


**DYNAMIC MARKET MODELING
WITH HETEROGENEOUS AGENTS:
APPLICATIONS IN DIVERSE MARKETS**

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Applications in Diverse Markets*

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TABLE OF CONTENTS

FOREWORD	13
ABBREVIATIONS.....	15
SYMBOLS.....	17
INTRODUCTION	19
1. LITERATURE REVIEW	23
1.1. Agent-Based Models.....	23
1.2. Agent-Based Model for Financial Markets.....	24
1.2.1. Design issues	25
1.3. Agent-Based Stock Market Models	25
1.4. Modelling Limit Order Book.....	29
1.4.1. Perfect rationality approaches	30
1.4.2. Zero intelligence approaches	31
1.4.3. Agent-Based Models for Limit Order Book	32
1.4.4. Interactive Agent-Based Simulators for Limit Order Book.....	33
2. AN AGENT BASED MODEL FOR STOCK MARKET	35
2.1. Market Mechanism	36
2.2. Traders	38
2.2.1. Noise Traders.....	39
2.2.2. RSI Traders.....	39
2.2.3. MACD Traders	40
2.2.4. Bollinger Bands Traders	41
2.2.5. ARIMA Traders	41
2.2.6. LSTM Traders.....	42
2.3. Market Initialisation.....	43
2.4. Empirical Findings.....	46
2.4.1. Price, return and volume analysis.....	48
2.4.2. Validation.....	50

2.4.3. Wealth analysis	53
3. AN INTERACTIVE AGENT-BASED LIMIT ORDER BOOK SIMULATOR	57
3.1. Limit Order Books	57
3.1.1. Building a LOB with orders	60
3.2. Limit Order Book Simulator.....	61
3.2.1. Simulator architecture.....	61
4. EXPERIMENTS FOR SIMULATED INTRADAY STOCK MARKET ...	75
4.1. Exploring Price Impact and Bid-Ask Spread.....	75
4.2. Intraday Trading Performance of Agents.....	89
CONCLUSIONS AND RECOMMENDATIONS	95
REFERENCES	98

LIST OF TABLES

Table 3.1: Market initial parameters	45
Table 3.2: Agent initial parameters. There cutt-off strategies that agents use to trade are based on agent initial parameters.....	46
Table 3.3: Agent price forecast window and cut-off strategies.....	48
Table 3.4: Asset price and return related descriptive statistics	50
Table 3.5: List of stylised facts for asset returns that is used for simulation model validations.....	53
Table 3.6: Average number of long and short positions over the trading period	54
Table 4.1: The limit order book snapshot before and after an order execution. A trader posts a sell order of $x=(383.63,120,t_1)$. Left panel: the state of the limit order book for the stock at time t_1 . Right panel: the state of the limit order book for the stock at time t_2 ...	60
Table 4.2: A snapshot from the limit order book for the best 10 price level	66
Table 4.3: Variable explanation of LOBSTER order file.....	67
Table 4.4: Attributes of an agent trade on the exchange.....	69
Table 4.5: The featurfes available to each agent trade on exchange.....	72
Table 5.1: ADBE Stock order arrival types for October 2022.....	76
Table 5.2: The descriptive statistics comparison of real and simulated market.....	79
Table 5.3: The snapshot of the limit order book for ADBE stock at a selected time	80
Table 5.4: The comparison of absolute price impact for different order sizes for simulated market ADBE.	82
Table 5.5: Descriptive statistics for simulated market stock prices	84
Table 5.6: The price impact mean, standard deviation and relative price impact.....	84
Table 5.7: Traded volume and relative price impact for each simulated stock.	85
Table 5.8: Descriptive statistics for simulated market bid-ask spread.....	86
Table 5.9: Descriptive statistics for agents's intraday total wealth in cash.	93

LIST OF FIGURES

Figure 3.1: LSTM neural network (LeCun et al., 2015).....	43
Figure 3.2: The stock market simulation trading periods. The first year of simulation time is initialization period where only noise traders post orders to create a historic data for other agents. The second year is training year for all agents and the following 18 years are trade period for all agents	44
Figure 3.3: Stock Market Simulation Loop Structure.....	47
Figure 3.4: Asset price formation at $t=600$ -time step. Agents post buy and sell orders at each time steps of simulated market. All orders are collected and an aggregate supply and demand cuves are given as blue and red lines, respectively. The next step stock price is intercept of these two curve.	49
Figure 3.5: Market outputs over simulation time. Upper left panel: Asset price. The period till solid line is price initialisation whereas the period between solid and dashed line is intelligent agents learning period, and it is trading period beyond the dashed line. Upper right panel: asset price log return. Lower left panel: asset price log return density distribution. Lower right panel : traded volume.....	49
Figure 3.6: Return related autocorrelations. Upper left panel: Asset log return autocorrelation function. Upper right panel: Asset log return partial autocorrelation function. Lower left panel: asset price absolute log return. Lower right panel : Asset squared log return.	51
Figure 3.7: Aggregational Gaussianity of returns for daily and weekly returns..	52
Figure 3.8: Average wealth of agent types in cash throughout trading period.....	54

Figure 3.9: A boxplot for wealth comparison of different agent groups.55

Figure 3.10: Gini coefficient of agent groups

for total wealth at the final step of the simulation. 56

Figure 4.1: A schema for limit order book..... 59

Figure 4.2: Limit Order Book simulator architecture. 62

Figure 4.3: Simulation Kernel Flow 63

Figure 4.4: Exchange structure with a visualized flow 65

Figure 5.1: Share of event types for ADBE Stock on 21 October 202277

Figure 5.2: The ADBE stock price of executed visible orders
on 21 October 2022. 78

Figure 5.3: The ADBE simulated the stock price of executed
orders on 21 October 2022. 78

Figure 5.4: Limit order book state for best four bid-ask prices 81

Figure 5.5: The price impact of Random Agent. Upper panel: price impacts
where fixed order size is 1. Lower panel: price impacts where the fixed
order size is 10..... 81

Figure 5.6: The comparison of absolute price impact for order size one and order
size ten for simulated market ADBE. 83

Figure 5.7: Price Impact over Market Cap by Traded Volume. The size of bubbles
represents the magnitude of overall agent price impact. 85

Figure 5.8: Bid-Ask Spread over Market Cap by Traded Volume. The size of
bubbles represents the magnitude of average bid-ask spread.86

Figure 5.9: The intraday bid-ask spread over trade hours for each stock. Upper
left panel: TSLA. Upper right panel: ADBE. Lower left panel: PAYX.
Lower right panel: GTLB. 87

Figure 5.10: Simulated GTLB midprice versus bid-ask spread..... 88

Figure 5.11: Scatter plot for simulated
GTLB midprice versus bid-ask spread 88

Figure 5.12: Bid-Ask Spread and Relative Spread over Market Cap. The size of
bubbles represents the magnitude of stock market caps..... 89

Figure 5.13: Buy and Moment of Agents for ADBE stock. Red dots are sell moments and green dots are buy moments..... 91

Figure 5.14: The intraday total wealths over four stocks. Upper left panel: Agents final wealts and mean wealths for TSLA stock. Upper right panel: Agents final wealts and mean wealths for ADBE. Lower left panel: Agents final wealts and mean wealths for PAYX. Lower right panel: Agents final wealts and mean wealths for GTLB. The orange bars represents the average value of all measured wealth in the day. The blue bars represents the final value of all measured wealth in the day..... 92

Figure 5.15: The intraday mean and standard deviation of historical balances. 94

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