

# The dynamics of liquidity around price jumps

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# Research question

## Outline

### Data

### Event: price jump

### Abnormal returns and vol around jumps

### Abnormal liquidity around jumps

### Conclusions

- Liquidity at NYSE: ability to trade large quantities quickly at low cost with little price impact
- Event: Price jumps
- Related research: Lee, Mucklow, Ready (1993)
  - ✓ Event: earnings announcement.
  - ✓ 1988 (230 randomly chosen firms, after liquidity filters), 30 min data

# Lee, Mucklow, Ready (1993): NYSE

[Outline](#)

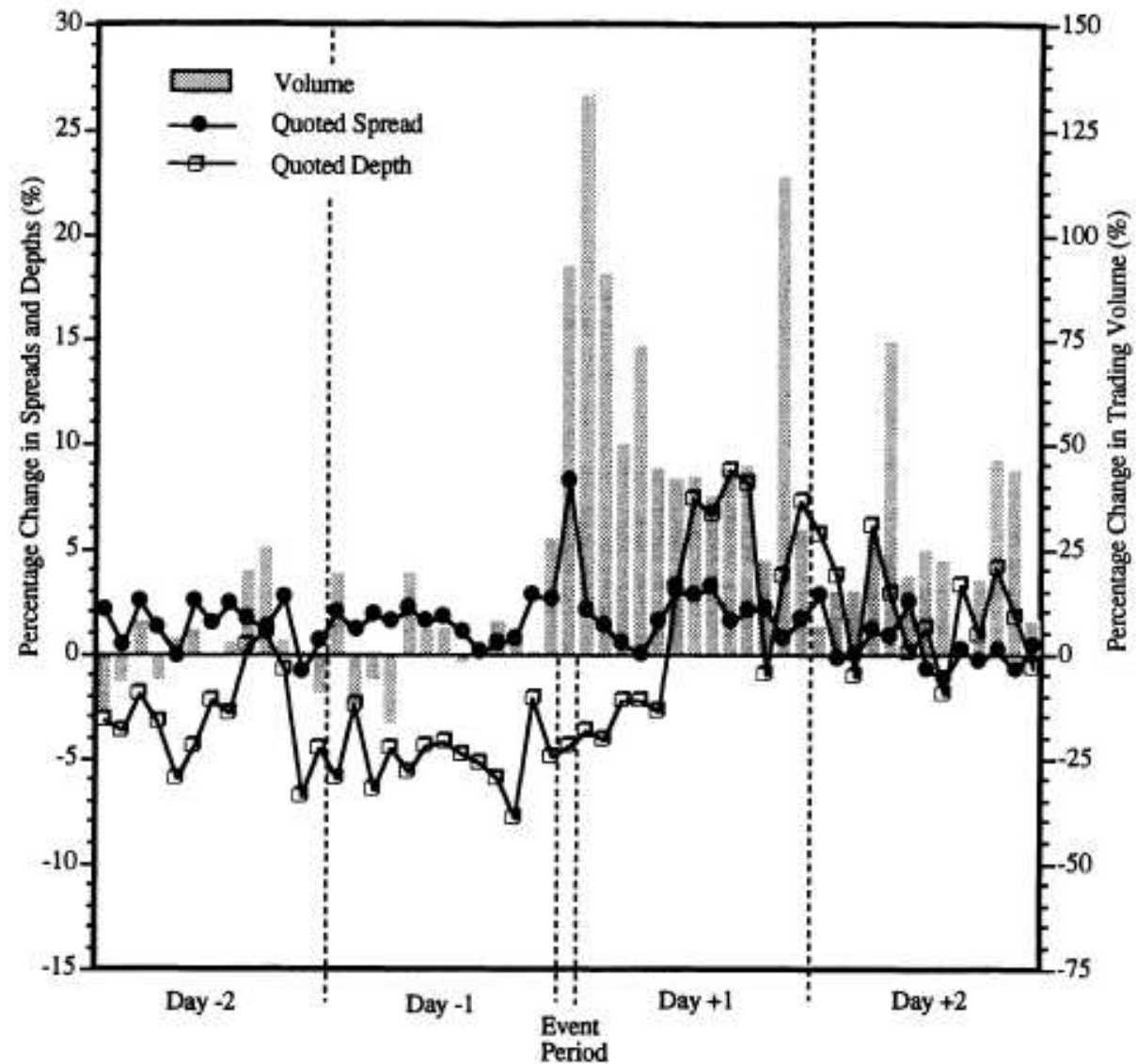
[Data](#)

