

# Equity portfolio liquidation value estimation with microstructure taken into account (MICEX case)

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# Traditional Approach

## Perfect market:

- Security markets are perfectly elastic (traders act as price takers).
- All market orders have immediate execution.

## Efficient market:

- Prices reflect all available information (**Fama, 1970**).
- Price adjustment process.

# Transaction Costs

## Transaction Costs

Explicit Costs

Implicit Costs

Bid-Ask Spread

Market Impact

# Portfolio Management

- Optimal impulse control.
- Market liquidity.
- Liquidation value.

# Market Microstructure Models

- Traditional models (CAPM, Black-Scholes etc.) do not account market in asset pricing (“Black box”).
- **Market Microstructure** is the study of the process and outcomes of exchanging assets under explicit trading rules (*O’Hara, 1995*).

# Market Liquidity

- Slippery and elusive concept, reflective its multi-faceted nature.
- A liquid market is a market where participants can *rapidly* execute *large-volume* transactions with a *small* impact on prices (BIS, 1999).
- Liquidity is a relative market characteristic.
- Market design defines liquidity.

# Market Types (Execution Systems)

**Order-driven market**

**Quote-driven market**

**Price-driven market**

**Dealer market**

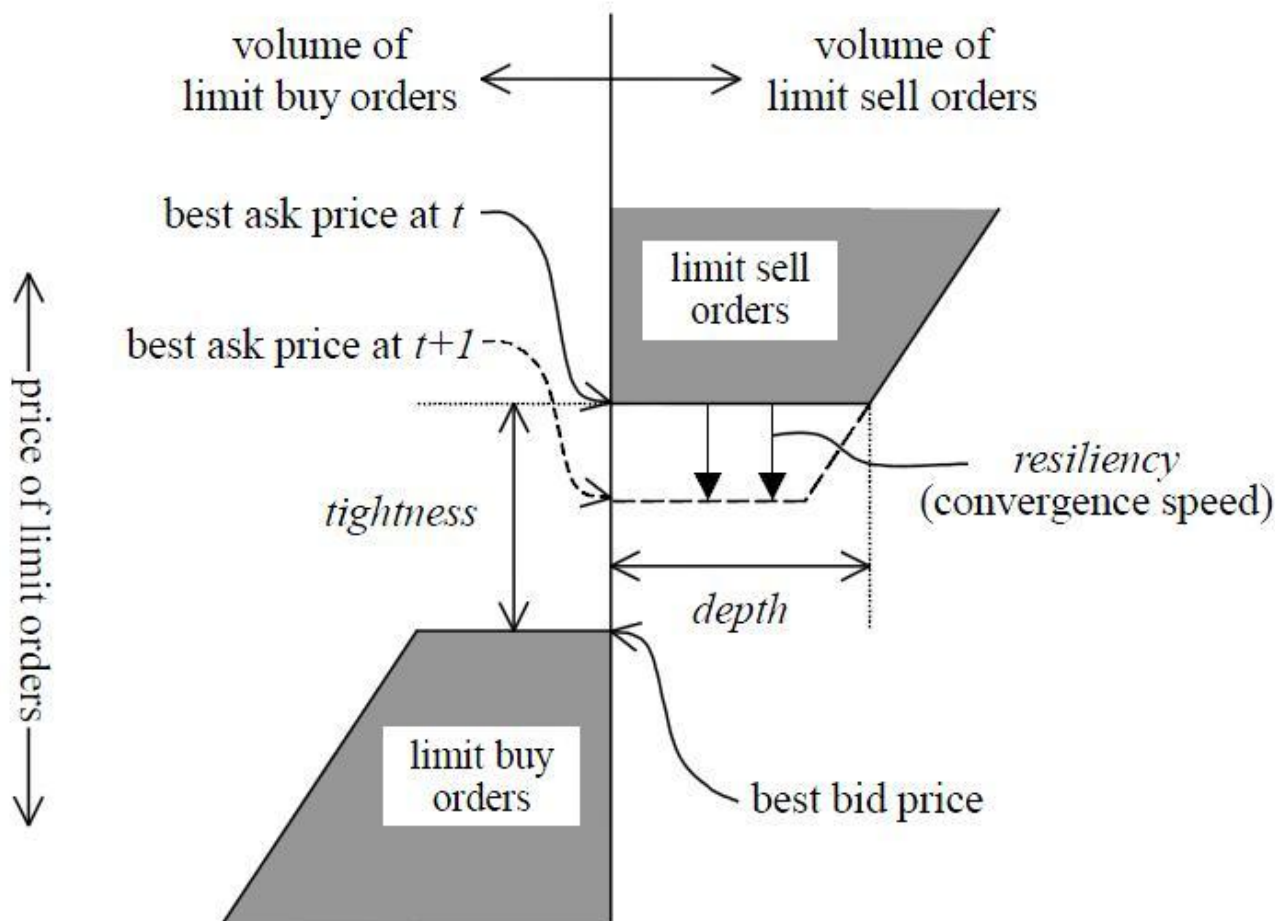
**Brokered market**

# Aspects of Market Liquidity (Kyle, 1985)

- Tightness – the cost of turning around a position over a short period of time.
- Depth – the size of an order flow innovation required to change prices a given amount.
- Resiliency – the speed with which prices recover from a random, uninformative shock.



