# Liquidity Provision of Limit Order Trading in the Futures Market Under Bull and Bear Markets

MIN-HSIEN CHIANG, TSAI-YIN LIN AND CHIH-HSIEN JERRY YU\*

**Abstract:** This study investigates how limit orders affect liquidity in a purely order-driven futures market. Additionally, the possible asymmetric relationship between market depth and transitory volatility in bull and bear markets and the effect of institutional trading on liquidity provision behavior are examined as well. The empirical results demonstrate that subsequent market depth increases as transient volatility increases in bull markets. Market depth exhibits significantly positive relationship to subsequent transient volatility in bull markets. Additionally, although trading volume positively influences transient volatility in bull markets, no such relationship exists in bear markets. Liquidity provision decreases when institutional trading activity intensifies during bear markets. Thus, liquidity provision for limit orders differs between bull and bear markets.

Keywords: market depth, limit order, bull and bear markets, institutional trading, liquidity

## 1. INTRODUCTION

Issues related to the liquidity provision of limit orders in the market microstructure have received extensive attention in recent years and have been explored from various perspectives. Glosten (1994) developed an equilibrium model within a limit order market in which patient liquidity traders provide market liquidity by submitting limit orders while urgent traders, normally acting on private information, submit market orders for matching against limit orders. Liquidity traders suffer losses from trading against informed traders, but even so can achieve net gains by trading against other liquidity traders, which makes the limit order market function. Seppi (1997) investigated the submission strategy of investors faced with different costs in a market

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structure (similar to the NYSE) in which active traders submit market orders, value traders submit limit orders, a specialist clears the market and a trading crowd submits limit orders to establish the limit order book. Handa and Schwartz (1996) extended Glosten's (1994) model to consider investor choice between limit and market orders in an order-driven market. They suggested that an increase in short-term price volatility tends to attract more limit orders, since the gains from trading against liquidity traders could exceed the losses from trading against informed traders. In a dynamic game setting within which current order flows influence subsequent order flows, Parlour (1998) proposed that more limit orders are submitted when the probability of executing limit orders exceeds that of the market orders. Finally, Foucault (1999) examined equilibrium in an order-driven market and proposed that liquidity traders tend to submit more limit orders when asset volatility is higher, since they face a higher risk of being picked off by submitting market orders.

Previous empirical studies have shown that liquidity provision of limit orders is related to the price volatility caused by limit order submission. Biais et al. (1995) studied the order flow of a limit order book on the Paris Bourse, a purely orderdriven market without any designated market makers. They found that limit order traders trade more aggressively when competition between limit orders is intense. Using the trading data of Dow Jones Industrial stocks traded on the NYSE, Handa and Schwartz (1996) found that limit order flows can be influenced by the shortterm price volatility associated with a paucity of limit orders. When examining the liquidity provision of limit orders on the NYSE, Kavajecz (1999) revealed that limit order traders reduce the market depth to achieve two goals: avoiding the adverse selection problems related to information uncertainty and mitigating uncertainty during volatile trading periods. Extending the work of Kavajecz (1999), Chung et al. (1999) examined limit orders on the NYSE and found that limit orders increase as asset volatility and transaction volume increase. In analysis of another purely order-driven market, namely the Stock Exchange of Hong Kong (SEHK), Ahn et al. (2001) found that market depth increases following a rise in transient volatility. Additionally, the market depth of buy and sell orders is influenced by transient volatility arising from the buy and sell sides, respectively.

This paper attempts to extend the research of Ahn et al. (2001) to study the futures market. Market depth in the futures market and the use of trading order flow data have seldom been considered. Examples include a study by Bessembinder and Sequin (1993) investigating the market depth of eight futures contracts by analyzing daily open interest data and a study by Pirrong (1996) analyzing trading volume to infer Bund contract liquidity. The futures contract examined in this investigation involves the TAIEX futures, which is based on the Taiwan Stock Exchange Capitalization Weighted Stock Index (TAIEX). The TAIEX futures contract was the first futures contract traded on the Taiwan Futures Exchange (TAIFEX). The TAIFEX adopted a purely order-driven market with a continuous trading structure and no designated market makers obliged to provide market liquidity on futures trading.<sup>1</sup> All trades are routed through the Electronic Trading System (ETS). The daily average trading volume of the TAIEX futures contracts in 1999 to 26,163 contracts in 2003.

<sup>1</sup> It is noted that the Taiwan Futures Exchange launched a market maker system on some inactive futures products on October 8, 2007, to boost trading activities on these inactive futures products. Still, the Taiwan Futures Exchange maintains a purely order-driven market system on the TAIEX futures contract.

Thus, the TAIEX futures contract is the most active index futures contract traded on the Taiwan Futures Exchange (TAIFEX) since its establishment in 1998.

Additionally, the research framework of this study examined upward and downward trends. The empirical evidence of previous asset price studies indicates that capital markets exhibit asymmetric responses to these different trends. French et al. (1987) indicated that stock volatility may unexpectedly increase when stock returns are negative. Examining the volatility of S&P composite portfolio returns from 1928 to 1987, Schwert (1989) reported that increased volatility had a stronger association with negative returns than with positive returns. Engle and Ng (1993), in a comparative study of several asymmetric volatility models, suggested that negative return shocks have a greater impact than positive return shocks. In addition, Koutmos (1998) found that negative returns generate higher volatility, and information regarding negative returns is reflected in market prices faster than that regarding positive returns. Consequently, determining whether the liquidity provision differs between bull and bear markets is worth further inquiry.

The possible impact of institutional trading on the relationship between transient volatility and market depth is examined in this study as well. The trading activity of institutional traders might have an influential effect on liquidity provision behavior in futures markets. Institutional investors are assumed to have information superior to that of individual investors, since institutional investors actively engage in inhouse analysis. Bessembinder and Seguin (1993) indicated that the effect of trading volume on futures return volatility might depend on trader types. Daigler and Wiley (1999) found that traders with much more precise information about order flow, such as clearing members and floor traders, reduce futures return volatility while individual investors often increase futures return volatility due to a lack of order flow information. Additionally, Wiley and Daigler (1998) discovered that the trading activity of individual investors correlates with that of investors with superior information. Thus, the futures trading activity of each investor type is reactive to that of other investor types. Therefore, liquidity provision behavior may be provoked by liquidity traders in reaction to institutional trading activity.

The empirical results regarding the influence of transient volatility on subsequent market depth demonstrate that the market depth of limit orders increases following a rise in transient volatility in the bull market, while the market depth of limit orders decreases following a rise in transient volatility in the bear market. Restated, the positive relationship between transient volatility and subsequent market depth proposed by Handa and Schwartz (1996) and confirmed in Ahn et al. (2001) in an analysis of the SEHK occurs in bull markets for TAIEX futures but not in bear markets. This asymmetric response of market depth to changes in transient volatility may be due to the fact that information asymmetry and the probability of losses to informed traders are higher in bear markets. Consequently, liquidity traders tend to trade more conservatively when the market is downwards. This study also finds that, under conditions of increased trading intensity, the quoted size of limit orders increases but the number of limit orders decreases. Therefore, liquidity traders tend to increase their quoted size if the higher trading intensity exhausts their submitted orders. Further, in bull markets, liquidity traders tend to submit limit orders on buy and sell sides due to increased transient volatility on the sell side, whereas in bear markets liquidity traders place more limit buy (sell) orders than market orders when the transient volatility increases on the buy (sell) side.

In contrast with the findings of Handa and Schwartz (1996) and Ahn et al. (2001), the increased influx of limit orders does not significantly reduce the subsequent transient volatility. Additionally, this study also reveals a significant positive relationship between trading volume and transient volatility in bull markets. Consequently, distinguishing between bull and bear markets helps to elucidate the trading behavior of liquidity traders. As for the impact of institutional trading activity on liquidity provision behavior, increased institutional trading activity reduces the liquidity provision under higher transient volatility in bear markets, while order submission is more aggressive when institutional traders are less active. Hence, liquidity traders do not trade aggressively during bear markets and in trading days with higher institutional trading, since the chances of losing to informed institutional traders are much higher.

The remainder of this paper is organized as follows. Section 2 outlines the hypotheses of the paper and describes the market structure of the Taiwan Futures Exchange. Section 3 then describes the study data, empirical methodology and construction of variables. Subsequently, Section 4 outlines and discusses the empirical results of the study. Finally, Section 5 presents the conclusions.

## 2. HYPOTHESES AND MARKET DESCRIPTION

## (i) Hypotheses

Handa and Schwartz (1996) developed a framework for analyzing investor choice between limit and market orders in a purely order-driven market. Following Glosten (1994), Handa and Schwartz (1996) designed a framework that incorporated two types of traders: patient traders, also known as liquidity traders, who submit limit orders and provide liquidity to the market, and urgent traders, who submit market orders for immediate execution. Liquidity traders gain when trading against other liquidity traders, but lose when trading against informed traders. Limit orders increase when short-run volatility increases. This phenomenon occurs because short-term volatility can result from temporary order imbalances due to a paucity of limit orders. Therefore, limit orders placed by liquidity traders are likely to be matched against limit orders placed by other liquidity traders when short-run volatility is higher. Foucault (1999) also indicated that, during high volatility, liquidity traders submit limit orders instead of market orders since liquidity traders face a higher risk of being picked off by informed traders. Thus, the following hypothesis is proposed:

H1: Market depth increases (decreases) following an increase (a decrease) in short-term volatility.

Conversely, the increased influx of limit orders because of increased short-term volatility continues until short-run volatility is reduced by price reversion. Therefore, a reduction in short-run volatility leads to a decline in submission of limit orders. The following hypothesis is thus developed:

 $H_2$ : An increase (decrease) in market depth is followed by a decrease (an increase) in short-run volatility.

Asymmetric responses to bull and bear markets are well documented in the literature. Generally, negative returns generate more unexpected volatility than positive returns. (e.g., French et al., 1987; and Schwert, 1989) Accordingly, Engle and Ng (1993) demonstrated a news impact curve with an asymmetric pattern, in which negative return shocks increase predictable volatility more than positive return shocks. In an analysis of stock indices in nine countries, Koutmos (1998) found that markets reflect bad news faster than good news. This phenomenon occurs because investors are highly risk averse in a downward market. Thus, the volatility generated in declining markets is more permanent than that generated in increasing markets, meaning that transient volatility is more common in bull markets. The evidence of asymmetric reactions in bull and bear markets yields the following hypothesis:

 $H_3$ : The relationship between market depth and transient volatility is much stronger in bull markets than in bear markets.

Institutional traders are major players in securities markets. Stock price movements are disproportionately affected by the larger cumulative impact of orders submitted by institutional traders with superior information (Chakravarty, 2001). To test the proposal by Bessembinder and Seguin (1993) that trader types influence the effect of trading volume on futures return volatility, Daigler and Wiley (1999) found that better informed traders, such as clearing members and floor traders, reduce futures return volatility, while individual investors with little knowledge of order flow information increase futures return volatility. Wiley and Daigler (1998) showed that futures trading activity by less informed traders is a reactive trading behavior with relation to traders with better information. Therefore, institutional trading might influence liquidity provision in the futures market. Consequently, the following hypothesis is proposed:

H<sub>4</sub>: Liquidity provision behavior of limit orders is significantly influenced by institutional trading.

## (ii) The Taiwan Futures Market

The first futures contract traded on the Taiwan Futures Exchange (TAIFEX) was an index futures in which the underlying asset was the Taiwan Stock Exchange Capitalization Weighted Stock Index (TAIEX) (hereafter, TAIEX futures). The TAIEX futures were launched on July 21, 1998, and were traded using the in-house designed Electronic Trading System (ETS) from 8:45 a.m. to 1:45 p.m. Other than during the opening and closing periods, the ETS features a continuous trading system in which submitted orders are matched first by price priority and then by time priority.<sup>2</sup> The opening price is determined by orders submitted fifteen minutes before trading opens at 8:45 a.m. Orders then build up and are matched on a competitive auction basis via the ETS by price priority followed by time priority. The closing price is settled by the accumulated orders during one minute before 1:45 p.m.

The TAIFEX, a purely order-driven market, accepts two order types: limit orders and market orders. In addition to the transaction price and volume of the latest matched trade, the ETS system displays the five best bid and ask prices and the number of contracts demanded or offered at the five best bid and ask quotes.

<sup>2</sup> The continuous trading system was established on July 29, 2002. Before then, the ETS employed a batch-call system in which all submitted orders are matched at 10 second intervals.

### 3. EMPIRICAL DESIGN AND DATA

### (i) Construction of Variables

This study employed the variable construction methods of Ahn et al. (2001), and the time interval was fifteen minutes.<sup>3</sup>

## (a) Short-Term Price Volatility

The short-term price volatility  $(RISK_t)$  during the time interval *t* is defined as:

$$\operatorname{RISK}_{t} = \sum_{i=1}^{N} R_{i,t}^{2} \tag{1}$$

where  $R_{i,t}$  denotes the return of the *i*th transaction during time interval *t*, and *N* represents the total volume (number) of transactions within the time interval *t*. Meanwhile, the upside volatility (PRISK<sub>t</sub>) is calculated as  $\sum_{R_{i,t}>0} R_{i,t}^2$  for the positive return observations while the downside volatility (NRISK<sub>t</sub>) is calculated as  $\sum_{R_{i,t}<0} R_{i,t}^2$  for the negative return observations.