[Event: price jump](#)

[Abnormal returns and vol around jumps](#)

[Abnormal liquidity around jumps](#)

[Conclusions](#)



# Outline

Outline

Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

Conclusions

- This paper: market reaction to price jumps.
- Outline:
  1. Data;
  2. Measuring the event times;
  3. Results abnormal returns, volatility;
  4. Measuring the abnormal liquidity;
  5. Results abnormal liquidity.

# Data, RTAQ

NYSE TAQ, 30 Dow Jones Industrial Average constituents (as of January 1, 2008), July 2007-December 2009 (628 days). **2 min agg.**

Outline

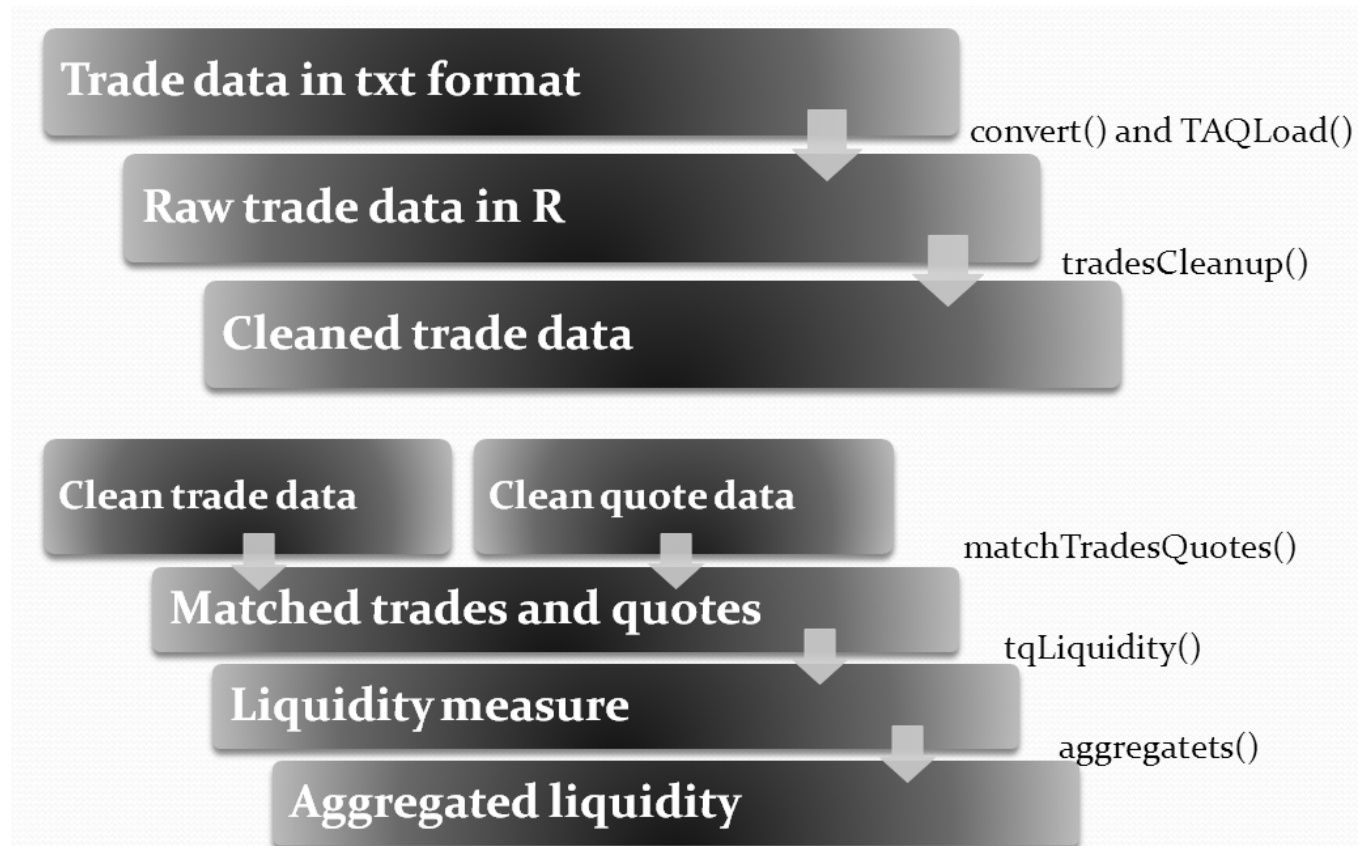
Data

Event: price jump

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# Is this a price jump?