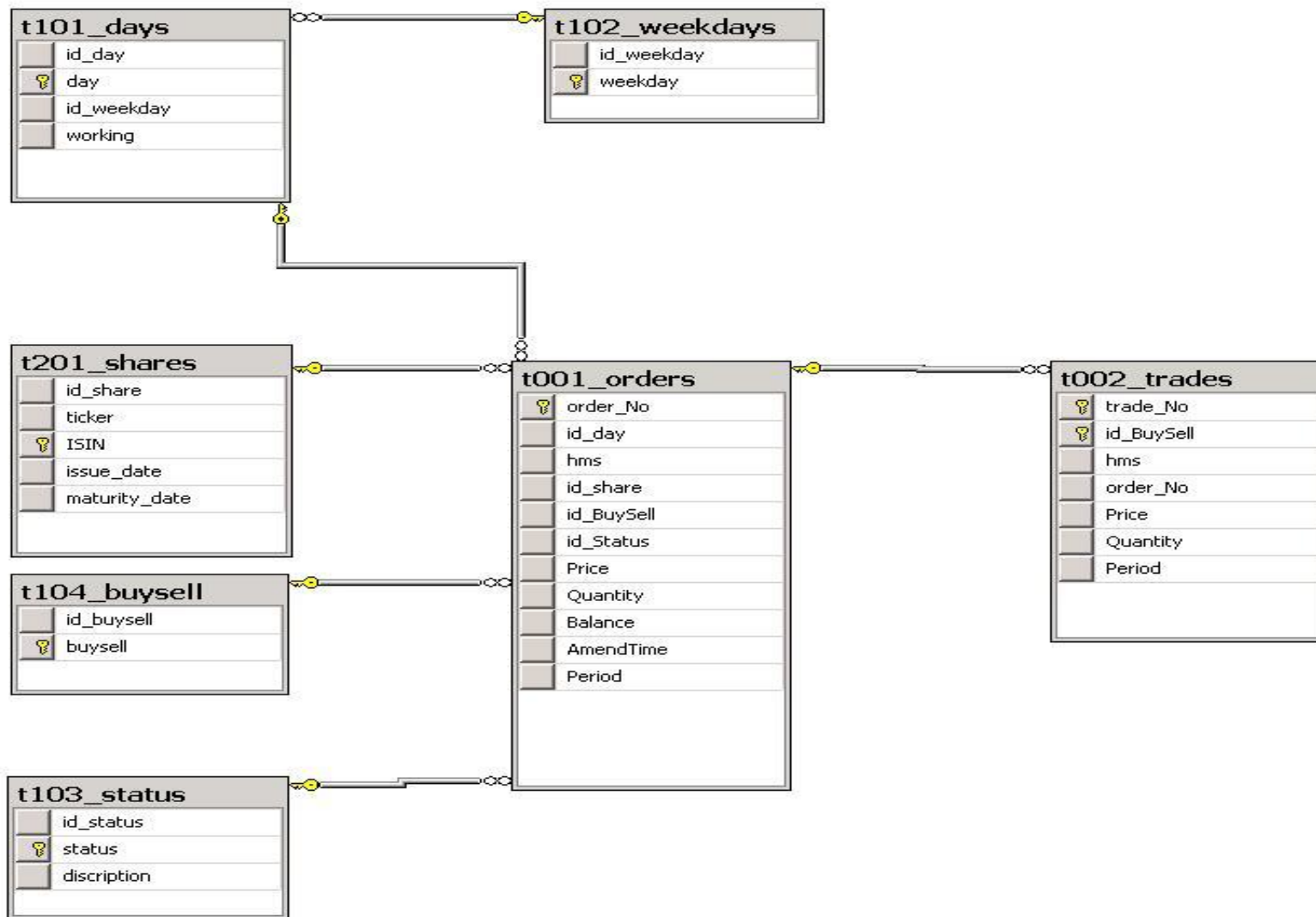
# Dimensions of Market Liquidity



# Data Set

- **708** stocks traded in MICEX from January 2006 till December 2007.
- All orders during this period (***160 115 507 records***).
- All transactions during this period (***151 022 856 records***).