## (b) Market Depth and Order Flow

This study measures market depth based on the order size and the order number. The market depth (DEPTHVOL<sub>t</sub>(DEPTHORD<sub>t</sub>)) is determined by total limit order size (number of limit orders) posted at the best five bid and ask quotes at the end of time interval t. Further, the market depth at the bid and ask quotes (DEPTHVOL<sup>bid</sup><sub>t</sub>, DEPTHVOL<sup>ask</sup> (DEPTHORD<sup>bid</sup><sub>t</sub>, DEPTHORD<sup>ask</sup><sub>t</sub>)) is also calculated. The change in market depth over the interval t ( $\Delta$ DEPTHVOL<sub>t</sub> and  $\Delta$ DEPTHORD<sub>t</sub>) can be defined as:

$$\Delta \text{DEPTHVOL}_t = \text{NPLO}_t - \text{VOLUME}_t \tag{2}$$

$$\Delta \text{DEPTHORD}_t = \text{NPLON}_t - \text{NTRADE}_t \tag{3}$$

where NPLO<sub>t</sub> (NPLON<sub>t</sub>) denotes the size (number) of newly placed limit orders during time interval t, and VOLUME<sub>t</sub> (NTRADE<sub>t</sub>) is the size (number) of trades during time interval t. The variable  $\Delta$ DEPTHVOL<sub>t</sub> ( $\Delta$ DEPTHORD<sub>t</sub>) measures the order-flow information related to the preferences of liquidity traders who submit limit orders rather than market orders. Additionally, the buy side order-flow information for the size (number) of orders is calculated as follows: (DIFFVOL<sup>buy</sup><sub>t</sub> (DIFFORD<sup>buy</sup><sub>t</sub>))

$$DIFFVOL_t^{buy} = \Delta DEPTHVOL_t^{bid} + VOLUME_t^{sell} - VOLUME_t^{buy}$$
(4)

$$\text{DIFFORD}_{t}^{buy} = \Delta \text{DEPTHORD}_{t}^{bid} + \text{NTRADE}_{t}^{sell} - \text{NTRADE}_{t}^{buy}$$
(5)

3 We also conduct our analysis in 10-minute and 30-minute intervals and the results are qualitatively the same as with a 15-minute interval.

where  $\Delta \text{DEPTHVOL}_{t}^{bid}$  ( $\Delta \text{DEPTHORD}_{t}^{bid}$ ) is the change in market depth measured as the size (number) of trades at the bid side,  $\text{VOLUME}_{t}^{sell}$  (NTRADE $_{t}^{sell}$ ) is the trading size (number) at the sell side and  $\text{VOLUME}_{t}^{buy}$  (NTRADE $_{t}^{buy}$ ) is the trading size (number) at buy side. The DIFFVOL $_{t}^{buy}$  (DIFFORD $_{t}^{buy}$ ) assesses the difference between newly placed limit orders and market orders at the buy side. Similar variables can be developed for order-flow information at the sell side, as follows:

$$\text{DIFFVOL}_{t}^{sell} = \Delta \text{DEPTHVOL}_{t}^{ask} + \text{VOLUME}_{t}^{buy} - \text{VOLUME}_{t}^{sell}$$
(6)

$$DIFFORD_t^{sell} = \Delta DEPTHORD_t^{ask} + NTRADE_t^{buy} - NTRADE_t^{sell}$$
(7)

where  $\Delta \text{DEPTHVOL}_{t}^{ask}$  ( $\Delta \text{DEPTHORD}_{t}^{ask}$ ) is the change in market depth measured as the trading size (number) at the ask side.

## (ii) Bull and Bear Markets

This study employs the definition and method for bull and bear markets devised by Lunde and Timmermann (2004). The advantage of their method is its capability of partitioning and differentiating data series into mutually exclusive and exhaustive bull and bear market subsets, which enables systematic analysis of up and down movement rather than merely short-term price movement.

Assuming  $I_t$  is a bull market indicator with a value of 1 if the stock market is a bull market at time t and zero otherwise, the current price at time t is  $P_t$ ,  $\lambda_1$  is the threshold percentage of price movement triggering a switch from a bear market to a bull market, and  $\lambda_2$  is the threshold percentage of price movement triggering a switch from a bull market, where to a bear market. Further, if the stock market is currently at a local maximum, where  $I_t = 1$ , the current maximum price is  $P_t^{max} = P_t$ . The stopping time variables  $\tau_{max}$  and  $\tau_{min}$  then are defined as follows:

$$\tau_{max}(P_t^{max}, t \mid I_t = 1) = \inf \left\{ t + \tau : P_{t+\tau} \ge P_t^{max} \right\}$$
(8)

$$\tau_{min} \left( P_t^{max}, t, \lambda_2 \mid I_t = 1 \right) = \inf \left\{ t + \tau : P_{t+\tau} < (1 - \lambda_2) P_t^{max} \right\}$$
(9)

where  $\tau \ge 1$ . Let  $\tau_s = \min(\tau_{max}, \tau_{min})$  denote the first passage time at which the stock price crosses one of two threshold values,  $P_t^{max}$  and  $(1 - \lambda_2)P_t^{max}$ . If  $\tau_s = \tau_{max}$ , meaning that the bull market continues until time  $t + \tau_s$ , the current maximum price is updated to the stock price at time  $t + \tau_s$ , namely,  $P_{t+\tau_s}^{max} = P_{t+\tau_s}$ .

Conversely, if  $\tau_s = \tau_{min}$ , then the stock price falls and crosses through the threshold barrier  $(1 - \lambda_2)P_t^{max}$  between t and  $t + \tau_s$ . Accordingly, the stock market enters a bear market phase at time t and continues until time  $t + \tau_s$ . The current minimum price is set as equal to the stock price at time  $t + \tau_s$ , namely,  $P_{t+\tau_s}^{min} = P_{t+\tau_s}$ . When the stock price is at the local minimum when  $I_t = 0$ , the stopping time variables  $\tau_{max}$  and  $\tau_{min}$ are defined as follows:

$$\tau_{max} \left( P_t^{min}, t, \lambda_1 \mid I_t = 0 \right) = \inf \left\{ t + \tau : P_{t+\tau} > (1 + \lambda_1) P_t^{min} \right\}$$
(10)

$$t_{min}(P_t^{min}, t \mid I_t = 0) = \inf \{ t + \tau : P_{t+\tau} \le P_t^{min} \}$$
(11)

where  $\tau \ge 1$ . Let  $\tau_s = \min(\tau_{max}, \tau_{min})$  denote the first passage of time during which the stock price crosses over one of two threshold values  $P_t^{min}$  and  $(1 + \lambda_1)P_t^{min}$ . If  $\tau_s = \tau_{min}$ , the bear market continues until time  $t + \tau_s$ , and the current minimum price is updated to the stock price at time  $t + \tau_s$ , i.e.,  $P_{t+\tau_s}^{min} = P_{t+\tau_s}$ . If  $\tau_s = \tau_{max}$ , the stock price rises and crosses through the threshold barrier,  $(1 + \lambda_1)P_t^{min}$  between t and  $t + \tau_s$ . Thus, the stock market enters a bull market phase at time t, and this phase continues until time  $t + \tau_s$ . The current maximum price is then set as equal to the stock price at time  $t + \tau_s$ , i.e.,  $P_{t+\tau_s}^{max} = P_{t+\tau_s}$ . This justification process of bull and bear markets is repeated until all the data has been used up.

The above process regarding the bull and bear markets depends on the threshold percentage values of  $\lambda_1$  and  $\lambda_2$ . The difficulty of switching from bear (bull) to bull (bear) markets increases with the values of  $\lambda_1$  ( $\lambda_2$ ). Therefore, this study considers four pairs, namely ( $1\sigma_s$ ,  $1\sigma_s$ ), ( $0.5\sigma_s$ ,  $0.5\sigma_s$ ), ( $1\sigma_s$ ,  $0.5\sigma_s$ ) and ( $0.5\sigma_s$ ,  $1\sigma_s$ ),<sup>4</sup> denoted as BB1, BB2, BB3 and BB4, respectively, where  $\sigma_s$  represents the daily standard deviation of the TAIEX index returns from 2002 to 2003.

## (iii) Data

The intradaily data for TAIFEX futures contracts were obtained from the *Taiwan Economic Journal (TEJ)* database from 2002 to 2003, which includes 497 trading days. The *TEJ* database contains price-and-volume records with all transactions and quotes recorded up to the nearest second via a time stamp. Meanwhile, the quote records of the *TEJ* database contain the five best bid and ask quotes, the number of futures contracts and the number of orders made at each of the five best bid and ask quotes. The futures contracts are generally the most actively traded contracts and are rolled over to the next nearby futures contract five days before expiration to avoid the expiration effect. To elucidate the influence of institutional trading<sup>5</sup> on liquidity provision behavior, the ratio of daily institutional trading to total trading volume in one day is computed.<sup>6</sup> Sample data are then classified as high or low institutional trading subsamples according to the medium of the institutional trading ratios.

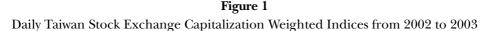
Figure 1 shows the daily Taiwan Stock Exchange Capitalization Weighted indices (TAIEX) during the sample period. The movement of the TAIEX was roughly downward in 2002 but upward in 2003. Figure 2 illustrates patterns of market depth and price volatility for twenty 15-minute intervals during a trading day. Similar to the findings of Ahn et al. (2001), Biasi et al. (1995) and Chung and Zhao (2004), a U-shaped volatility pattern and an inverted U-shaped market depth pattern are observed. This statistical result is consistent with Biais et al. (1995), Ahn et al. (2001) and Chung and Zhao (2004). Thus, volatility and market depth are influenced by a seasonality effect.

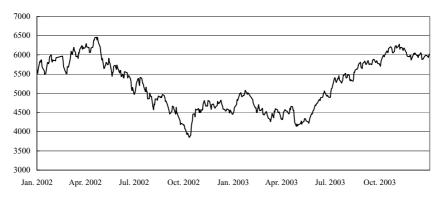
Table 1 lists the basic descriptive statistics for the TAIEX futures sample studied here. For the entire data set, the average trading volume of 17,670 contracts per day is much higher than the average 3,652 contracts per day during 1999. The average

<sup>4</sup> Several other threshold values were tried as well and results were similar to those reported here.

<sup>5</sup> Institutional traders include security and futures dealers, commodity pool operators, mutual fund managers and commercial firms.

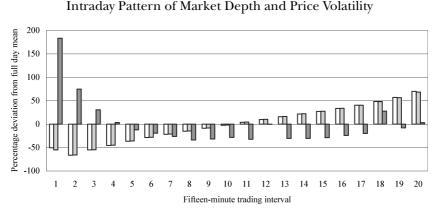
<sup>6</sup> There are five trading days without institutional trading data. Therefore, the number of observations for empirical results of the institutional trading effect is 492 trading days.





This graph displays the pattern of daily Taiwan Stock Exchange Capitalization Weighted Indices from 2002 to 2003, which includes 497 trading days.

Figure 2



□ Limit order size □ Number of limit orders □ Volatility

Notes:

This graph displays means of limit order size, number of limit orders, and price volatility. All data are shown as percentage deviations from their respective full-day averages for each of the 20 fifteen-minute trading intervals into which the trading day is divided (from 8:45 a.m. to 1:45 p.m.).

number of trades is 9,639. Further, the mean spread is 2.231 index points, which exceeds one tick size of one index point. Generally, the means of cumulative returns, trading volume, number of trades, order imbalance by size and number of orders and institutional trading ratios were larger in 2003 than in 2002, while the average spread was larger in 2002. A possible explanation is the differing trends between 2002 and 2003. Therefore, the following empirical analyses separate sample data into 2002 and 2003 subsamples to compare liquidity provision behavior for these two years.

Table 2 lists the basic descriptive statistics of data in bull and bear markets. Generally, average cumulative return is positive in bull markets, while average cumulative return

		*				0			
Variable	Price	Spread	Spread (%)	Return	No. of Trades	Volume	Imb_Order	Imb_Vol	Inst_Ratio
Panel A	: Whole P	eriod							
Mean	5,182	2.231	0.011	0.005	9,639	17,670	0.010	0.003	0.133
Std Dev	643	1.279	0.006	0.069	4,852	9,891	0.057	0.034	0.060
Min	3,853	1.235	0.005	-0.174	212	259	-0.342	-0.138	0.040
Median	5,181	1.950	0.010	0.006	9,385	16,567	0.008	0.001	0.122
Max	6,390	14.066	0.061	0.212	23,402	46,576	0.196	0.158	0.468
Obs	497	497	497	497	497	497	497	497	492
Panel B	: Year of	2002							
Mean	5,203	$2.701^{***}$	$0.013^{***}$	$-0.010^{***}$	8,187***	13,936***	0.008	0.003	$0.096^{***}$
Std Dev	657	1.568	0.007	0.073	3,909	6,637	0.052	0.083	0.032
Min	3,853	1.490	0.007	-0.174	212	259	-0.342	-0.306	0.040
Median	5,158	2.274	0.011	-0.009	8,320	14,575	0.008	0.002	0.091
Max	6,390	14.066	0.061	0.212	20,688	34,992	0.196	0.376	0.258
Obs	248	248	248	248	248	248	248	248	243
	(49.9)	(49.9)	(49.9)	(49.9)	(49.9)	(49.9)	(49.9)	(49.9)	(49.4)
Panel C	: Year of	2003							
Mean	5,162	1.763	0.009	0.020	11,091	21,404	0.011	0.004	0.169
Std Dev	629	0.617	0.004	0.061	5,259	11,136	0.061	0.032	0.059
Min	4,123	1.235	0.005	-0.136	439	582	-0.175	-0.076	0.083
Median	5,204	1.593	0.008	0.020	10,970	20,546	0.007	0.001	0.156
Max	6,161	5.988	0.031	0.171	23,402	46,576	0.185	0.153	0.468
Obs	249	249	249	249	249	249	249	249	249
	(50.1)	(50.1)	(50.1)	(50.1)	(50.1)	(50.1)	(50.1)	(50.1)	(50.6)

Table 1
Descriptive Statistics for TAIFEX Trading from 2002 to 2003

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days during which there are five trading days without institutional trading data. Price is the daily price in index points for the most actively traded future contracts. Moreover, spread indicates the daily difference between the best bid and ask prices in index points. Furthermore, spread percentage is the daily percentage of the spread divided by the midpoint of the best bid and ask prices. Return is the cumulative daily return of Taiwan Stock Exchange Capitalization Weighted Index from t - 20 to t - 1. Number of trades is the daily outme of trades for the most actively traded futures contracts. Volume represents the average daily volume of trades for the most actively traded futures contracts. *Imb\_order* is the daily difference between number of buy and number of sell limit orders divided by the daily sum of number of buy and sell limit orders. *Imb\_vol* is the daily difference between the buy and sell limit order sizes divided by the sum of daily buy and sell limit sizes. Finally, *Inst\_ratio* represents the ratio of daily institutional trading volume to the daily trading volume. The ratios in parentheses show percentages of observations to the whole sample. Mann-Whitney-Wilcoxon tests are performed for the differences between all variables in 2002 and 2003. \*, \*\*, \*\*\*\* denote significance levels at 10%, 5% and 1%, respectively.

is negative in bear markets. Additionally, average spreads, average number of trades and average order imbalance by size are larger in bull markets than in bear markets. Although institutional trading ratios are slightly higher in bear markets, the increase is not statistically significant. Apparently, trading is much more intensive in bull markets than in bear markets, since the bull markets involve relatively higher average trading volume and higher average number of trades in all cases. Conversely, the order imbalance by number of orders is larger in bear than in bull markets. This shows that traders submit more limit buy orders than limit sell orders when the market undergoes a decline. This could be due to a greater information asymmetry problem in bear markets, which causes liquidity traders to submit limit buy orders instead of market buy orders to avoid the adverse selection problem on the buy side.