## Outline

## Data

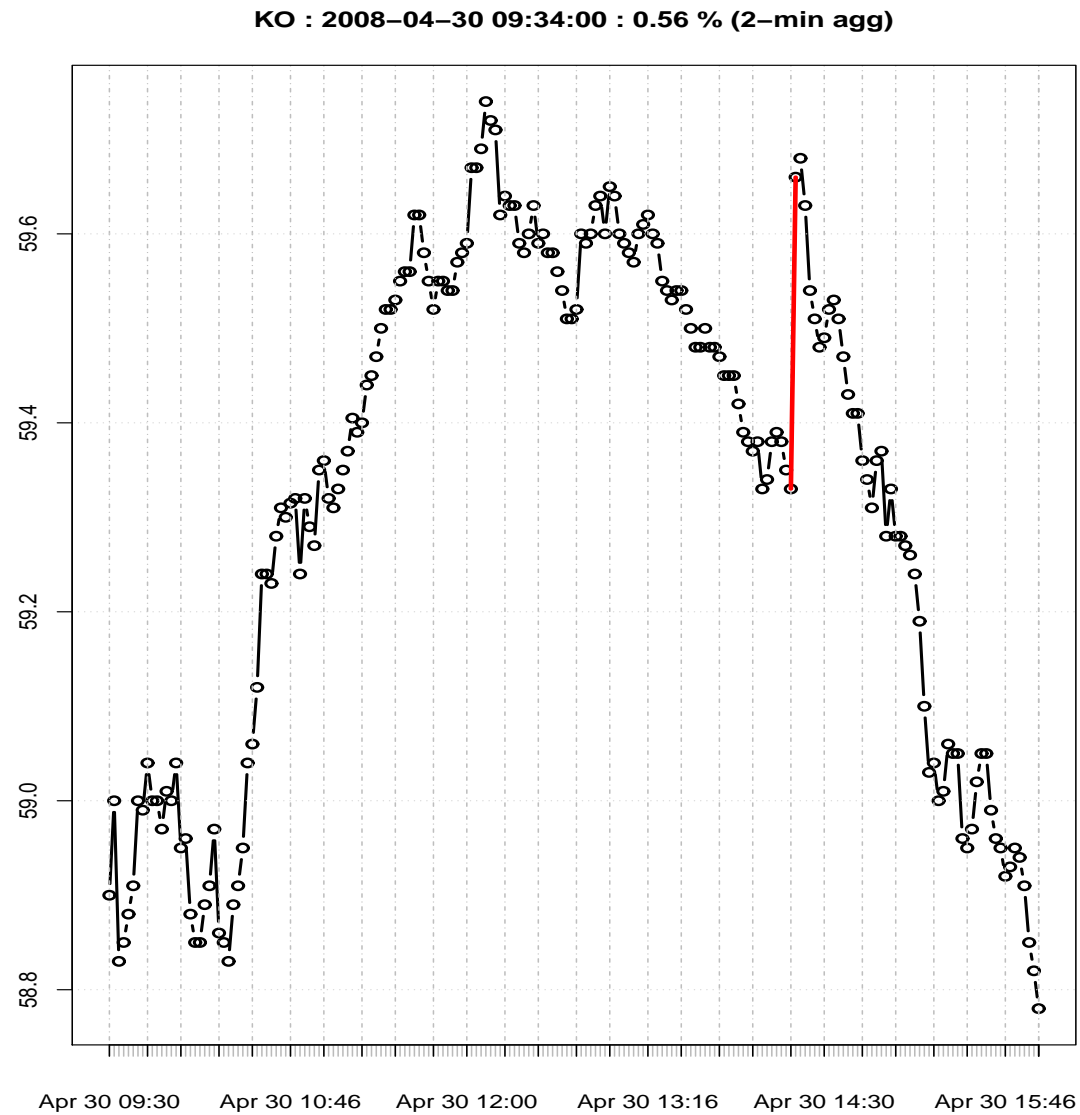
### Event: price jump

- ❖ Test
- ❖ spotVol and intraday periodicity
- ❖ Event study

Abnormal returns and vol around jumps

Abnormal liquidity around jumps

Conclusions



# Model

Outline

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Data

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Event: price jump

---

❖ Test  
❖ spotVol and  
intraday periodicity

❖ Event study

Abnormal returns  
and vol around  
jumps

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Abnormal liquidity  
around jumps

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Conclusions

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- Observed log-prices  $p$  are generated by a continuous time Brownian semi-martingale process with jumps:

$$dp(s) = \underbrace{\mu(s)ds}_{\text{drift}} + \underbrace{\sigma(s)dW(s)}_{\text{spot vol} \times \text{Wiener diff}} + \underbrace{\kappa(s)dq(s)}_{\text{jumps}}.$$

# Model

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- Observed log-prices  $p$  are generated by a continuous time Brownian semi-martingale process with jumps:

$$dp(s) = \underbrace{\mu(s)ds}_{\text{drift}} + \underbrace{\sigma(s)dW(s)}_{\text{spot vol} \times \text{Wiener diff}} + \underbrace{\kappa(s)dq(s)}_{\text{jumps}}.$$

- Discrete time model for high frequency equispaced returns:

$$r_{t,i} = \sigma_{t,i}u_{t,i} + j_{t,i} \quad , \quad u_{t,i} \sim N(0, 1).$$



# Intraday jump tests

Outline

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Data

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Event: price jump

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❖ Test

❖ spotVol and  
intraday periodicity

❖ Event study

Abnormal returns  
and vol around  
jumps

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Abnormal liquidity  
around jumps

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Conclusions

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- If  $r_{t,i}$  is not affected by jumps, then

$$\frac{r_{t,i}}{\sigma_{t,i}} \sim N(0, 1)$$

# Intraday jump tests

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- If  $r_{t,i}$  is not affected by jumps, then

$$\frac{r_{t,i}}{\sigma_{t,i}} \sim N(0, 1)$$

- Choice of threshold: Lee and Mykland (2008):  
extreme value theory: threshold such that  $\alpha$  false  
positives over the entire sample. Typically:  
 $\alpha = 10\%$ , for a sample of 100000 observations:

$$\text{Jump if } \frac{|r_{t,i}|}{\sigma_{t,i}} > 4.89.$$

# Examples of detected price jumps

Outline

Data

Event: price jump

❖ Test

❖ spotVol and  
intraday periodicity

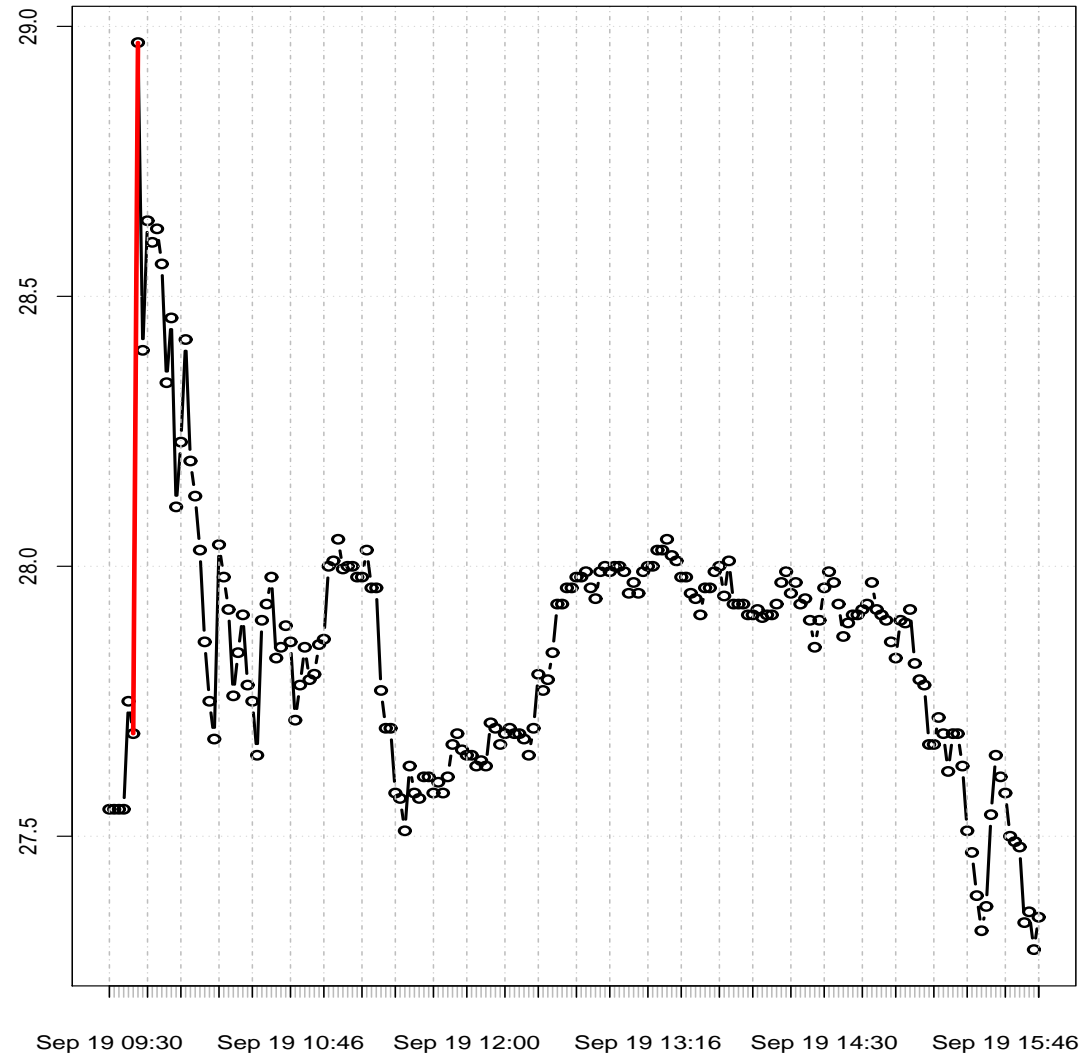
❖ Event study

Abnormal returns  
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jumps

Abnormal liquidity  
around jumps

Conclusions

HD : 2008-09-19 09:34:00 : 4.62 % (2-min agg)