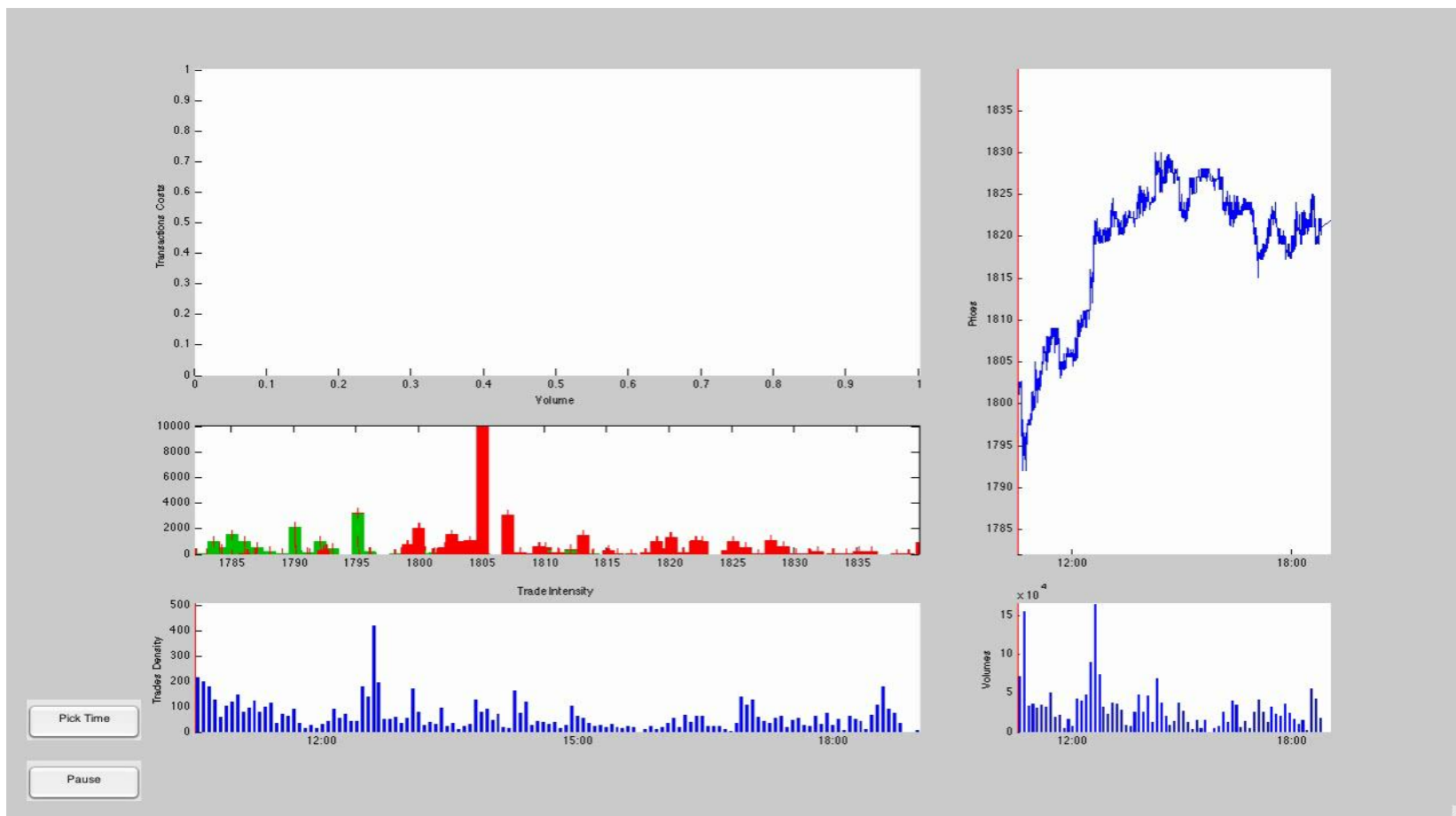
# Database Structure



# Data Preparation

- Limit order book replication (*Kavajecz, 1999*).
- Data modification.
- Aggregation (median trade volume, bid-ask spread etc.).
- Splitting orders into several types for market resiliency estimation.

# Visualization of Trading Process



# Cost Function

$$\Theta_t(n_k) = \sum_{i=1}^N (p_i - p)n_i$$

$n_k$  – total volume to be executed in time  $k$ ,

$p_i$  – execution price of  $i^{\text{th}}$  order,

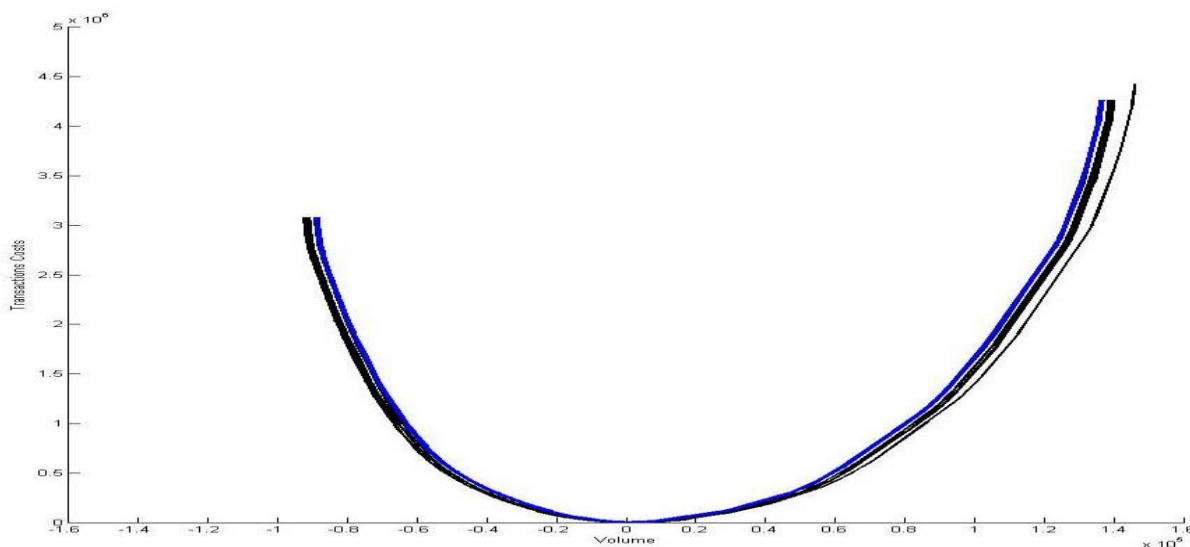
$n_i$  – volume of  $i^{\text{th}}$  order,

$p$  – asset market price which is the following:

$$p = \frac{Bid + Ask}{2}$$

# Characteristics of Cost Function

- Accounts for tightness and depth.
- Random non-negative convex function with  $f(0)=0$ .
- Approximated by  $ax^3+bx^2$ .



# Portfolio Liquidation Value

- Portfolio value is a liquidation value.
- Portfolio liquidation depends on liquidation strategy:
  - Immediate liquidation.
  - Uniform liquidation.
- Optimal portfolio liquidation can be defined by different ways including hedging.