				Ratio	0.133 0.060	040	127	383	47	(50.2)			Ratio	0.132	00(	124	383	46	(0)
				Imb_Vol Inst_Ratic						-			Imb_Vol Inst_Ratic						-
				Imb_V	0.009 0.036	-0.135	0.00	0.158	251	(50.5)			$Imb_V$	0.011	-0.138	0.010	0.158	249	(50.1)
				Imb_Order	-0.010 0.058	-0.342	-0.010	0.196	251	(50.5)			Imb_Order	-0.014	-0.342	-0.012	0.196	249	(50.1)
				Volume	$18,694 \\ 10.549$	259	17,733	46,576	251	(50.5)			Volume	18,656	10,450 259	17,683	46,576	249	(50.1)
			Bull I	No. of Trades	10,125 5.190	212	9,935	23,390	251	(50.5)		Bull 2	No. of Trades	10,128	2,101 212	9,998	23,390	249	(50.1)
	kets			Return	$0.017 \\ 0.071$	-0.174	0.025	0.212	251	(50.5)			Return	0.014	-0.174				
	ar Mar			Spread (%)	$0.011 \\ 0.007$	0.005	0.010	0.061	251	(50.5)			Spread (%)	0.011	0.005	0.010	0.061	249	(50.1)
	and Be			Spread	$2.301 \\ 1.472$	1.250	1.926	14.066	251	(50.5)			Spread	2.290	1.403	1.943	14.066	249	(50.1)
	Bull a			Price	5,269 638	3,859	5,374	6,386	251	(50.5)			Price	5,252	3.859	5,348	6,390	249	(50.1)
Lable 4	in the	BBI		Imb_Vol Inst_Ratio	$0.133 \\ 0.060$	0.044	0.117	0.468	245	(49.8)	BB2		Inst_Ratio	0.134	0.044	0.120	0.468	246	(50.0)
14	of Data			Imb_Vol	$-0.003^{***}$ 0.031	-0.113	-0.005	0.143	246	(49.5)			Imb_Vol	$-0.005^{***}$	-0.113	-0.009	0.143	248	(49.9)
	Descriptive Statistics of Data in the Bull and Bear Markets			Imb_Order	$0.030^{***}$ 0.047	-0.089	0.027	0.184	246	(49.5)			Imb_Order	**1	-0.089				
	iptive S			Volume	$16,622^{***}$ 90,670	469	15,333	46,382	246	(49.5)			Volume	$16,677^{***}$	9,201 469	15,341	46,382	248	(49.9)
	Descr		Bearl	No. of Trades	$9,141^{***}$ 4,434							Bear2	No. of Trades	$9,147^{***}$	$^{4,4/0}_{372}$	8,849	23,402	248	(49.9)
				Return	-0.008***	-0.174	-0.008	0.207	246	(49.5)			Return	$-0.005^{***}$	-0.163	-0.003	0.207	248	(49.9)
				Spread (%)	$0.011 \\ 0.005$	0.005	0.010	0.044	246	(49.5)			Spread (%)	0.011	0.005	0.010	0.044	248	(49.9)
				Spread	$2.159 \\ 1.044$	1.235	1.956	10.115	246	(49.5)			Spread	2.172	1.235	1.950	10.115	248	(49.9)
				Price	$5,094^{***}$ 637	3,853	5,027	6,390	246	(49.5)			Price	$5,113^{***}$	009 3.853	5,027	6,344	248	(49.9)
				Variable	Mean Std Dev	Min	Median	Мах	Obs				Variable		Min				

Table 2

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									(nontintine)	mont								
									BB3									
					Bear3									Bull 3				
Variable	Price	Spread	Spread (%)	Returm	No. of Trades	Volume	Imb_Order	Imb_Vol	Inst Ratio	Pnice	Spread	Spread (%)	Return	No. of Trades	Volume	Imb_Order	Imb_Vol	Inst Ratio
	Z 100***	2145	110.0	***30000	0.100***	10 700***	***00000	0.004***	0.1.90	200 X	0 990	110.0	1100	03101	10.004	0.014	1100	0.1.0.0
INCALL 6:115	0,1,0	000 F	110.0		0,101	10,124	070 0	F00.0	401.0	0,400	400.4	110.0	110.0	10,100 7 010	10,01	ET0.01	110.0	1000
Std Dev	$^{045}$	1.029	c00.0	0.064	4,452	9,183	0.048	0.031	0.099	037	016.1	0.007	0.072	5,242	10,585	0.058	0.036	0.061
Min	3,853	1.235	0.005	-0.174	372	469	-0.124	-0.113	0.044	3,859	1.250	0.005	-0.174	212	259	-0.342	-0.138	0.040
Median	5,117	1.940	0.010	-0.005	8,849	15,687	0.027	-0.006	0.119	5,291	1.955	0.010	0.027	9,998	17,733	-0.012	0.010	0.126
Max	6.390	10.115	0.044	0.207	23.402	46.382	0.184	0.143	0.468	6.386	14.066	0.061	0.212	23.390	46.576	0.196	0.158	0.383
Obs	268	268	268	268	268	268	268	268	266	229	229	229	229	229	229	229	229	226
	(53.9)	(53.9)	(53.9)	(53.9)	(53.9)	(53.9)	(53.9)	(53.9)	(54.1)	(46.1)	(46.1)	(46.1)	(46.1)	(46.1)	(46.1)	(46.1)	(46.1)	(45.9)
									BB4									
					Bear4									Bull 4				
			Shread		No of							Shread		No of				
Variable	Price	Spread	(%)	Return	Trades	Volume	Imb_Order	$Imb_Vol$	Inst_Ratio	Price	Spread	(%)	Return	Trades	Volume	Imb_Order	Imb Vol Inst Ratio	Inst_Ratio
Mean	5 094***	9 1 7 3	0.011	$-0.007^{***}$	9 1 3 3***	16 635***	0 039***	$-0.004^{***}$	0 134	5 959	9 981	0 011	0.015	10 077	18 566	-0.010	0.009	0.139
Std Day	630	1 075	0.005	0.064	1441	0 119	0.046	0.031	0.061	638	1 1 2 2 2	0.006	0.079	5 140	10,459	0.058	0.036	0.050
	0.00	2001	200.0	100.0	040	1110	00000	0110	100.0	020	CCT.T	20000	11000	010	0.01	0000	00000	0100
	0,000 1,000	2221	600.0	COT.0-	210	7, 901	600.0-	CTT-0-	110.0	2,009 7 864	002.1	C00.0	±/1.0-	717	607 H	240.0-	061.0-	0±0.0
Median	4,990	1.955	0.010	-0.006	8,830	15,331	0.028	-0.000	0.118	5,364	1.926	010.0	0.022	9,905	17,583	-0.010	0.009	0.125
Max	6,390	10.115	0.044	0.207	23,402	46,382	0.184	0.143	0.468	6,386	14.066	0.061	0.212	23,390	46,576	0.196	0.158	0.383
Obs	231	231	231	231	231	231	231	231	230	266	266	266	266	266	266	266	266	262
	(46.5)	(46.5)	(46.5)	(46.5)	(46.5)	(46.5)	(46.5)	(46.5)	(46.7)	(53.5)	(53.5)	(53.5)	(53.5)	(53.5)	(53.5)	(53.5)	(53.5)	(53.3)
<i>Notes:</i> The sau instituti the best prices.1 trades f is the d differen trading respecti markets	<i>Notes:</i> <i>Notes:</i> The sample period runs from Janu institutional trading data. Price is the the best bid and ask prices in index J prices. Return is the cumulative daily trades for the most actively traded fu is the daily difference between numb difference between the buy and sell 1 trading volume to the daily trading v respectively, where $\sigma_s$ represents the c markets. Mann-Whitney-Wilcoxon test 1%, respectively.	the contract of the contract	uns fro tta. Price irices in mulativ trively tra betweer 2 buy ar daily tr daily tr cepreset y-Wilcov	m January e is the dai index poin aded futur of sell limi of sell limi of the dail ston tests ar	<ul> <li>1, 2002</li> <li>1, 2002</li> <li>hy price in nts. Furthin the Furthin the Furthin the function of Tai es contract of buy and of buy and the nteres signal and the BI, and BI, by standard re perform</li> </ul>	to Decen index po ermore, s ermore, s its. Volum th. unuber zes divide BB2, BB I deviation ned for th	Notes: The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days during which there are five trading days without institutional trading data. Price is the daily price in index points for the most actively traded future contracts. Moreover, spread indicates the daily difference between the best bid and ask prices in index points. Furthermore, spread percentage is the daily percentage of the spread divided by the midpoint of the best bid and ask prices. Return is the cumulative daily return of Taiwan Stock Exchange Capitalization Weighted Index from $t - 20$ to $t - 1$ . Number of trades is the daily number of trades for the most actively traded futures contracts. Nolume represents the average daily volume of trades for the most actively traded futures contracts. <i>Imb_outor</i> is the daily difference between number of buy and number of sell limit orders divided by the daily sum of number of buy and sell limit orders. <i>Imb_outor</i> is the daily trading volume to the daily trading volume. BB1, BB2, BB3 and BB4 represent the $(\lambda_1, \lambda_2)$ values of $(1\sigma_i, 1\sigma_i)$ , $(0.5\sigma_i, 0.5\sigma_i)$ , $(1\sigma_i, 0.5\sigma_i)$ and $(0.5\sigma_i, 1\sigma_i)$ , respectively, where $\sigma_i$ represents the daily buy and sell limit sizes. Finally, <i>ImsLatio</i> represents the ratio of daily institutional trading volume to the daily trading volume. BB1, BB2, BB3 and BB4 represent the $(\lambda_1, \lambda_2)$ values of $(1\sigma_i, 1\sigma_i)$ , $(0.5\sigma_i)$ , $(1\sigma_i, 0.5\sigma_i)$ and $(0.5\sigma_i, 1\sigma_i)$ , respectively, where $\sigma_i$ represents the daily standard deviation of TAIEX indices. The ratios in parentheses show percentages of observations classified to bull and bear markets. Mann-Whitney-Wilcoxon tests are performed for the differences between all variables in 2002 and 2003. *, **, *** denote significance levels at $10\%$ , 5% and 1%, respectively.	2003, and 2003, and centage is centage is capitali the ave it orders in of dai indices. ces betwee	d comprively traditively traditively traditively traditively the daily zation $W_{\rm tradition}$ the daily buy an int the ( $\lambda$ The ratio en all var	ises 497 ed futur / percen ly volum y the da vy the da (d sell lir 1, $\lambda_2$ ) va s in pare iables in	trading e contra tage of t Index fr e of tra nily sum nil sizes lues of ntheses 2002 an	t days d cts. Mor cts. Mor cts. Mor cts. Mor on $t-2$ des for $t-2$ des for $t/\sigma_s$ , loss thank (1 $\sigma_s$ , 1 $\sigma_$	uring w eover, sp ad dividi 0 to $t -$ he most he most <i>InsLout</i> , <i>InsLout</i> , $7_{3}$ , (0.1, * , *, ***	hich th read in cd by th d by th l. Numl actively actively actively of a copre- δσ <sub>s</sub> , 0.5c δσ <sub>s</sub> , denote	ere are licates th e midpo per of tra- traded 1 imit sents the ervation: ervation: significa	five tradii ne daily diff int of the 1 ades is the ades is the futures con orders. $Im$ s $0.5\sigma_s$ ) at s classified ance levels	ng days ference b best bid daily nu nrracts. $L$ ally insti ally insti ally (0.5c to bull a at 10%,	days without ence between t bid and ask ly number of ccs. $Imb_onder$ institutional $(0.5\sigma_s, 1\sigma_s)$ , bull and bear 10%, $5%$ and

Table 2(Continued)

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### 4. EMPIRICAL FINDINGS

## (i) Impact of Transient Volatility on Subsequent Market Depth

Table 3 summarizes the estimation results for the effect of transient volatility on subsequent market depth, as measured by limit order size and number of limit orders. Under the market depth measured by limit order size, the coefficients of transient volatility,  $\beta_1$ , are insignificantly positive for the entire data set and years of 2002 and 2003. On the other hand, when market depth measured by the number of limit orders, the coefficient of transient volatility,  $\gamma_1$ , is significantly positive for the year of 2002. This weakly supports an idea that subsequent market depth is significantly and positively related to transient volatility, which is consistent with the finding of Ahn et al. (2001) that increased transient volatility leads to increased liquidity trading.