# Examples of detected price jumps

Outline

Data

Event: price jump

❖ Test

❖ spotVol and  
intraday periodicity

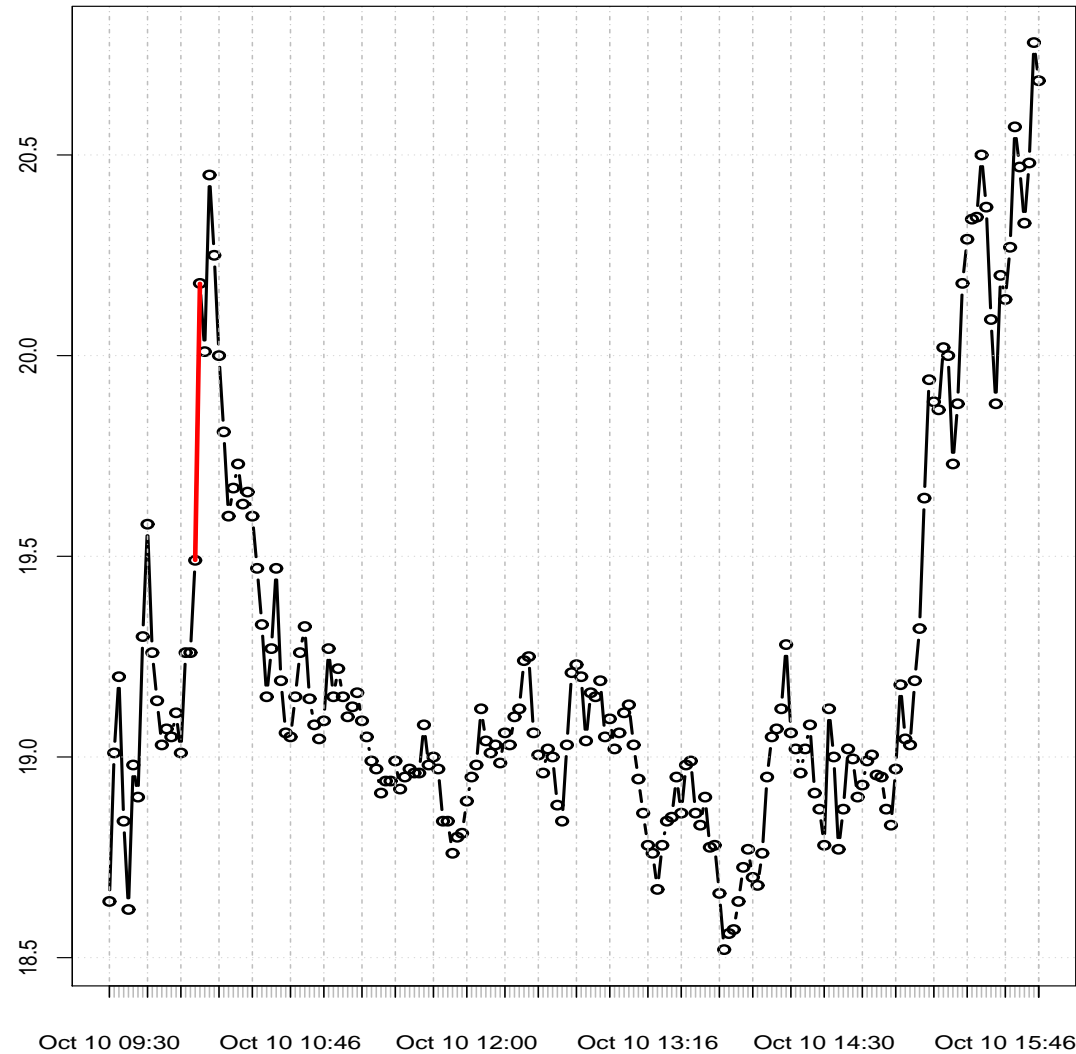
❖ Event study

Abnormal returns  
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Conclusions

GE : 2008-10-10 09:34:00 : 3.54 % (2-min agg)



