{u \geq q} \psi_{t-1}(u + Q_{t-1}) V_{t-1}(u + Q_{t-1}) du}{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) du} \\ &- \frac{\int_{u \geq q} \psi_{t-1}(u + Q_{t-1}) V_{t-1}(u + Q_{t-1}) du}{\int_{u \leq q} \psi_{t-1}(u + Q_{t-1}) du} \\ &= \frac{\Psi_{t-1}(0) P_{t-1}(0^{-}) + [1 - \Psi_{t-1}(0)] P_{t-1}(0^{+}) - [1 - \Psi_{t-1}(q + Q_{t-1})] P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})} \\ &= \frac{P_{t-1}(0) - [1 - \Psi_{t-1}(q + Q_{t-1})] P_{t-1}(q + Q_{t-1})}{\Psi_{t-1}(q + Q_{t-1})} \end{split}$$

Derivation of (19): It is easy to analyze the discrete case separately and to insure that the end result is compatible with that for the continuous case given in (18). For $q \in BF(Q_{t-1}) = [-1, -Q_{t-1}]$ for $Q_{t-1} > 0$ we have:

$$\begin{split} P_{t}(q) &= \frac{\sum_{u \leq q} \psi_{t}(u) V_{t}(u)}{\sum_{u \leq q} \psi_{t}(u)} \\ &= \frac{\sum_{u \leq q} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq) V_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)}{\sum_{u \leq q} \psi_{t-1}(u + Q_{t-1} + 1_{q \in BF(Q_{t-1})} \operatorname{sgn}_{Q_{t-1}} dq)} \\ &= \frac{\sum_{u \leq q} \psi_{t-1}(u + Q_{t-1}) V_{t-1}(u + Q_{t-1})}{\sum_{u \leq q} \psi_{t-1}(u + Q_{t-1})} 1_{q \notin BF(Q_{t-1})} \\ &+ \frac{\sum_{u \leq q} \psi_{t-1}(u + Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq) V_{t-1}(u + Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq)}{\Psi_{t-1}(q + Q_{t-1} + \operatorname{sgn}_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \end{split}$$

to which $\frac{\sum_{u \ge q+dq} \psi_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)V_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}\mathbf{1}_{q \in BF(Q_{t-1})} \text{ can be added and }$

subtracted, yielding:

$$\begin{split} P_{t}(q) &= P_{t-1}(q+Q_{t-1}+l_{q\in BF(Q_{t-1})}sgn_{Q_{t-1}}dq)l_{q\notin BF(Q_{t-1})} \\ &+ \frac{\sum_{u\leq q}\psi_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)V_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}l_{q\in BF(Q_{t-1})} \\ &+ \frac{\sum_{u\geq q+dq}\psi_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)V_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}l_{q\in BF(Q_{t-1})} \\ &- \frac{\sum_{u\geq q+dq}\psi_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)V_{t-1}(u+Q_{t-1}+sgn_{Q_{t-1}}dq)}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}l_{q\in BF(Q_{t-1})} \\ &= P_{t-1}(q+Q_{t-1}+l_{q\in BF(Q_{t-1})}sgn_{Q_{t-1}}dq)l_{q\notin BF(Q_{t-1})} + \frac{P_{t-1}(0)}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}l_{q\in BF(Q_{t-1})} \\ &- \frac{[1-\Psi_{t-1}(q+Q_{t-1}+2sgn_{Q_{t-1}})]P_{t-1}(q+Q_{t-1}+2sgn_{Q_{t-1}})}{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}l_{q\in BF(Q_{t-1})} \end{split}$$

where the last term arises only in the minimum lot size case for which dq = 1. The backfilling terms are completed by adding and subtracting $P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq) I_{q \in BF(Q_{t-1})}$ and $P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)$

$$\frac{\Gamma_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})}$$
 which results in:

$$\begin{split} P_{t}(q) &= P_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) 1_{q \notin BF(Q_{t-1})} \\ &+ P_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) 1_{q \notin BF(Q_{t-1})} \\ &+ \frac{P_{t-1}(0)}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} - \frac{P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &+ \frac{P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} - P_{t-1}(q + Q_{t-1} + 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) 1_{q \notin BF(Q_{t-1})} \\ &= P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq) 1_{q \in BF(Q_{t-1})} sgn_{Q_{t-1}} dq) + \frac{P_{t-1}(0) - P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &+ \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &+ \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q + Q_{t-1} + 2sgn_{Q_{t-1}})}{\Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}} dq)} 1_{q \in BF(Q_{t-1})} \\ &- \frac{[1 - \Psi_{t-1}(q + Q_{t-1} + sgn_{Q_{t-1}})]P_{t-1}(q$$