Estimation results for the bull and bear markets indicate that the coefficient of transient volatility,  $\beta_1$ , is significantly positive in bull markets and is significantly negative in bear markets. Therefore, during bull markets, the trade size of limit orders increase after transient volatility increases, while traders reduce the size of their trades during bear markets. The above findings demonstrate the asymmetric effects of liquidity trading during different market trends. This indicates that liquidity investors prefer to reduce trade size to avoid the adverse selection problem. This condition occurs because investors cannot determine whether the increased volatility is caused by informed trading activity or liquidity trading activity. Therefore, the best investment strategy for liquidity investors is reducing their trades.

The above findings corroborate those of Ahn et al. (2001), that increased transient volatility leads to increased liquidity trading in bull markets but not in bear markets. Most studies report that stock markets respond asymmetrically to upward and downward trends. (Nelson, 1991; Engle and Ng, 1993; Glosten et al., 1993; and Koutmos, 1998). Generally, negative return shocks influence the market more than positive return shocks do. By reducing quoted trade size, liquidity traders can limit their losses to informed traders and limit the extent of information asymmetry during bear markets. Consequently, liquidity traders tend to avoid aggressive trading during bear markets.

When market depth is measured by the number of limit orders, the coefficient of transient,  $\gamma_1$ , is significantly positive in the bull market but insignificantly negative in the bear market. This phenomenon is consistent with the above findings using limit order size as the market depth. Therefore, transient volatility and subsequent market depth are positively related in bull markets but not in bear markets. The empirical findings presented here indicate that liquidity traders in the index futures market tend to react asymmetrically to changes in transient volatility. When transient volatility increases, liquidity trading intensifies during bull markets but not in bear markets.

Regarding the influence of market trading intensity on market depth, market depth as measured by limit order size tends to be higher when trading volume increases, since  $\beta_2$ , the coefficient of trading volume, is significantly positive for the whole data set, the bull and bear markets. However, when market depth is measured by the number of limit orders, the coefficient of the number of trades  $\gamma_2$  is significantly negative for all classifications. These analytical results indicate that investors are inclined to increase their quoted size when trading activity intensifies, even if it exhausts the number of limit orders.

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Regression of Subsequent Market Depth on Transitory Volatility

		Limit Order Size ( $DEPTHVOL_t$	$OEPTHVOL_{t}$		Nun	Number of Limit Orders (DEPTHORD,	s (DEPTHORD <sub>t</sub> )	
	$\beta_1$	$\beta_2$	$\beta_3$	$eta_4$	$\gamma_1$	$\gamma_2$	$\gamma_3$	${\cal Y}_4$
Whole Period	104.559	0.051***	0.992***	0.007	49.520	-0.226***	$1.010^{***}$	-0.006***
2002	(20.021) 50.695 (22.147)	(0.013) -0.001 (0.010)	(0.031)	(2000) 0.068***	(51.142) 11.072* /5.704)	(0.011) -0.164*** (0.099)	(0.004) 1.016*** (0.012)	(0.002) -0.009 (700.02)
2003	110.674 110.674 (08 301)	(0.010) $(0.053^{***})$	(0.011) 1.193*** (0.051)	$-0.206^{***}$	52.225 (37 997)	$-0.265^{***}$	(0.003) 0.989*** 0.003)	-0.002
BB1		(0100)		(100.0)			(0000)	(0000)
Bearl	$-41.915^{***}$ (15.926)	$0.093^{***}$ (0.026)	$1.181^{***}$ (0.075)	$-0.176^{**}$ (0.077)	-1.790 (8.152)	$-0.198^{***}$ (0.011)	$1.024^{***}$ (0.003)	-0.001 (0.003)
Bull1	$83.868^{***}$ (33.454)	$0.029^{**}$	$0.967^{***}$	0.032 (0.043)	$34.177^{***}$ (5.075)	$-0.241^{***}$ (0.015)	(0.006)	-0.004 (0.003)
BB2								
Bear2	$-49.867^{***}$ (13.883)	$0.099^{***}$ (0.025)	$1.226^{***}$ (0.070)	$-0.223^{***}$ (0.072)	-1.809 (8.247)	$-0.197^{***}$ (0.011)	$1.024^{***}$ (0.003)	-0.002 (0.003)
Bull2	$87.811^{***}$ (33.454)	$0.025^{\circ}$	$0.959^{***}$ (0.037)	0.040 (0.037)	$34.597^{***}$ (5.148)	$-0.243^{***}$ (0.016)	(0.006)	-0.004 (0.003)
BB3	~	~	~	~	~			
Bear3	$-54.080^{***}$ (12.223)	$0.096^{***}$ (0.023)	$1.255^{***}$ (0.064)	$-0.254^{***}$ (0.067)	-1.955 (8.090)	$-0.200^{***}$ (0.010)	$1.022^{***}$ (0.003)	-0.002 (0.002)
Bull3	$91.473^{***}$ (33.540)	$0.023^{*}$ (0.014)	(0.029)	$0.051^{*}$	$35.100^{***}$ (5.278)	$-0.244^{***}$ (0.017)	(0.006)	-0.004 (0.003)

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		Limit Order Size(DEPTHVOL <sub>1</sub> )		Table 3   (Continued)		Number of Limit Orders (DEPTHORD <sub>1</sub> )	$(DEPTHORD_t)$	
	$\beta_1$	$\beta_2$	$eta_3$	$eta_4$	$\gamma_1$	${\cal Y}_2$	$\gamma_3$	${\cal Y}_4$
BB4 Bear4	-45.139*** (15.640)	0.102*** (0.097)	1.195*** (0.076)	$-0.191^{***}$	-2.269 7 897)	-0.197*** (0.019)	1.024***	-0.001
Bull4	(33.589)	(0.013)	(0.042)	(0.033) (0.043)	34.631*** (5.164)	$-0.240^{***}$ (0.015)	$1.008^{***}$ (0.006)	-0.005 (0.003)
<i>Notes</i> : The sample F following regre following regre where DEPTH following time volume during of one if time represent the ( The standard e	Note: The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. This table describes the GMM estimates of the following regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are: $DEPTHVOL_t = \alpha_1 + \beta_1 RISK_{t-1} + \beta_2 VOLUME_t + \beta_3 DEPTHVOL_{t-1} + \beta_4 DEPTHVOL_{t-2} + \sum_{i=1}^{17} \rho_i TIME_{i,t} + \varepsilon_{1,t}$ $DEPTHVOL_t = \alpha_2 + \gamma_1 RISK_{t-1} + \gamma_2 NTRADORD_t + \gamma_3 DEPTHORD_{t-1} + \gamma_4 DEPTHORD_{t-2} + \sum_{i=1}^{17} \rho_i TIME_{i,t} + \varepsilon_{2,t}$ where $DEPTHVOL_t$ (DEPTHORD <sub>t</sub> ) denotes the market depth measured as the total size (number) of limit orders outstanding at the bid and ask quotes following time interval <i>t</i> ; RISK_{t-1} represents the transitory volatility measured as the soun of the squared returns during time interval <i>t</i> - 1; VOLUME_ <i>t</i> is the transaction volume during time interval <i>t</i> ; DTME_{10}, 0.5\sigma_0, 0.5\sigma_0, 10\sigma_0, 10\sigma_0, 10\sigma_0), respectively, where $\sigma_i$ represents the daily standard deviation of TAIEX indices. The standard errors are in parentheses. **********************************	1 runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. This table describes 1 models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression n DEPTHVOL <sub><i>i</i></sub> = $\alpha_1 + \beta_1$ RISK <sub><i>i</i>-1</sub> + $\beta_2$ VOLUME <sub><i>i</i></sub> + $\beta_3$ DEPTHVOL <sub><i>i</i>-1</sub> + $\beta_4$ DEPTHVOL <sub><i>i</i>-2</sub> + $\sum_{i=1}^{17} \rho_i$ TIME <sub><i>i</i>,<i>i</i></sub> + $\varepsilon_{1i}$ DEPTHOD <sub><i>i</i></sub> = $\alpha_2 + \gamma_1$ RISK <sub><i>i</i>-1</sub> + $\gamma_2$ NTRADORD <sub><i>i</i></sub> + $\gamma_3$ DEPTHVOL <sub><i>i</i>-1</sub> + $\gamma_4$ DEPTHVOL <sub><i>i</i>-2</sub> + $\sum_{i=1}^{17} \rho_i$ TIME <sub><i>i</i>,<i>i</i></sub> + $\varepsilon_{2i}$ $\epsilon$ (DEPTHORD <sub><i>i</i></sub> ) denotes the market depth measured as the total size (number) of limit orders outstanding val <i>i</i> ; RISK <sub><i>i</i>-1</sub> represents the transitory volatility measured as the total size (number) of limit orders outstanding timerval <i>t</i> ; NTRADORD <sub><i>i</i></sub> is the number of transactions completed during time interval <i>t</i> - 1; interval <i>t</i> ; NTRADORD <sub><i>i</i></sub> is the number of transactions completed during time interval <i>t</i> - 1; outerval <i>t</i> ; NTRADORD <sub><i>i</i></sub> , is the number of transactions completed during time interval <i>t</i> - 1; interval <i>t</i> ; NTRADORD <sub><i>i</i></sub> , is the number of transactions completed during time interval <i>t</i> , and other 15-minute intraday interval <i>i</i> , and otherwise is zero; and $\varepsilon_{1,t}$ and $\varepsilon_{2,t}$ denote random error terms. Moreov c) values of (1 $\sigma_5$ , 1 $\sigma_5$ ), (1 $\sigma_5$ , 0.5 $\sigma_5$ ), and (0.5 $\sigma_5$ , and 1 $\%$ , respectively, where $\sigma_5$ represents the daily standard are in parentheses. *, ***, ****	ary 1, 2002 to December 31, 2003, and comprises 497 trading days. This table describes the GMM estimates of the I5-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are: $\iota + \beta_1 \operatorname{RISK}_{\iota-1} + \beta_2 \operatorname{VOLUME}_{\iota} + \beta_3 \operatorname{DEPTHVOL}_{\iota-1} + \beta_4 \operatorname{DEPTHVOL}_{\iota-2} + \sum_{i=1}^{17} \rho_i \operatorname{TIME}_{i,i} + \varepsilon_{1,i}$ $g + \gamma_1 \operatorname{RISK}_{\iota-1} + \gamma_2 \operatorname{NTRADORD}_{\iota} + \gamma_3 \operatorname{DEPTHORD}_{\iota-1} + \gamma_4 \operatorname{DEPTHORD}_{\iota-2} + \sum_{i=1}^{17} \rho_i \operatorname{TIME}_{i,i} + \varepsilon_{2,i}$ denotes the market depth measured as the total size (number) of limit orders outstanding at the bid and ask quotes sents the transitory volatility measured as the sum of the squared returns during time interval $t - 1$ ; VOLUME, <i>i</i> is the transaction DORD, <i>i</i> is the number of transactions completed during time interval $t$ , TIME <sub><i>i</i>,<i>i</i></sub> represents a dummy variable with the value ute intraday interval <i>i</i> , and otherwise is zero; and $\varepsilon_{1,i}$ and $\varepsilon_{2,i}$ denote random error terms. Moreover, BB1, BB2, BB3 and BB4 s. *, ***, **** denote significance levels at 10%, 5% and 1%, respectively.	3, and comprises serial correlation b DEPTHVOL <sub><i>l</i>-1</sub> + <i>μ</i> <i>γ</i> <sub>3</sub> DEPTHORD <sub><i>l</i>-1 <i>γ</i><sub>3</sub> DEPTHORD<sub><i>l</i>-1</sub> red as the total siz ed as the sum of the ns completed durin the is zero; and ε<sub>1</sub><i>t</i> at 0.5σ<sub>3</sub>, 1σ<sub>3</sub>), respect at 10%, 5% and 1%</sub>	497 trading days. r Newey and West (1) 4 DEPTHVOL <sub>1-2</sub> + $+ \gamma_4$ DEPTHORD <sub>1-2</sub> $+ \gamma_4$ DEPTHORD <sub>1-2</sub> $+ \gamma_4$ DEPTHORD <sub>1-2</sub> $r_{1-2}$ + $\gamma_4$ DEPTHORD <sub>1-2</sub> $r_{2-2}$ + $\gamma_4$ DEPTHORD <sub>1-2</sub> + $\gamma_4$ DEPTHORD <sub>1</sub>	This table describe (987). The regressio (987). The regressio $\sum_{i=1}^{17} \rho_i$ TIME <sub><i>i</i>,<i>i</i></sub> + $\varepsilon_{1i}$ $z + \sum_{i=1}^{17} \rho_i$ TIME <sub><i>i</i>,<i>i</i></sub> + $\varepsilon_{1i}$ int orders outstandi int orders outstandi ing time interval <i>t</i> – IME <sub><i>i</i>,<i>i</i></sub> represents a on error terms. Mor	as the GMM estin n models are: $\varepsilon_{2i}$ $\varepsilon_{2i}$ are the bid and dummy variable w fecover, BB1, BB2, F ard deviation of TA	hates of the ask quotes e transaction th the value BB3 and BB4 IEX indices.