# Optimal Liquidation Model

$V$  – initial volume,

$v_k$  – volume for liquidation in time  $k$ ,

$V_k$  – volume left at the beginning of time  $k$ ,

$\mu$  – average trend in time  $k$ ,

$\sigma$  – volatility,

$E\Theta(v_k)$  – average costs in time  $k$ ,

$Var\Theta(v_k)$  – variance of costs in time  $k$



# Optimal Liquidation Task

$$\left\{ \begin{array}{l}
 \sum_{i=1}^N v_i = V \\
 EW = x_0 V + \mu \sum_{k=1}^N \sum_{i=k}^N v_i - \sum_{k=1}^N E \Theta_k (v_k) \\
 VarW = \sigma^2 \sum_{k=1}^N \left( \sum_{i=k}^N v_i \right)^2 + \sum_{k=1}^N Var \Theta_k (v_k) \\
 EW \rightarrow \sup_{v_1, \dots, v_N} \\
 VarW \rightarrow \inf_{v_1, \dots, v_N}
 \end{array} \right.$$

# Optimal Liquidation Strategy

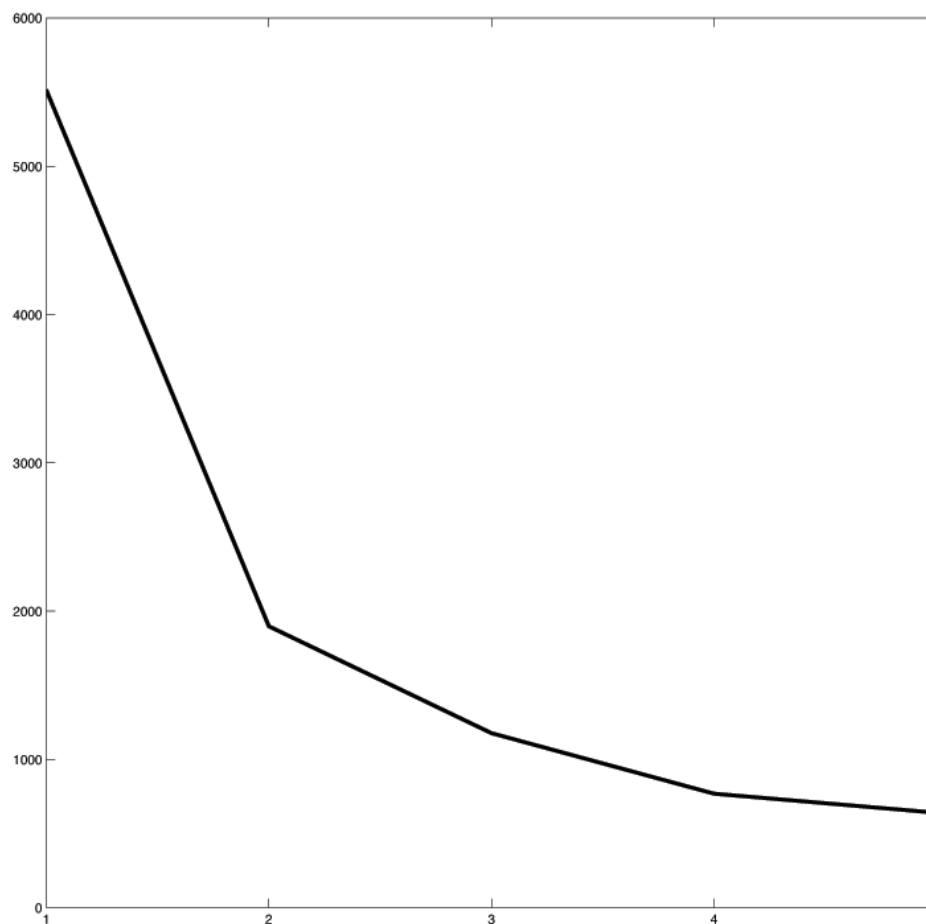
- $J(v) = \lambda \sqrt{VarW} - E(W) \rightarrow \inf_{v_1, \dots, v_n}$
- $\lambda$  – risk aversion coefficient;
- $\lambda=0$  – risk-neutral (uniform liquidation);
- $\lambda>0$  – risk-averse;
- $\lambda=\infty$  - immediate liquidation.