which is identical to (17) in the continuous case since dq is then equal to zero. Following a market sell order, the expression has the same structure except the denominator is equal to $1-\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}} dq)$ and the numerators in the second and third lines include $\Psi_{t-1}(q+Q_{t-1}+2sgn_{Q_{t-1}} dq)$ and $\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}} dq)$, respectively. These modifications yield the pricing relation:

$$\begin{split} P_{t}(q) &= P_{t-1}(q+Q_{t-1}+1_{q\in BF(Q_{t-1})}sgn_{Q_{t-1}}dq) + \frac{P_{t-1}(0)-P_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}{1-\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}1_{q\in BF(Q_{t-1})} \\ &- \frac{\Psi_{t-1}(q+Q_{t-1}+2sgn_{Q_{t-1}}dq)P_{t-1}(q+dQ_{t-1}+2sgn_{Q_{t-1}}dq)}{1-\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}1_{q\in BF(Q_{t-1})} \\ &+ \frac{\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)P_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}{1-\Psi_{t-1}(q+Q_{t-1}+sgn_{Q_{t-1}}dq)}1_{q\in BF(Q_{t-1})} \end{split}$$

Combining the two expressions produces (19):

$$\begin{split} \mathsf{P}_{t}(q) &= \mathsf{P}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{1}_{q \in \mathsf{BF}(\mathsf{Q}_{t-1})} \operatorname{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \\ &+ \frac{\mathsf{P}_{t-1}(0) - \mathsf{P}_{t-1}(q + \mathsf{Q}_{t-1} + \operatorname{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)}{\mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \operatorname{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \mathsf{1}_{\mathsf{Q}_{t-1} > 0} + [1 - \mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \operatorname{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{1}_{\mathsf{Q}_{t-1} < 0}} \mathsf{1}_{q \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &+ \frac{[\mathsf{1}_{\mathsf{Q}_{t-1} > 0} - \mathsf{sgn}_{\mathsf{Q}_{t-1}} \, \mathscr{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{1}_{\mathsf{Q}_{t-1} > 0} + [1 - \mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{1}_{\mathsf{Q}_{t-1} < 0}} \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &- \frac{[\mathsf{1}_{\mathsf{Q}_{t-1} > 0} - \mathsf{sgn}_{\mathsf{Q}_{t-1}} \, \mathscr{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{2} \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{P}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{2} \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)}{\mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \mathsf{1}_{\mathsf{Q}_{t-1} > 0} + [1 - \mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{1}_{\mathsf{Q}_{t-1} < 0}} \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &- \frac{[\mathsf{1}_{\mathsf{Q}_{t-1} > 0} - \mathsf{sgn}_{\mathsf{Q}_{t-1}} \, \mathscr{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{2} \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)] \mathsf{1}_{\mathsf{Q}_{t-1} < 0} + [1 - \mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{2} \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)}{\mathsf{\Psi}_{t-1}(q + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)} \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &= \mathsf{P}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \mathsf{1}_{\mathsf{Q}_{t-1} < \mathsf{q}} + \mathsf{q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \\ &+ \frac{\mathsf{P}_{t-1}(\mathsf{O}) - \mathsf{P}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)}{\mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})}} \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &+ \frac{\mathscr{\Psi}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \mathsf{V}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q)}{\mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})}} \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &= \mathsf{P}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1}) + \mathsf{sgn}_{\mathsf{Q}_{t-1}} \mathsf{d}q) \\ \\ &+ \frac{\mathscr{\Psi}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})}) \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1})} \\ &= \mathsf{P}_{t-1}(\mathsf{q} + \mathsf{Q}_{t-1} + \mathsf{1}_{\mathsf{q} \in \mathsf{BF}(\mathsf{Q}_{t-1}) + \mathsf{sgn}_{\mathsf{Q}_{t-1}}$$

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