LIQUIDITY PROVISION UNDER BULL AND BEAR MARKETS

CHIANG, LIN AND YU

## (ii) Impact of Transient Volatility on Subsequent Increments on Market Depth

Table 4 lists the estimation results for the effect of transient volatility on the subsequent increment on market depth. The relationship between transient volatility and subsequent increments on market depth is insignificantly and positively correlated

	Limit Ore (ΔDEPT)		Number of Lin ( DEPTH	
	$\beta_1$	$\beta_2$	γ1	$\gamma_2$
Whole Period	109.880	-0.010	22.830	$0.005^{**}$
	(78.726)	(0.057)	(36.553)	(0.003)
2002	50.047	$-0.070^{***}$	-40.164	0.003***
	(32.274)	(0.012)	(31.984)	(0.001)
2003	116.205	0.194***	30.953	0.035***
	(95.887)	(0.051)	(40.313)	(0.002)
BB1	· · · ·	( )	· · ·	· · · ·
Bear1	$-26.281^{*}$	$0.177^{**}$	$-31.372^{***}$	$0.034^{***}$
	(14.709)	(0.074)	(3.404)	(0.002)
Bull1	84.831***	-0.036	19.006	0.003**
	(32.985)	(0.042)	(12.374)	(0.002)
BB2	· · · ·	( )	· · ·	· · · ·
Bear2	$-33.564^{***}$	$0.221^{***}$	$-30.748^{***}$	$0.034^{***}$
	(12.496)	(0.069)	(3.609)	(0.002)
Bull2	88.676***	-0.043	18.666	0.003**
	(33.031)	(0.036)	(12.948)	(0.002)
BB3		· · · ·		
Bear3	$-38.329^{***}$	0.250***	$-30.370^{***}$	$0.034^{***}$
	(10.925)	(0.064)	(3.735)	(0.002)
Bull3	92.323***	$-0.054^{**}$	19.524	0.003**
	(33.132)	(0.028)	(12.836)	(0.002)
BB4		()	( ,	()
Bear4	$-28.358^{**}$	0.190***	$-31.013^{***}$	$0.034^{***}$
	(14.228)	(0.075)	(3.566)	(0.003)
Bull4	86.029***	-0.036	18.447	0.004**
	(33.161)	(0.042)	(12.847)	(0.002)

 Table 4

 Regression of Subsequent Market Depth Change on Transitory Volatility

Notes:

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. This table illustrates the GMM estimates of the following regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are:

$$\Delta \text{DEPTHVOL}_{t} = \alpha_{1} + \beta_{1} \operatorname{RISK}_{t-1} + \beta_{2} \Delta \text{DEPTHVOL}_{t-1} + \sum_{i=1}^{17} \rho_{i} \operatorname{TIME}_{i,t} + \varepsilon_{1t}$$
$$\Delta \text{DEPTHORD}_{t} = \alpha_{2} + \gamma_{1} \operatorname{RISK}_{t-1} + \gamma_{2} \Delta \text{DEPTHORD}_{t-1} + \sum_{i=1}^{17} \rho_{i} \operatorname{TIME}_{i,t} + \varepsilon_{2t}$$

where  $\Delta \text{DEPTHVOL}_{t}$  ( $\Delta \text{DEPTHORD}_{t}$ ) denotes the change of market depth measured as the total size (number) of limit orders outstanding at the bid and ask quotes from time interval t - 1 to t;  $\text{RISK}_{t-1}$  denotes the transitory volatility measured as the sum of the squared returns during time interval t - 1;  $\text{TIME}_{i,t}$  represents a dummy variable that takes the value of one if time t belongs to the 15-minute intraday interval i, and zero otherwise; and  $\varepsilon_{1t}$  and  $\varepsilon_{2t}$  are random error terms. Moreover, BB1, BB2, BB3 and BB4 represent the ( $\lambda_1, \lambda_2$ ) values of ( $1\sigma_s, 1\sigma_s$ ), ( $0.5\sigma_s, 0.5\sigma_s$ ), ( $1\sigma_s, 0.5\sigma_s$ ) and ( $0.5\sigma_s, 1\sigma_s$ ) respectively, where  $\sigma_s$  represents the daily standard deviation of TAIEX indices. The standard errors are in parentheses. \*, \*\*, \*\*\* denote significance levels of 10%, 5% and 1%, respectively.

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for the entire data set and years of 2002 and 2003. Additionally, transient volatility is negatively related to the subsequent increment on market depth as measured either by limit order size or by number of orders in bear markets. Therefore, as risk increases, liquidity traders tend to reduce their increments of limit orders in bear markets. Coupled with the finding in Table 3, that increased transient volatility causes liquidity traders to reduce their placements of limit orders during bear markets, liquidity traders do not aggressively provide liquidity in the futures market during bear markets when the transient risk increases. This phenomenon is consistent with Glosten and Milgrom (1985) and Glosten (1994), who proposed that competitive traders may choose not to quote if the adverse selection problem is too extreme.

Conversely, bull markets reveal a significant positive relationship between transient volatility and the subsequent increment in market depth. In bull markets, liquidity traders submit limit orders more aggressively than market orders as liquidity-driven transient volatility increases. Ahn et al. (2001), in a study of the Hong Kong Stock Exchange, found only weak support for this relationship. In this study, the relationship of increases in increments in market depth following increases in transient volatility is significantly supported in bull but not in bear markets.

In contrast with the negative autocorrelation reported by Ahn et al. (2001), Table 4 describes the positive autocor relation of increments in mark et depth measured by the number of limit orders. Thus, the number of limit orders increases (decreases) following an increase (decrease) in the number of limit orders. This relationship may reflect an order submission situation in which liquidity traders follow their previously established trading patterns. This finding may result from the order persistence phenomenon identified by Lin et al. (1995) and Hasbrouck (1991), namely, that buy (sell) orders tend to follow buy (sell) orders.

Table 5 lists the estimation results when the increment of mark et depth is divid ed into buy and sell sides, represented by DIFFVOL<sup>buy</sup> (DIFFORD<sup>buy</sup>) and DIFFVOL<sup>sell</sup> (DIFFORD<sup>sell</sup>), respectively. Panel A of Table 5 shows a significant positive relationship between the increment market depth on the buy side and upside transient volatility for year 2003, but not for year 2002. Therefore, the relationship between transient volatility and subsequent market depth shows different patterns under different market years when market depth is separated into buy and sell sides. Bear markets exhibit a significantly positive (negative) relationship between the increment in market depth on the buy side and downside (upside) transient volatility. In bull markets, increased upside transient volatility increases the subsequent increment of market depth on the buy side, but no such significant relationship exists between downside transient volatility and market depth on the buy side.

Panel B of Table 5 shows the estimation results of the relationship between the increment of market depth on the sell side, upside volatility and downside volatility. The significantly positive (negative) relationship between the subsequent increment of market depth on sell side and upside (downside) transient volatility is apparent for year 2003 and bear markets when market depth is measured by limit order size. Bull markets reveal a significant positive relationship between the subsequent increment of market depth on the sell side and upside transient volatility, but an insignificantly negative relationship between the subsequent increment of market depth on the sell side and upside transient volatility.

For bear markets, Table 5 reveals a limit order submission situation in which, under increased downside (upside) transient volatility, liquidity traders submit more limit buy

## Table 5

Regression of the Difference Between Limit Buy (Sell) Order and Market Buy (Sell) on Lagged Upside and Downside Volatility

		mit Order Sizes $DIFFVOL_t^{buy}$ )			ber of Limit Orde DIFFORD <sup>buy</sup> )	ers
	$\beta_1$	$\beta_2$	$\beta_3$	γ1	$\gamma_2$	¥ 3
Whole Peri	od 13.526	-31.058	0.455***	10.924***	3.733	$0.135^{*}$
	(20.531)	(66.499)	(0.092)	(3.002)	(19.115)	(0.079)
2002	$-1,295.683^{***}$	690.807***	0.244	-48.833	-3.368	0.032
	(401.603)	(183.128)	(0.181)	(78.358)	(65.962)	(0.090)
2003	24.672***	-13.744	$0.526^{***}$	7.202***	40.784***	$0.207^{***}$
	(8.415)	(71.204)	(0.018)	(0.890)	(13.356)	(0.024)
BB1						
Bear1	$-1,583.910^{***}$	1,967.918***	$0.544^{***}$	$-312.792^{***}$	454.994***	$0.269^{***}$
	(221.664)	(281.443)	(0.021)	(107.814)	(140.080)	(0.029)
Bull1	$24.529^{*}$	-39.772	$0.408^{***}$	$15.176^{***}$	-33.525	0.057
	(13.384)	(87.662)	(0.139)	(1.819)	(23.917)	(0.084)
BB2						
Bear2	$-1,537.226^{***}$	1,912.356***	$0.539^{***}$	$-324.865^{***}$	473.420***	$0.266^{***}$
	(219.010)	(277.530)	(0.021)	(105.770)	(136.588)	(0.029)
Bull2	$25.592^{*}$	-47.873	$0.403^{***}$	$15.255^{***}$	-38.849	0.047
	(13.894)	(89.933)	(0.141)	(2.044)	(27.469)	(0.082)
BB3						
Bear3	$-1,597.628^{***}$	1,987.762***	$0.535^{***}$	$-297.954^{***}$	436.692***	$0.266^{***}$
	(219.379)	(278.314)	(0.020)	(101.187)	(131.253)	(0.028)
Bull3	26.293**	-50.341	$0.401^{***}$	15.493***	-36.961	0.044
	(13.533)	(92.796)	(0.149)	(1.920)	(26.434)	(0.083)
BB4						
Bear4	$-1,599.238^{***}$	1,990.555***	$0.543^{***}$	$-356.752^{***}$	512.382***	$0.270^{***}$
	(226.809)	(287.657)	(0.022)	(109.921)	(142.393)	(0.030)
Bull4	$24.536^{*}$	-42.801	$0.411^{***}$	15.351***	-36.561	0.060
	(13.809)	(89.001)	(0.135)	(1.861)	(25.863)	(0.084)

# Panel A: Dependent Variable is the Difference Between Newly Placed Limit Orders and Market

Panel B: Dependent Variable is the Difference Between Newly Placed Limit Orders and Market Orders at the Sell Side

orders at me	Li	mit Order Sizes DIFFVOL <sup>sell</sup> )			uber of Limit Ord (DIFFORD <sup>sell</sup> )	ders
	$eta_4$	$\beta_5$	$eta_{6}$	$\gamma_4$	$\gamma_{5}$	<b>γ</b> 6
Whole Period	$131.343^{***}$	$-275.593^{**}$	$0.419^{***}$	71.355***	$-130.675^{**}$	0.110
	(19.740)	(131.240)	(0.093)	(13.701)	(59.636)	(0.082)
2002	-809.321	341.620	0.220	$-359.360^{+++}$	216.776 <sup>***</sup>	-0.010
	(543.050)	(299.419)	(0.179)	(133.305)	(82.346)	(0.069)
2003	$149.074^{***}$ (5.166)	$-400.967^{***}$ (49.276)	0.481*** (0.019)	83.853 <sup>****</sup> (0.956)	$-232.578^{***}$ (6.417)	$0.198^{***}$ (0.022)
BB1	· · · · ·		· · ·	× /	× ,	· /
Bear1	942.124*** -	$-1373.361^{***}$	$0.527^{***}$	-13.263	-114.819	$0.192^{***}$
	(233.102)	(303.096)	(0.022)	(104.697)	(131.309)	(0.030)
Bull1	49.234 <sup>***</sup>	-88.273	$0.354^{***}$	15.824 <sup>***</sup>	-9.767	0.069
	(5.213)	(82.960)	(0.125)	(2.195)	(14.297)	(0.084)

		Limit Order Sizes (DIFFVOL <sub>t</sub> <sup>sell</sup> )			uber of Limit Ord (DIFFORD <sup>sell</sup> )	ders
	$\beta_4$	$\beta_5$	$\beta_{6}$	$\gamma_4$	$\gamma_5$	$\gamma_{6}$
BB2						
Bear2	841.746***	$-1237.982^{***}$	$0.540^{***}$	11.221	-146.287	$0.198^{***}$
	(231.109)	(299.727)	(0.021)	(99.544)	(124.716)	(0.031)
Bull2	50.077***	-94.435	0.343***	16.127***	-8.221	0.064
	(5.662)	(84.346)	(0.123)	(2.085)	(13.902)	(0.081)
BB3						
Bear3	871.395***	$-1277.675^{***}$	$0.526^{***}$	-8.664	-118.625	$0.208^{***}$
	(231.027)	(298.645)	(0.020)	(100.702)	(125.913)	(0.030)
Bull3	50.935***	-95.863	$0.341^{***}$	$16.724^{***}$	-8.967	0.056
	(5.558)	(86.260)	(0.130)	(2.065)	(14.094)	(0.081)
BB4						
Bear4	854.740***	$-1257.871^{***}$	$0.537^{***}$	18.537	-154.803	0.200***
	(235.549)	(307.149)	(0.022)	(105.702)	(132.364)	(0.033)
Bull4	49.759***	-94.407	$0.354^{***}$	$15.740^{***}$	-10.048	0.069
	(5.416)	(85.859)	(0.121)	(2.316)	(14.528)	(0.082)

Table 5 (Continued)

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. This table shows the GMM estimates of regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are as follows:

$$DIFFVOL_{t}^{buy} = \alpha_{1} + \beta_{1} PRISK_{t-1} + \beta_{2} NRISK_{t-1} + \beta_{3} DIFF_{t-1}^{buy} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{1t}^{buy}$$
$$DIFFVOL_{t}^{sell} = \alpha_{2} + \beta_{4} PRISK_{t-1} + \beta_{5} NRISK_{t-1} + \beta_{6} DIFF_{t-1}^{sell} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{2t}^{sell}$$
$$DIFFORD_{t}^{buy} = \alpha_{3} + \gamma_{1} PRISK_{t-1} + \gamma_{2} NRISK_{t-1} + \gamma_{3} DIFF_{t-1}^{buy} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{2t}^{buy}$$
$$DIFFORD_{t}^{sell} = \alpha_{4} + \gamma_{4} PRISK_{t-1} + \gamma_{5} NRISK_{t-1} + \gamma_{6} DIFF_{t-1}^{sell} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{2t}^{sell}$$

where  $\text{DIFFVOL}_{t}^{buy}$  ( $\text{DIFFVOL}_{t}^{sell}$ ) measures the difference between the size of newly placed limit buy(sell) orders and market buy (sell) orders during time interval t;  $\text{DIFFORD}_{t}^{buy}$  ( $\text{DIFFORD}_{t}^{sell}$ ) indicates the difference between the number of newly placed limit buy(sell) orders and market buy (sell) orders during time interval t;  $\text{PRISK}_{t-1}$  ( $\text{NRISK}_{t-1}$ ) represents the upside (downside) volatility during tine interval t - 1, which is measured as the sum of squared returns based on the observation of positive (negative) returns within the interval t - 1;  $\text{TIME}_{i,t}$  represents a dummy variable with the value of one if time t belongs to the 15-minute intraday interval i, and zero otherwise; and  $\varepsilon_{1t}^{buy}$ ,  $\varepsilon_{2t}^{sell}$ ,  $\varepsilon_{2t}^{buy}$  and  $\varepsilon_{2sl}^{sell}$  are random error terms. Furthermore, BB1, BB2, BB3 and BB4 represent the  $(\lambda_1, \lambda_2)$  values of  $(1\sigma_s, 1\sigma_s), (0.5\sigma_s, 0.5\sigma_s), (1\sigma_s, 0.5\sigma_s),$  and  $(0.5\sigma_s, 1\sigma_s)$ , respectively, where  $\sigma_s$  represents the daily standard deviation of TAIEX indices. The standard errors are in parenthesse. \*, \*\*, \*\*\* denote significance levels at 10\%, 5\% and 1\%, respectively.