# Time Horizon Dependency

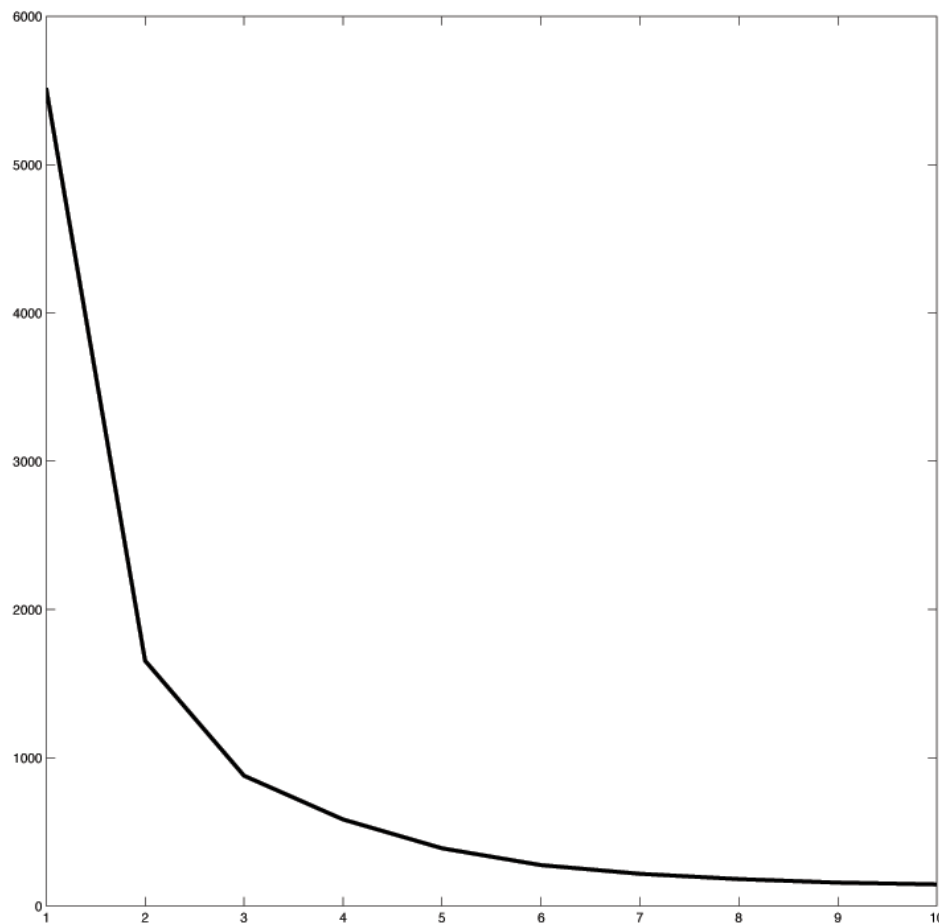
- The larger the number of time intervals the less aggressive the trading.
- The largest part of total volume is liquidated in first time intervals.

# Portfolio Liquidation (Lukoil, 10000 stocks, $N=5$ , $\lambda=1$ )

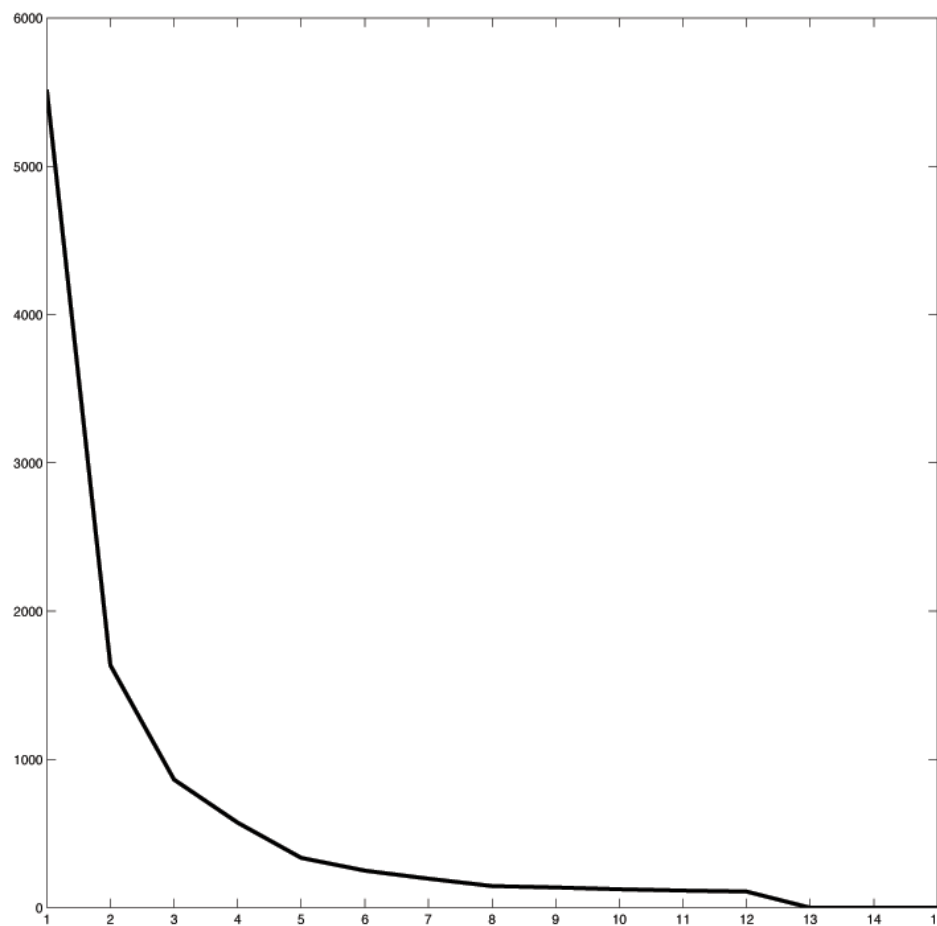


# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=1$ )