(sell) orders than market buy (sell) orders, but reduce limit sell (buy) orders rather than market sell (buy) orders. The decrease in limit sell (buy) orders exceeds the increase in limit buy (sell) orders, thus establishing a negative relationship between transient volatility and the subsequent increment of market depth found in Table 4 for bear markets. In bull markets, liquidity traders increase their limit buy and limit sell orders in response to increased upside transient volatility, but do not take significant limit order submission in response to downside transient volatility. Therefore, in bull markets, liquidity traders are much more willing to provide liquidity once the price-driven volatility occurs at higher prices (ask price). The positive autocorrelation of market depth on the buy and sell sides indicates order persistence.

The above findings demonstrate that market conditions influence the limit order submission behavior of liquidity traders. In bull markets, increased transient volatility drives increased subsequent market depth. Conversely, in bear markets, increased transient volatility decreases subsequent market depth. Additionally, limit orders on the buy and sell sides are positively affected by upside transient volatility in bull markets while limit orders on the buy and sell sides are positively affected by transient volatility on the buy and sell sides, respectively, in bear markets.

## (iii) Impact of Market Depth on Subsequent Transient Volatility

Table 6 lists the estimation results regarding the influence of market depth on subsequent transient volatility. The relationship between market depth and subsequent transient volatility is significantly positive in bull markets, which contradicts the findings of Ahn et al. (2001) who find a negative relationship between market depth and subsequent transient volatility. This study also reveals a positive relationship between transaction volume and transient volatility in bull markets. That is, trading activity in a bull market is much more intensive than in a bear market. Accordingly, liquidity traders using limit orders are more likely to gain from trading against other liquidity traders in bull markets.

Table 7 lists the estimation results for the relationships among upside (downside) volatility, bid depth and ask depth. For market depth, as measured by limit order size, no significant relationships are noted between upside (downside) volatility, bid depth and ask depth during bull and bear markets. However, during bull markets, trading volume is positively related to upside (downside) volatility. These analytical results are consistent with the findings of past studies that price volatility is provoked by trading flows as information is rapidly diffused through intensive trading (e.g., Kyle, 1985: Admati and Pfleiderer, 1988; Foster and Viswanathan, 1990; and Holden and Subrahmanyam, 1992).

Market depth, measured by the number of limit orders, reveals a positive relationship between upside risk and bid depth in bull markets. Additionally, in bull markets, the downside risk is significantly and positively related to bid depth, but significantly and negatively related to ask depth. Coupled with the findings in Table 6, this indicates that, during bull markets, price volatility is more sensitive to limit orders on the buy side. Therefore, the positive relationship between market depth and subsequent transient volatility in bull markets shown in Table 6 is caused by bid depth. This shows that market orders tend to flow into the market when liquidity traders submit more buy orders, which increases subsequent risk. Consequently, in bull markets, liquidity traders are more aggressive, especially on the bid side.

## (iv) Influence of Institutional Trading on Liquidity Provision Behavior

To clarify whether institutional trading induces the asymmetric liquidity provision during bull and bear markets, sample data were partitioned into high and low institutional trading days using the median ratio of institutional trading volume to total trading volume in a day. Table 8 shows descriptive statistics for high and low institutional trading subsamples. Average cumulative return is positive for higher institutional trading days, while average cumulative return is negative for lower

		imit Order Sizes DEPTHVOL <sub>t-1</sub> )			ıber of Limit Orde DEPTHORD <sub>t–1</sub> )	ers
	$\beta_1$	$\beta_2$	$\beta_3$	γ1	$\gamma_2$	Y 3
Whole Period	33.0180*	0.0858***	0.0002*	31.2610*	0.0961***	0.0008***
	(18.9820)	(0.0335)	(0.0001)	(18.2060)	(0.0320)	(0.0003)
2002	42.6180	0.1680***	0.0002**	41.3040	0.1510***	0.0002
	(33.1230)	(0.0384)	(0.0001)	(31.9520)	(0.0314)	(0.0001)
2003	13.4360	0.0909*	-0.0146	14.0040	0.1000**	0.0131
	(13.1200)	(0.0514)	(0.0094)	(12.6710)	(0.0485)	(0.0090)
BB1	· /		· · · ·	· /	· · · ·	· · · ·
Bear1	14.7550	0.1300	-0.0120	14.5390	$0.1300^{*}$	$0.0043^{*}$
	(17.2610)	(0.0810)	(0.0098)	(15.3880)	(0.0686)	(0.0025)
Bull1	50.3450	0.0606***	0.0003***	48.3590	$0.0744^{***}$	0.0008***
	(40.4430)	(0.0155)	(0.0001)	(39.0530)	(0.0174)	(0.0002)
BB2	· /		· · · ·	· /	· · · ·	· · · ·
Bear2	15.8730	0.1240	-0.0120	15.7800	$0.1250^{*}$	$0.0052^{**}$
	(17.2760)	(0.0780)	(0.0095)	(15.5410)	(0.0663)	(0.0026)
Bull2	49.4970	0.0632***	0.0003***	47.3750	0.0776***	0.0008***
	(40.0690)	(0.0160)	(0.0001)	(38.5950)	(0.0179)	(0.0002)
BB3						
Bear3	17.8060	0.1140	-0.0097	17.2620	$0.1180^{*}$	$0.0056^{***}$
	(17.2880)	(0.0713)	(0.0085)	(15.7470)	(0.0616)	(0.0023)
Bull3	47.8230	0.0666***	0.0003***	45.7960	$0.0804^{***}$	0.0008***
	(39.6410)	(0.0171)	(0.0001)	(38.2020)	(0.0189)	(0.0002)
BB4						
Bear4	14.0620	0.1330	-0.0122	14.0130	$0.1320^{*}$	$0.0046^{*}$
	(17.1990)	(0.0845)	(0.0098)	(15.3130)	(0.0722)	(0.0027)
Bull4	50.9930	0.0610***	0.0003***	48.9030	0.0748***	0.0008***
	(40.5640)	(0.0150)	(0.0001)	(39.1250)	(0.0169)	(0.0002)

 Table 6

 Regression of Subsequent Transitory Volatility on Market Depth

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. This table shows the GMM estimates of regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are:

$$RISK_{t} = \alpha_{1} + \beta_{1} RISK_{t-1} + \beta_{2} VOLUME_{t} + \beta_{3} DEPTHVOL_{t-1} + \sum_{i=1}^{18} \rho_{i} TIME_{i,t} + \varepsilon_{1t}$$
$$RISK_{t} = \alpha_{1} + \gamma_{1} RISK_{t-1} + \gamma_{2} NTRADEORD_{t} + \gamma_{3} DEPTHORD_{t-1} + \sum_{i=1}^{18} \rho_{i} TIME_{i,t} + \varepsilon_{2t}$$

where  $RISK_t$  represents the volatility measured as the sum of the squared returns during time interval t;

DEPTHVOL<sub>t-1</sub> (DEPTHORD<sub>t-1</sub>), is takepth (total size (number)) outstanding limit orders at the bid and ask quotes) following time interval t 1;-TIMFonreijfreismets tabelong statistic the trainest the trainest the statue of t

Reported coefficients and standard errors are magnified by  $10^3$  for the exposition purpose. The standard errors are in parentheses. \*, \*\*, \*\*\*\* denote the significance levels at 10%, 5% and 1%, respectively.

institutional trading days. Further, average trading volume, average order imbalance by size and by number of orders and the number of trades are larger for more active institutional trading days than for less active institutional trading days. However, the average spread and average percentage spread are higher for low institutional trading

Panel A: Depende	ent Variable is U	Panel A: Dependent Variable is Upside Volatility ( <i>PRISK</i> ) Limit Order Sizes (DEPTHVOL <sub><math>t-1</math></sub> )	$PEPTHVOL_{t-1}$		Num	Number of Limit Orders (DEPTHORD <sub>1-1</sub> )	$(DEPTHORD_{t-1})$	
	$\beta_1$	$\beta_2$	$\beta_3$	$eta_4$	$\gamma_1$	$\gamma_2$	${\cal Y}_3$	${\cal Y}_4$
Whole Period	0.0020	-0.0014	$0.0449^{**}$	18.0220	0.0236	-0.0173	0.1040***	16.2740
2002	$(0.0141) \\ 0.0101^{**}$	$(0.0116) -0.0081^{**}$	$(0.0194)$ $0.0790^{***}$	(15.3010) 56.4420	(0.0248) $0.0200^{**}$	(0.0190) $-0.0150^{**}$	(0.0348) $0.1380^{***}$	(15.6930) 57.5090
r D D	(0.0043)	(0.0036)	(0.0162)	(42.9840)	(0.0094)	(0.0073)	(0.0269)	(43.4710)
2003	-0.0112	-0.0073	$0.0489^{*}$	2.9840	0.0184	0.0021	$0.1110^{**}$	2.5480
BRI	(0.0224)	(0.0175)	(0.0290)	(7.4180)	(0.0417)	(0.0307)	(0.0566)	(8.8270)
Bearl	-0.0201	0.0079	0.0658	13.6440	-0.0271	0.0329	$0.117^{*}$	14.036
	(0.0192)	(0.0095)	(0.0432)	(19.1070)	0.0228	0.0235	0.0686	16.763
Bull1	0.0229	-0.0185	$0.0282^{***}$	16.27	$0.0715^{*}$	$-0.0539^{*}$	$0.0969^{***}$	16.726
	(0.0169)	(0.0139)	(0.0068)	(22.5060)	(0.0422)	(0.0323)	(0.0244)	(19.9480)
BB2								
Bear2	-0.0179	0.00559	0.062	14.997	-0.0237	0.0298	$0.108^{*}$	15.578
	(0.0175)	(0.0081)	(0.0412)	(18.5660)	(0.0206)	(0.0207)	(0.0645)	(16.3520)
Bull2	0.0222	-0.0179	$0.0294^{***}$	16.055	$0.072^{*}$	$-0.0543^{*}$	$0.101^{***}$	16.442
	(0.0171)	(0.0141)	(0.0071)	(22.3240)	(0.0434)	(0.0332)	(0.0244)	(19.6400)
BB3								
Bear3	-0.0174	0.0074	0.0571	16.643	-0.0246	0.0311	$0.106^{*}$	16.409
	(0.0175)	(0.0091)	(0.0379)	(18.4960)	(0.0212)	(0.0214)	(0.0617)	(16.7260)
Bull3	0.0221	-0.0179	$0.0311^{***}$	15.195	$0.0749^{*}$	$-0.0566^{*}$	$0.105^{***}$	15.512
	(0.0177)	(0.0146)	(0.0075)	(22.2650)	(0.0450)	(0.0344)	(0.0264)	(19.5040)
BB4								
Bear4	-0.0202	0.00778	0.0669	13.074	-0.0278	0.0335	$0.117^{*}$	13.635
	(0.0193)	(0.0097)	(0.0449)	(19.0650)	(0.0236)	(0.0240)	(0.0711)	(16.6700)
Bull4	0.0221	-0.0178	$0.0286^{***}$	16.683	$0.0677^{*}$	$-0.051^{*}$	$0.0969^{***}$	17.112
	(0.0163)	(0.0134)	(0.0066)	(22.5050)	(0.0402)	(0.0307)	(0.0238)	(20.0360)

Table 7Regression of Upside (Downside) Volatility on Lagged Buy and Sell Depth

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(Continued)	
Table 7	

Panel B: Depend	lent Variable is ] 	Panel B: Dependent Variable is Downside Volatility $(NRISK_i)$ Limit Order Sizes $(DEPTHVOL_{i-1})$	ity $(NRISK_t)$ DEPTHVOL <sub>t-1</sub> )		Numb	Number of Limit Orders (DEPTHORD <sub>t-1</sub> )	$OEPTHORD_{t-1})$	
	$\beta_{5}$	${eta}_6$	$\beta_7$	$\beta_8$	$\gamma_5$	$\gamma_6$	γ7	$\gamma_8$
Whole Period	-0.0063	0.0054	$0.0416^{***}$	$41.3740^{*}$	-0.0019	0.0021	0.0837***	-0.0063
9009	(0.0085)	(0.0069) -0.0066*	(0.0156) $0.0851^{***}$	(24.7020) 98.4980	(0.0120)	(0.0092) -0.0086	(0.0244) $0.1470^{***}$	(0.0085) $44.4730$
	(0.0044)	(0.0036)	(0.0214)	(23.6000)	(0.0104)	(0.0081)	(0.0370)	(38.9420)
2003	-0.0192	0.0069	$0.0425^{*}$	34.3040	-0.0227	0.0254	$0.0745^{**}$	$6.2620^{*}$
	(0.0153)	(0.0067)	(0.0230)	(41.2070)	(0.0170)	(0.0182)	(0.0363)	(3.8520)
BB1								
Bearl	-0.0172	0.0065	$0.0610^{*}$	14.1250	-0.0277	$0.0344^{*}$	$0.1210^{**}$	11.2750
	(0.0152)	(0.0076)	(0.0339)	(17.9500)	(0.0202)	(0.0207)	(0.0583)	(17.2250)
Bull1	0.0045	-0.0034	$0.0277^{***}$	94.3000	$0.0226^{***}$	$-0.0167^{***}$	$0.0657^{***}$	89.8450
	(0.0032)	(0.0026)	(0.0083)	(65.3540)	(0.0088)	(0.0067)	(0.0194)	(63.8480)
BB2								
Bear2	-0.0153	0.0043	$0.0585^{*}$	15.4570	-0.0236	$0.0315^{*}$	$0.1200^{**}$	12.6280
	(0.0138)	(0.0065)	(0.0323)	(18.0040)	(0.0179)	(0.0183)	(0.0574)	(17.2840)
Bull2	0.0038	-0.0029	$0.0285^{***}$	92.9720	$0.0224^{***}$	$-0.0166^{***}$	$0.0660^{***}$	88.6420
	(0.0031)	(0.0025)	(0.0085)	(64.6910)	(0.0088)	(0.0067)	(0.0194)	(63.2080)
BB3								
Bear3	-0.0147	0.0060	$0.0533^{*}$	17.5010	-0.0257	$0.0333^{*}$	$0.1090^{**}$	14.3430
	(0.0138)	(0.0073)	(0.0298)	(18.3320)	(0.0191)	(0.0192)	(0.0519)	(17.6110)
Bull3	0.0028	-0.0021	$0.0304^{***}$	90.8760	$0.0232^{***}$	$-0.0172^{**}$	$0.0697^{***}$	86.3530
	(0.0032)	(0.0027)	(0.0092)	(63.8350)	(0.0093)	(0.0071)	(0.0208)	(62.2620)
BB4								
Bear4	-0.0173	0.0063	$0.0623^{*}$	13.3760	-0.0276	$0.0348^{*}$	$0.1250^{**}$	10.5040
	(0.0152)	(0.0077)	(0.0352)	(17.7850)	(0.0206)	(0.0210)	(0.0622)	(17.2000)
Bull4	0.0043	-0.0033	$0.0278^{***}$	95.2100	$0.0211^{***}$	$-0.0156^{***}$	$0.0655^{***}$	90.9240
	(0.0031)	(0.0025)	(0.0081)	(65.6530)	(0.0084)	(0.0064)	(0.0188)	(64.1840)

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The sample period runs from January 1, 2002 to December 31, 2003, and comprises 497 trading days. The table presents the GMM estimates of regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are as follows:

PRISK<sub>t</sub> = 
$$\alpha_1 + \beta_1$$
 DEPTHVOL<sub>t-1</sub><sup>bid</sup> +  $\beta_2$  DEPTHVOL<sub>t-1</sub><sup>csh</sup> +  $\beta_3$  VOLUME<sub>t</sub> +  $\beta_4$  RISK<sub>t-1</sub> +  $\sum_{i=1}^{18} \rho_i$  TIME<sub>t,t</sub> +  $\varepsilon_{1t}$   
NRISK<sub>t</sub> =  $\alpha_2 + \beta_5$  DEPTHVOL<sub>t-1</sub><sup>bid</sup> +  $\beta_6$  DEPTHVOL<sub>t-1</sub><sup>csh</sup> +  $\beta_7$  VOLUME<sub>t</sub> +  $\beta_8$  RISK<sub>t-1</sub> +  $\sum_{i=1}^{18} \rho_i$  TIME<sub>t,t</sub> +  $\varepsilon_{2t}$   
PRISK<sub>t</sub> =  $\alpha_3 + \gamma_1$  DEPTHORD<sub>t-1</sub><sup>bid</sup> +  $\gamma_2$  DEPTHORD<sub>t-1</sub><sup>csh</sup> +  $\gamma_3$  NTRADEB<sub>t</sub> +  $\gamma_4$  RISK<sub>t-1</sub> +  $\sum_{i=1}^{18} \rho_i$  TIME<sub>t,t</sub> +  $\varepsilon_{3t}$   
NRISK<sub>t</sub> =  $\alpha_4 + \gamma_5$  DEPTHORD<sub>t-1</sub><sup>bid</sup> +  $\gamma_6$  DEPTHORD<sub>t-1</sub><sup>th</sup> +  $\gamma_7$  NTRADEB<sub>t</sub> +  $\gamma_8$  RISK<sub>t-1</sub> +  $\sum_{i=1}^{18} \rho_i$  TIME<sub>t,t</sub> +  $\varepsilon_{4t}$   
so the upside (downside) volatility during time interval t, which is measured as the sum of the squared returns base

on bi positive (negative) return observations within the interval *t*; DEPTHVOL $_{i}^{bid}$  (DEPTHVOL $_{i}^{cat}$ ) and DEPTHORD $_{i}^{bid}$  (DEPTHORD $_{i}^{cat}$ ) measures the size and number of limit orders at the bid (ask) side following time interval *t* - 1; VOLUME, and NTRADEORDB*t* (NTRADEORDS)) represents the volume and number of transactions initiated by market buy (sell) orders during time interval t; TIME<sub>it</sub> represents a dummy variable that takes the value of one if time t belongs to the 15-minute intraday interval i, and zero otherwise; and  $\varepsilon_{1i}$ ,  $\varepsilon_{2i}$ ,  $\varepsilon_{3i}$  and  $\varepsilon_{4i}$  are random error terms. Moreover, BB1, BB2, BB3 and BB4 represent the  $(\lambda_1, \lambda_2)$  values of  $(1\sigma_s, 1\sigma_s)$ ,  $(0.5\sigma_s, 0.5\sigma_s), (1\sigma_s, 0.5\sigma_s)$  and  $(0.5\sigma_s, 1\sigma_s)$ , respectively, where  $\sigma_s$  represents the daily standard deviation of TAIEX indices. Reported coefficients and standard errors are magnified by 10<sup>3</sup> for the exposition purpose. The standard errors are in parentheses. Finally, \*, \*\*, \*\*\* denote the significance levels at 10%, 5% and 1%, where  $PRISK_{t}$  (NRISK<sub>t</sub>) denot respectively.

Variable	Price	Spread	Spread (%)	Return	No. of Trades	Volume	Imb_Order	Imb_Vol	Inst_Ratio
Panel A:	Low Ins	titutional T	rading						
Mean	5,249**	2.566***	$0.012^{***}$	-0.001	9,362	16,521***	$0.004^{*}$	0.002	$0.090^{***}$
Std Dev	636	1.590	0.007	0.072	4,517	8,633	0.048	0.033	0.020
Min	3,859	1.235	0.005	-0.174	212	259	-0.342	-0.138	0.040
Median	5,320	2.218	0.011	0.004	9,039	15,984	0.007	0.001	0.091
Max	6,390	14.066	0.061	0.212	23,402	46,382	0.196	0.158	0.122
Obs	247	247	247	247	247	247	247	247	247
	(54.6)	(54.6)	(54.6)	(54.6)	(54.6)	(54.6)	(54.6)	(54.6)	(54.6)
Panel B:	High Ins	stitutional	Frading						
Mean	5,124	1.879	0.009	0.011	9,976	18,972	0.015	0.004	0.176
Std Dev	648	0.712	0.004	0.065	5,120	10,854	0.063	0.034	0.056
Min	3,853	1.236	0.005	-0.163	439	582	-0.175	-0.113	0.122
Median	5,001	1.669	0.009	0.013	9,899	18,443	0.010	0.001	0.161
Max	6,338	5.988	0.031	0.207	23,390	46,576	0.185	0.153	0.468
Obs	245	245	245	245	245	245	245	245	245
	(45.4)	(45.4)	(45.4)	(45.4)	(45.4)	(45.4)	(45.4)	(45.4)	(45.4)

 Table 8

 Descriptive Statistics of Institutional Trading for TAIFEX from 2002 to 2003

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 492 trading days. High and low institutional trading days are classified according to the medium of *InsLratio* of entire data. Price is the daily price in index points for the most actively traded future contracts. Moreover, spread indicates the daily difference between the best bid and ask prices in index points. Furthermore, spread percentage is the daily percentage of the spread divided by the midpoint of the best bid and ask prices. Return is the cumulative daily return of Taiwan Stock Exchange Capitalization Weighted Index from t - 20 to t - 1. Number of trades is the daily number of trades for the most actively traded futures contracts. *Imb\_order* is the daily difference between number of trades for the most actively traded futures contracts. *Imb\_order* is the daily difference between number of buy and number of sell limit orders divided by the daily sum of number of buy and sell limit orders. *Imb\_order* sizes divided by the sum of daily buy and sell limit sizes. Finally, *Inst\_ratio* represents the ratio of daily institutional trading volume to the daily trading volume. The ratios in parentheses show percentages of observations classified to the whole sample. Mann-Whitney-Wilcoxon tests are performed for the differences between all variables in 2002 and 2003. \*, \*\*, \*\*\* denote significance levels at 10%, 5% and 1%, respectively.

days. Therefore, institutional traders trade actively on days when trading costs are lower.

Table 9 reveals the relationship between transient volatility and subsequent market depth for institutional trading activity. Panel A of Table 9 shows the estimation results for lower institutional trading. The transient volatility is significantly and positively related to subsequent market depth in both bull and bear markets. Therefore, increased liquidity trading causes liquidity traders to submit more orders when transient volatility is higher.

The estimation results for high institutional trading in Panel B of Table 9 show that higher institutional trading induces a negative relationship between transient volatility and subsequent market depth during bear markets. Hence, this empirical evidence is consistent with the findings in Table 3 that liquidity traders do not trade actively during bear markets with active institutional trading, since the probability of trading against informed institutional traders is higher when institutional trading is much more intensive.

Table 10 presents the estimation results for the relationsh ip between mark et depth and subsequent transient volatility for institutional trading. The estimation results

R	egression of S	Regression of Subsequent Market Depth on Transitory Volatility According to Institutional Trading	ket Depth on J	<b>Fransitory Vol</b>	atility Accordin	ig to Institutio	nal Trading	
Panel A: Low Institutional Trading	titutional Tradin	g Limit Order Sizes (DEPTHVOL <sub>1</sub> )	$DEPTHVOL_t$ )		Nun	Number of Limit Orders (DEPTHORD,)	s (DEPTHORD <sub>t</sub> )	
	$\beta_1$	$eta_2$	$\beta_3$	$eta_4$	$\gamma_1$	$\gamma_2$	$\gamma_3$	$\gamma_{4}$
Whole Period	44.530 720 265)	0.009	0.925***	0.075***	27.641** 714.0501	$-0.209^{***}$	1.015***	$-0.009^{**}$
2002	50.637	-0.004	$0.930^{***}$	$0.070^{***}$	$12.110^{**}$	$-0.169^{***}$	1.014***	(100.0)
2003	(54.222) $521.292^{*}$	(0.010) -0.076**	(0.012) $0.827^{***}$	(0.012) $(0.181^{**})$	(0.181) $156.701^{*}$	(0.030) $-0.300^{***}$	(0.014) $(0.989^{***})$	(0.007) $0.011^{***}$
RB1	(274.204)	(0.032)	(0.082)	(0.081)	(GUU.G8)	(GIU.U)	(0.004)	(0.004)
Bearl	$394.634^{***}$	$-0.054^{***}$	$0.862^{***}$	$0.181^{***}$	$162.195^{***}$	$-0.198^{***}$	$1.037^{***}$	0.003
Bull1	(109.592) 20.818	(0.019) 0.003	$(0.052)$ $0.925^{***}$	(0.052) $0.075^{***}$	(39.511) $19.608^{**}$	(0.012) -0.225***	(0.004) $1.010^{***}$	(0.003) -0.006
	(16.168)	(0.014)	(0.008)	(0.008)	(8.972)	(0.034)	(0.012)	(0.007)
BB2								
Bear2	$410.787^{***}$ (104.176)	$-0.050^{***}$ (0.019)	$0.860^{***}$ (0.054)	$0.183^{***}$ (0.054)	$183.566^{***}$ (37.331)	$-0.189^{***}$ (0.012)	$1.038^{***}$ (0.004)	0.002 (0.003)
Bull2	21.341	-0.002	$0.924^{***}$	$0.075^{***}$	$18.714^{**}$	$-0.233^{***}$	$1.010^{***}$	-0.006 /0.006
BB3	(1111.01)	(010.0)	(0000)	(000.0)	(ncr)	(FCU.U)	(210.0)	(000.0)
Bear3	$393.618^{***}$	$-0.053^{***}$	0.859*** (0.059)	$0.184^{***}$	$172.388^{***}$	$-0.190^{***}$	$1.039^{***}$	0.002
Bull3	20.198	0.002	0.925***	0.075***	19.017**	$-0.234^{***}$	$1.008^{***}$	-0.005
BB4	(176.01)	(010.0)	(0000)	(600.0)	(160.0)	(000.0)	(210.0)	(100.0)
Bear4	$408.571^{***}$ (108.095)	$-0.051^{***}$ (0.020)	$0.862^{***}$ (0.054)	$0.182^{***}$ (0.055)	$170.691^{***}$ (39.404)	$-0.196^{***}$ (0.012)	$1.037^{***}$ (0.004)	0.003
Bull4	(16.620)	0.000 (0.014)	(0.008)	0.075*** (0.008)	(8.706)	$-0.225^{***}$ (0.033)	(0.012)	(0.006)