# Portfolio Liquidation (Lukoil, 10000 stocks, $N=15$ , $\lambda=1$ )



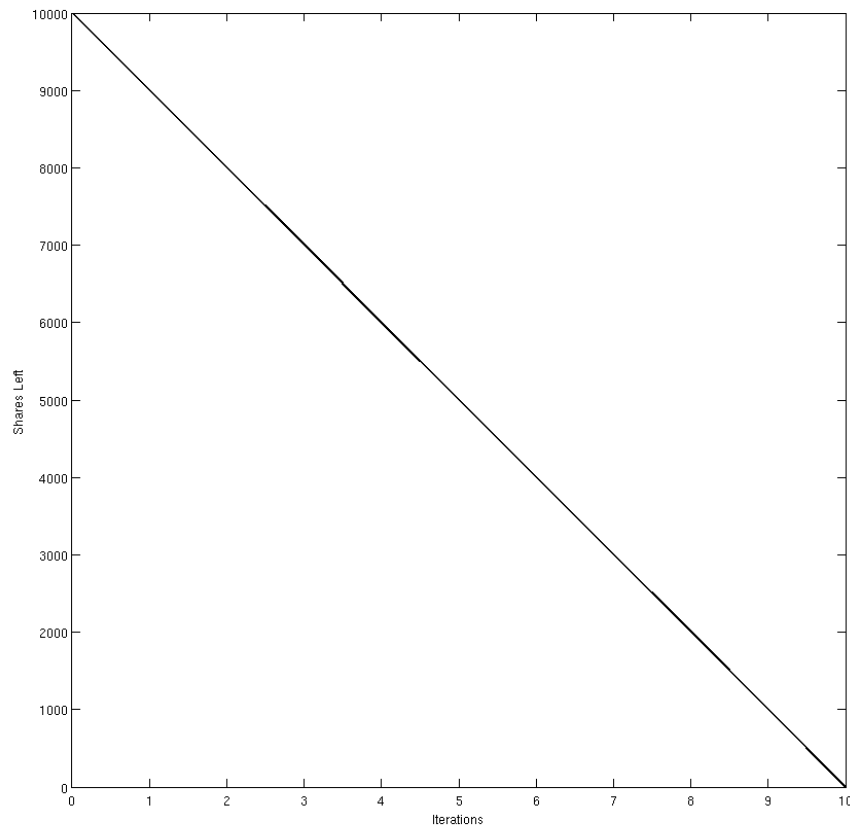
# Risk Aversion Coefficient Dependency

- The larger the risk aversion coefficient the more aggressive the liquidation.
- $\lambda=0$  – risk-neutral (uniform liquidation);
- $\lambda>0$  – risk-averse;
- $\lambda=\infty$  - immediate liquidation.



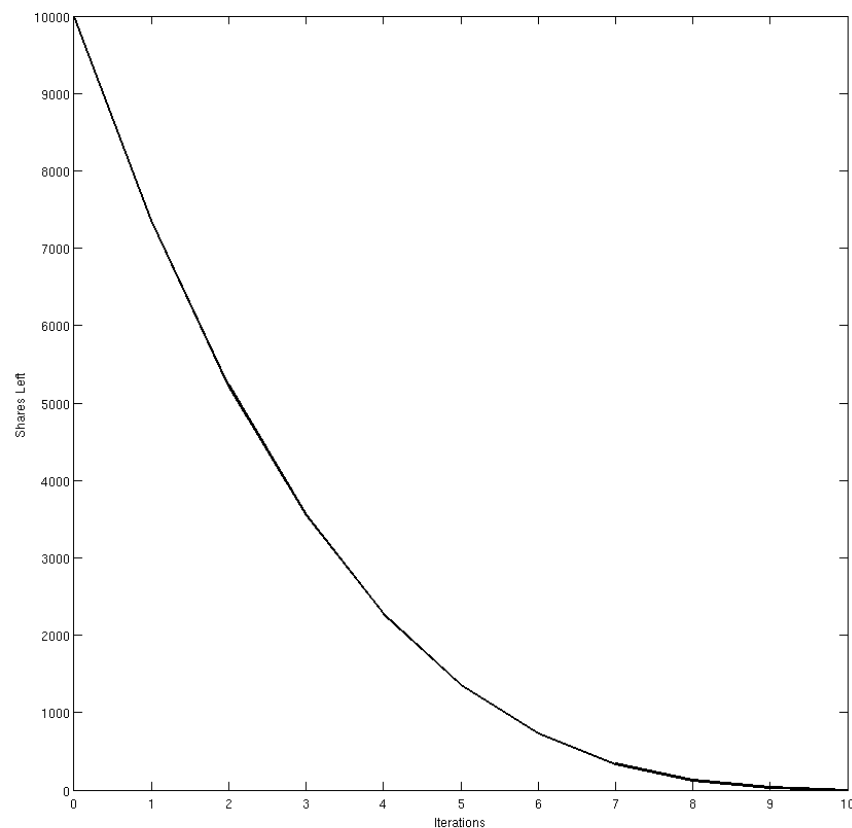
# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=0$ )



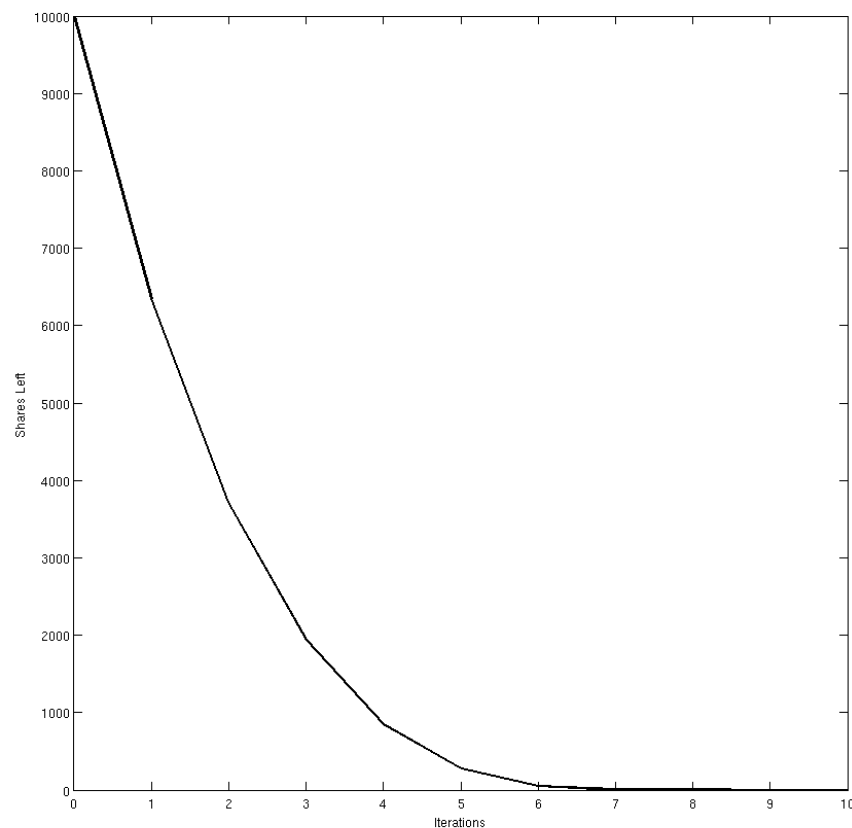
# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=0,1$ )