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Table 9

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Panel B: High In	Panel B: High Institutional Trading I	g Limit Order Sizes (DEPTHVOL <sub>1</sub> )	$DEPTHVOL_t$ )		Num	Number of Limit Orders (DEPTHORD <sub>t</sub> )	s (DEPTHORD <sub>t</sub> )	
	$\beta_1$	$\beta_2$	$\beta_3$	$eta_4$	$\gamma_1$	$\gamma_2$	$\gamma_3$	${\cal Y}_4$
Whole Period	104.383	0.075***	$1.270^{***}$	-0.288***	51.422	$-0.252^{***}$	0.992***	$-0.008^{***}$
2002	(105.043) 34.998	(0.017) -0.022	(0.057) $(0.753^{***})$	(0.008)	(37.026) -2.350	(0.008) -0.167***	(0.003) 1.043***	(0.002) $0.006^{***}$
2003	(83.875) 105.178	$(0.028)$ $0.069^{***}$	$(0.053)$ $1.269^{***}$	(0.054) $-0.288^{***}$	(27.093) 51.408	$(0.016) -0.260^{***}$	$(0.005)$ $0.987^{***}$	(0.006) -0.006***
144	(102.140)	(0.018)	(0.058)	(0.059)	(37.646)	(0.008)	(0.004)	(0.003)
bb1 Bearl	$-70.522^{***}$	$0.147^{***}$	$1.292^{***}$	$-0.317^{***}$	$-10.772^{***}$	$-0.215^{***}$	$1.002^{***}$	$-0.010^{**}$
B.,111	(12.059) 80.005***	(0.034)	(0.097)	(0.097)	(2.345) 98 750***	(0.017)	(0.007)	(0.004)
TIMO	(11.466)	(0.018)	(0.074)	(0.076)	(2.292)	(0.009)	(0.004)	(0.003)
BB2								
Bear2	$-76.259^{***}$	$0.145^{***}$	1.335***	$-0.360^{***}$	$-10.944^{***}$	$-0.219^{***}$	1.002***	$-0.010^{***}$
Bull2	88.548***	$0.041^{**}$	$1.227^{***}$	$-0.242^{***}$	$30.478^{***}$	$-0.270^{***}$	$0.985^{***}$	$(100.0)$ $-0.008^{***}$
	(12.072)	(0.019)	(0.085)	(0.087)	(1.976)	(0.009)	(0.004)	(0.003)
BB3					·			
Bear3	$-75.894^{***}$	$0.133^{***}$	1.352***	$-0.376^{***}$	$-10.873^{***}$	$-0.226^{***}$	0.997***	$-0.010^{***}$
Bull3	$97.012^{***}$	$0.039^{**}$	$1.169^{***}$	$-0.182^{*}$	(1.044) $32.123^{***}$	$-0.270^{***}$	0.988***	(100.0)
	(13.385)	(0.020)	(0.099)	(0.101)	(1.995)	(0.009)	(0.004)	(0.004)
BB4								
Bear4	$-73.579^{***}$	$0.156^{***}$	$1.306^{***}$	$-0.332^{***}$	$-10.980^{***}$	$-0.212^{***}$	$1.003^{***}$	$-0.010^{***}$
D114	(12.019) 09.004***	(0.035)	(0.098)	(0.098)	(2.255)	(0.017)	(0.007)	(0.004)
Dun4	00.004 (11.385)	(0.018)	(0.075)	(0.076)	(2.207)	(0.008)	(0.004)	(0.003)

Table 9 (Continued)

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Table

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 492 trading days. This table describes the GMM estimates of the following regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are:

$$DEPTHVOL_{t} = \alpha_{1} + \beta_{1} RISK_{t-1} + \beta_{2} VOLUME_{t} + \beta_{3} DEPTHVOL_{t-1} + \beta_{4} DEPTHVOL_{t-2} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{1t}$$

$$DEPTHORD_{t} = \alpha_{2} + \gamma_{1} RISK_{t-1} + \gamma_{2} NTRADORD_{t} + \gamma_{3} DEPTHORD_{t-1} + \gamma_{4} DEPTHORD_{t-2} + \sum_{i=1}^{17} \rho_{i} TIME_{i,t} + \varepsilon_{2t}$$

where DEPTHVOL<sub>i</sub> (DEPTHORD<sub>i</sub>) denotes the market depth measured as the total size (number) of limit orders outstanding at the bid and ask quotes following time interval t; RISK<sub>t-1</sub> represents the transitory volatility measured as the sum of the squared returns during time interval t - 1; VOLUME<sub>t</sub> is the transaction volume during time interval *i*; NTRADORD*i* is the number of transactions completed during time interval *i*; TIME<sub>*i*,*i*</sub> represents a dummy variable with the value of one if time t belongs to the 15-minute intraday interval i, and otherwise is zero; and  $\varepsilon_{1t}$  and  $\varepsilon_{2t}$  denote random error terms. Moreover, BB1, BB2, BB3 and **BB4** represent the  $(\lambda_1, \lambda_2)$  values of  $(1\sigma_s, 1\sigma_s)$ ,  $(0.5\sigma_s, 0.5\sigma_s)$ ,  $(1\sigma_s, 0.5\sigma_s)$ ,  $(1\sigma$ 

		it Order Sizes PTHVOL <sub>t-1</sub> )			er of Limit Order PTHORD <sub>t-1</sub> )	-5
	$\beta_1$	$\beta_2$	$\beta_3$	γ1	$\gamma_2$	<b>Y</b> 3
Panel A: I	Low Institutiona	l trading				
Whole Period	46.9330	0.0865***	0.0002***	44.5600	0.0942***	0.0005***
	(35.1670)	(0.0233)	(0.0001)	(33.5040)	(0.0227)	(0.0001)
2002	34.3110	0.1770***	0.0002**	33.2330	0.1590***	0.0002
	(28.4080)	(0.0439)	(0.0001)	(27.3600)	(0.0360)	(0.0001)
2003	215.5990***	0.0436***	$-0.0068^{***}$	220.7780***	0.0392***	$-0.0026^{*}$
	(53.4210)	(0.0065)	(0.0020)	(55.3270)	(0.0065)	(0.0014)
BB1						
Bear1	19.5680	0.0613***	-0.0036	18.5000	0.0663***	0.0012
	(19.4580)	(0.0086)	(0.0029)	(18.3220)	(0.0104)	(0.0029)
Bull1	102.7470	0.1100***	0.0002**	97.7750	0.1150***	0.0004***
DDO	(78.8370)	(0.0426)	(0.0001)	(76.2740)	(0.0405)	(0.0002)
BB2			0.0044			0.0000
Bear2	19.7580	0.0605***	-0.0044	18.7540	0.0654***	0.0029
<b>D</b> 110	(19.7490)	(0.0088)	(0.0030)	(18.7160)	(0.0104)	(0.0030)
Bull2	101.6630	0.1130***	0.0002***	96.4100	0.1180***	0.0004***
DDA	(78.4580)	(0.0436)	(0.0001)	(75.7720)	(0.0414)	(0.0001)
BB3			0.00.40	10 1000	0.000	
Bear3	20.5160	0.0613***	-0.0042	19.4320	0.0661***	0.0021
D 110	(20.2840)	(0.0083)	(0.0030)	(19.1670)	(0.0098)	(0.0028)
Bull3	100.3580	0.1150***	0.0002**	95.3450	0.1190***	0.0004**
<b>DD</b> (	(78.1180)	(0.0454)	(0.0001)	(75.5140)	(0.0429)	(0.0002)
BB4	10.0400	0.000***	0.0000		0.00	0.0015
Bear4	19.0430	0.0608***	-0.0038	18.0470	0.0658***	0.0017
D 114	(19.0880)	(0.0091)	(0.0030)	(18.0260)	(0.0110)	(0.0031)
Bull4	103.6110	0.1090***	0.0002***	98.4680	0.1140***	0.0004***
	(78.9890)	(0.0411)	(0.0001)	(76.3700)	(0.0392)	(0.0001)
Panel B: I	High Institution	al Trading				
Whole Period	19.5410	0.0990*	-0.0159	19.1160	0.1160**	0.0173**
	(18.9640)	(0.0596)	(0.0113)	(18.3650)	(0.0566)	(0.0086)
2002	364.0990***	$0.1370^{***}$	$-0.0291^{***}$	360.7220***	0.0903***	0.0041
	(118.9190)	(0.0249)	(0.0076)	(119.4500)	(0.0218)	(0.0051)
2003	11.4340	$0.1020^{*}$	-0.0147	11.2430	0.1200**	$0.0177^{*}$
	(13.3940)	(0.0624)	(0.0112)	(12.9950)	(0.0610)	(0.0108)
BB1						
Bear1	2.5770	0.1820	-0.0228	5.3750	0.1800	0.0048
	(31.6130)	(0.1350)	(0.0177)	(28.2500)	(0.1250)	(0.0039)
Bull1	22.1140	0.0405***	-0.0065	25.0870	0.0749***	0.0255
	(29.0550)	(0.0091)	(0.0072)	(27.1830)	(0.0249)	(0.0168)
BB2						
Bear2	4.8360	0.1730	-0.0209	7.3080	0.1720	0.0039
	(31.1180)	(0.1290)	(0.0161)	(28.1510)	(0.1200)	(0.0040)
Bull2	21.3290	0.0420***	-0.0066	24.2730	$0.0782^{***}$	0.0264
	(28.9480)	(0.0100)	(0.0072)	(26.9620)	(0.0265)	(0.0171)

# Table 10 Regression of Subsequent Transitory Volatility on Market Depth According to Institutional Trading

		nit Order Sizes EPTHVOL <sub>t-1</sub> )			ber of Limit Order. EPTHORD <sub>t-1</sub> )	\$
	$\beta_1$	$\beta_2$	$\beta_3$	γ1	$\gamma_2$	Y 3
BB3						
Bear3	8.8270	0.1520	-0.0164	10.3470	0.1570	0.0047
	(29.9880)	(0.1150)	(0.0137)	(27.5250)	(0.1100)	(0.0037)
Bull3	20.4170	0.0491***	-0.0106	23.1200	0.0833***	0.0275
	(28.8560)	(0.0120)	(0.0085)	(26.8710)	(0.0285)	(0.0180)
BB4	· · · ·		· · · · ·	· · · ·	· /	. ,
Bear4	1.6710	0.1870	-0.0224	4.6050	0.1860	0.0050
	(31.8720)	(0.1400)	(0.0170)	(28.5840)	(0.1320)	(0.0042)
Bull4	22.5610	0.0413***	-0.0061	25.4010	$0.0748^{***}$	0.0245
	(29.1310)	(0.0093)	(0.0070)	(27.2970)	(0.0245)	(0.0161)

Table 10 (Continued)

The sample period runs from January 1, 2002 to December 31, 2003, and comprises 492 trading days. This table shows the GMM estimates of regression models based on 15-minute intervals and adjusted for serial correlation by Newey and West (1987). The regression models are:

$$RISK_{t} = \alpha_{1} + \beta_{1} RISK_{t-1} + \beta_{2} VOLUME_{t} + \beta_{3} DEPTHVOL_{t-1} + \sum_{i=1}^{18} \rho_{i} TIME_{i,t} + \varepsilon_{1t}$$
$$RISK_{t} = \alpha_{1} + \gamma_{1} RISK_{t-1} + \gamma_{2} NTRADEORD_{t} + \gamma_{3} DEPTHORD_{t-1} + \sum_{i=1}^{18} \rho_{i} TIME_{i,t} + \varepsilon_{2t}$$

t

where RISK<sub>t</sub> represents the volatility measured as the sum of the squared returns during time interval t; DEPTHVOL<sub>t-1</sub> (DEPTHORD<sub>t-1</sub>), is the depth (total size (number) of outstanding limit orders at the bid and ask quotes) following time interval t - 1; TIME<sub>i,t</sub> represents a dummy variable that takes the value of one if time t belongs to the 15-minute intraday interval i, and zero otherwise; and  $\varepsilon_{1t}$  and $\varepsilon_{2t}$  are random error terms. Moreover, BB1, BB2, BB3 and BB4 represent the  $(\lambda_1, \lambda_2)$  values of  $(1\sigma_s, 1\sigma_s)$ ,  $(0.5\sigma_s, 0.5\sigma_s)$ ,  $(1\sigma_s, 0.5\sigma_s)$  and  $(0.5\sigma_s, 1\sigma_s)$ , respectively, where  $\sigma_s$  represents the daily standard deviation of TAIEX indices. Reported coefficients and standard errors are magnified by  $10^3$  for the exposition purpose. The standard errors are in parentheses. \*, \*\*, \*\*\* denote the significance levels at 10%, 5% and 1%, respectively.

indicate that higher depth significantly leads to higher subsequent transient volatility in bull markets when institutional trading is low. Therefore, traders are more active in trading in bull markets when the probability of trading against informed institutional traders is lower, which is consistent with those found in Table 6.

The findings here indicate that asymmetric responses between transient volatility and limit order submission during bear and bull markets are associated with the intensity of institutional trading. When institutional traders are active in the market, liquidity traders take back their limit orders due to the increased probability of being picked off and the increased probability of losses more to informed institutional traders, especially in bear markets. The empirical evidence in this study is consistent with Lee et al. (1993) and Kavajecz (1999), indicating that depth is much smaller when informed trading is more likely.

#### 5. CONCLUSION

Given that liquidity provision is a long-standing important structural issue for markets, this work studies market depth for futures contracts using limit order data from the Taiwan Stock Exchange Capitalization Weighted Stock Index futures (TAIEX futures) traded on the Taiwan Futures Exchange (TAIFEX). The TAIFEX is a purely orderdriven market without designated market makers obliged to maintain a fair and orderly market. The possible asymmetric pattern of the relationship between market depth and transient volatility in bull and bear markets is also considered, since substantial evidence reveals asymmetric responses in capital markets to upward and downward trends. Further, institutional trading plays a very important role in futures trading. The impact of institutional trading on the relationship between transient volatility and market depth was also examined.

The empirical results reveal a significant and positive relationship between transient volatility and subsequent market depth in bull markets, but not in bear markets. Liquidity traders tend to reduce subsequent market depth when transient volatility increases during bear markets. Thus, in bull markets, the present analytical results regarding the relationship between transient volatility and subsequent market depth are consistent with the findings of Handa and Schwartz (1996) and Ahn et al. (2001).

Liquidity increases if upside volatility is higher in bull markets. Further, the trading volume or number of trades affects transient volatility more positively in bull markets than in bear markets. Analytical results thus indicate the importance of distinguishing between market trends as the liquidity provision by limit orders differs between bull and bear markets. Additionally, the asymmetrical transient volatility-market depth during bear and bull markets is strongly related to the degree of institutional trading activity.

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