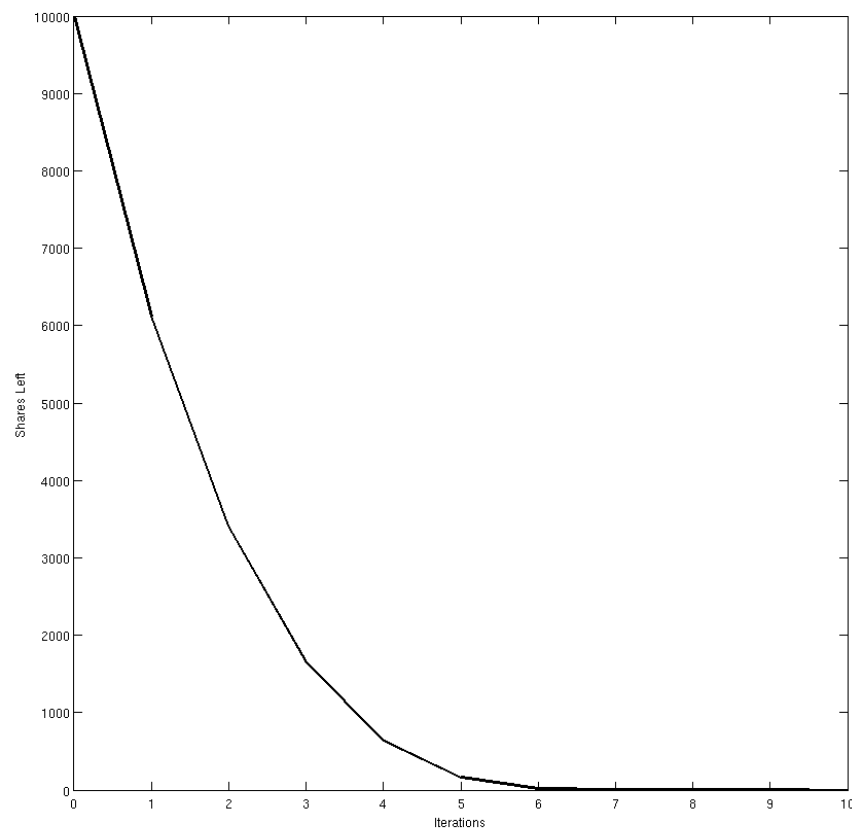
# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=1$ )



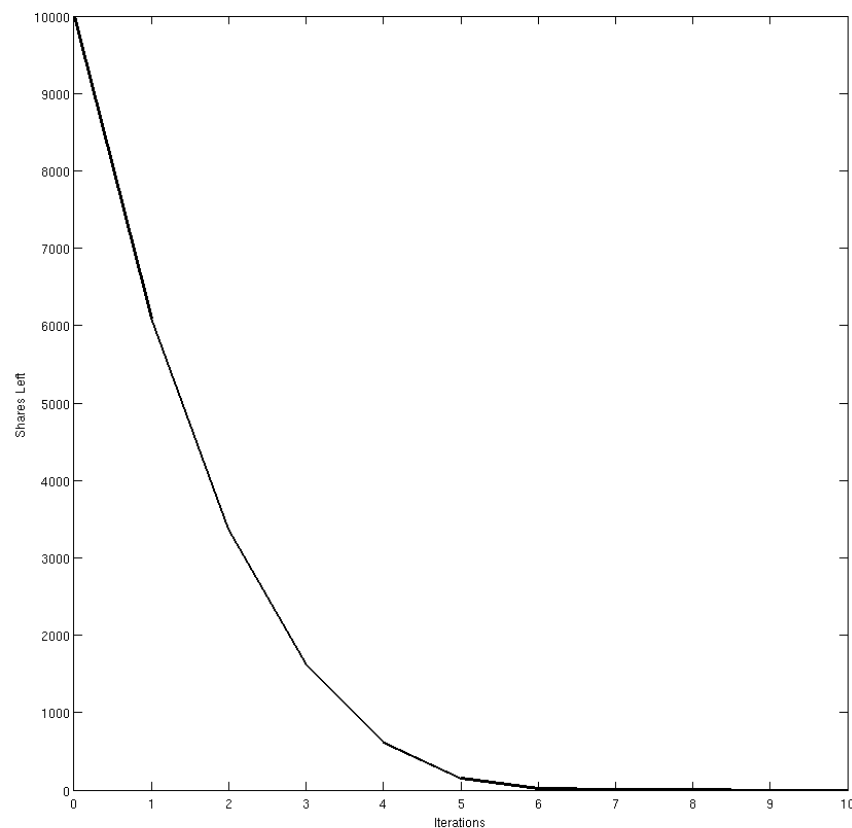
# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=10$ )



# Portfolio Liquidation

(Lukoil, 10000 stocks,  $N=10$ ,  $\lambda=1000$ )



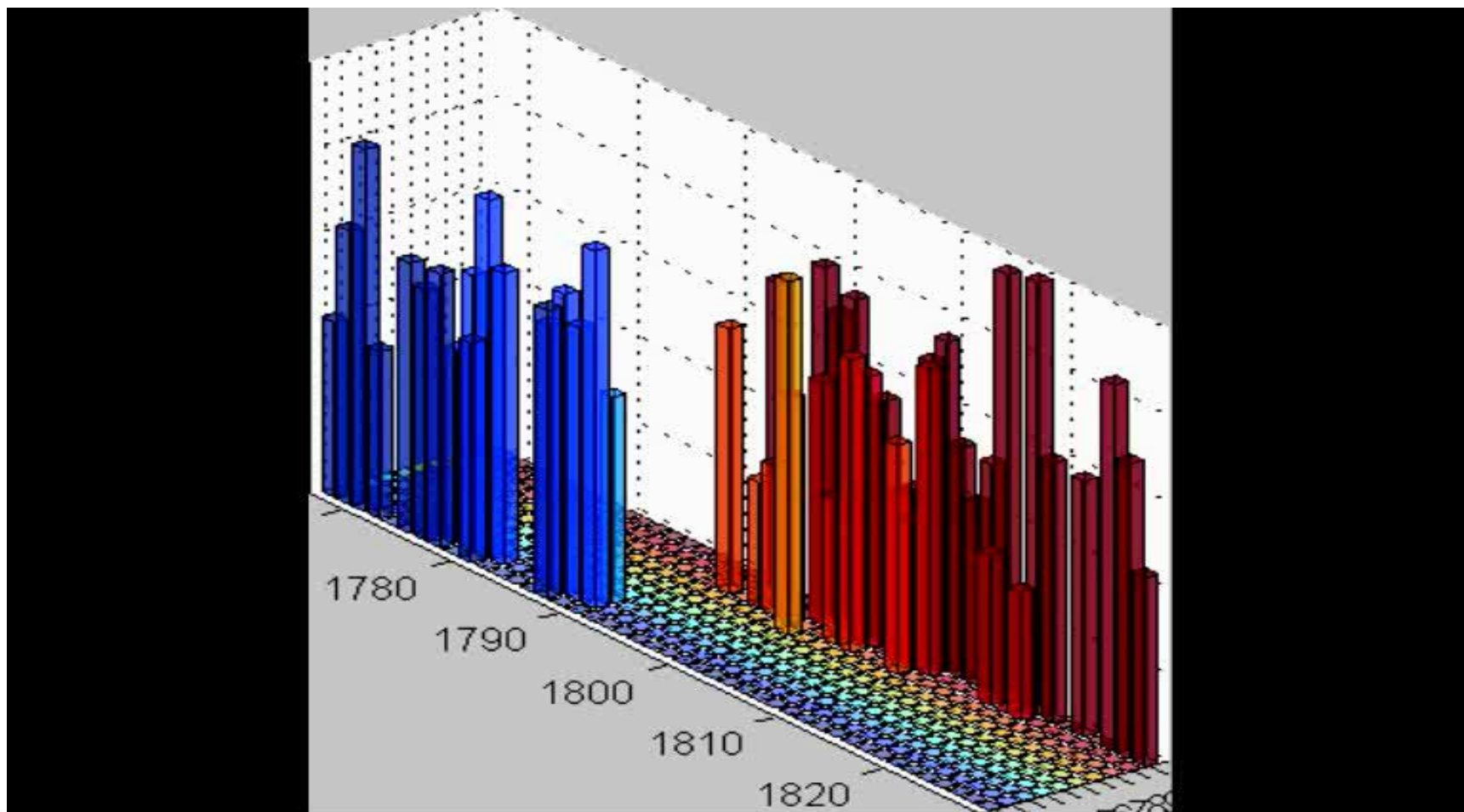
# Measuring the Resiliency (Large, 2007)

- Resiliency is formalized in terms of a time-frame and probability of order book replenishment.
- Resiliency is captured simply by the way large trades (liquidity demand shock) alter the future intensities of fresh limit order submissions (resiliency events).
- LOB is modeled as mutually-exciting ten-variate Hawkes point process.

# Categorization of Events (Biais, 1995)

No	Submission or Cancellation?	Buy or Sell?	Immediate Execution?	Moves prices?	Named
1	S	B	Yes (MO)	Yes	Market buy that moves the ask
2	S	S	Yes (MO)	Yes	Market sale that moves the bid
3	S	B	No (LO)	Yes	Bid between the quotes
4	S	S	No (LO)	Yes	Ask between the quotes
5	S	B	No (MO)	No	Market buy that doesn't move the ask
6	S	S	No(MO)	No	Market sale that doesn't move the bid
7	S	B	No (LO)	No	Bid at or below best bid
8	S	S	No (LO)	No	Ask at or above best ask
9	C	B	No	No	Cancelled bids
10	C	S	No	No	Cancelled asks

# Trading Process





**THANK YOU FOR YOUR  
ATTENTION!!!**