# Examples of detected price jumps

Outline

Data

Event: price jump

❖ Test

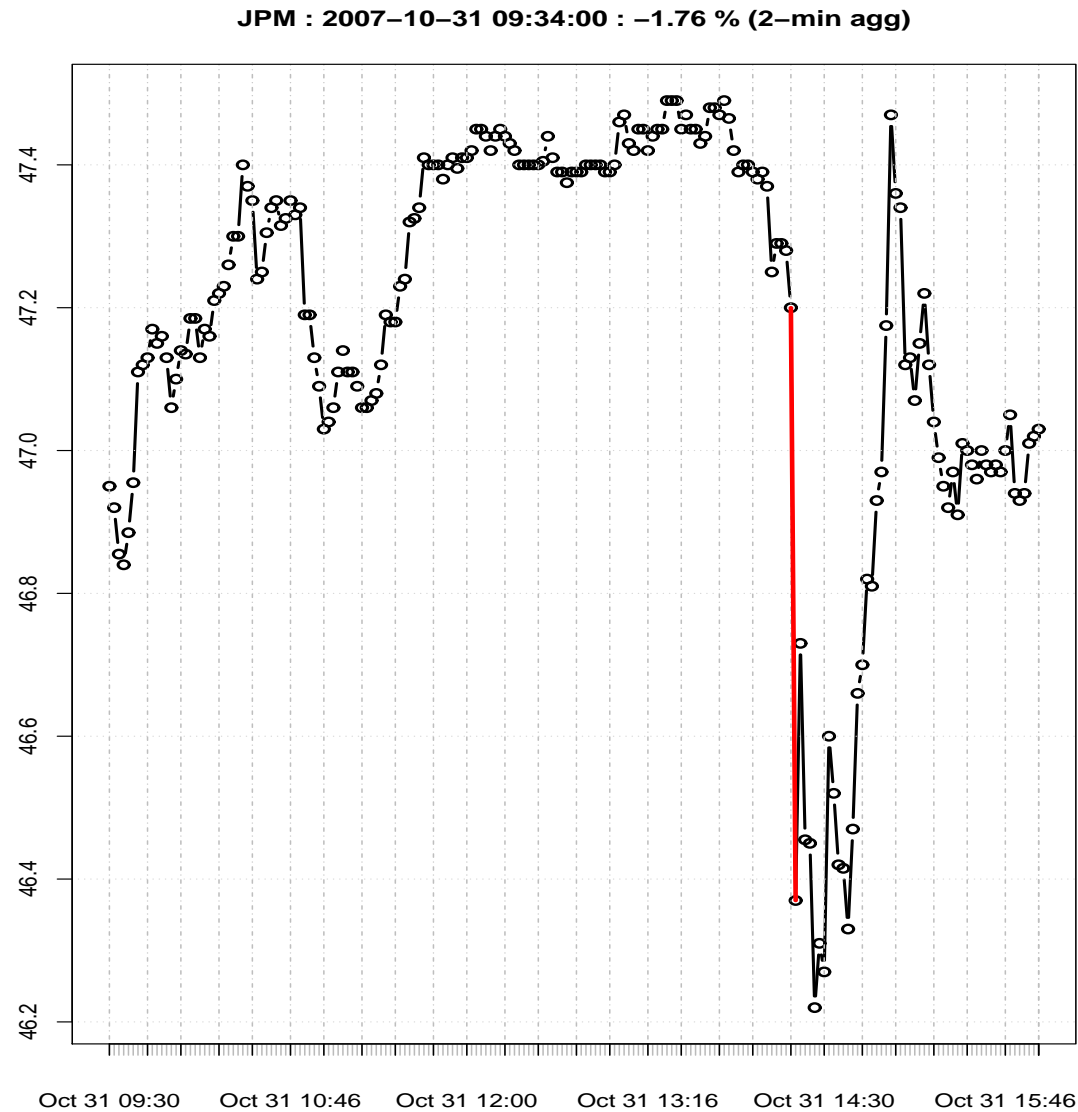
❖ spotVol and  
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❖ Event study

Abnormal returns  
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# Examples of detected price jumps

Outline

Data

Event: price jump

❖ Test

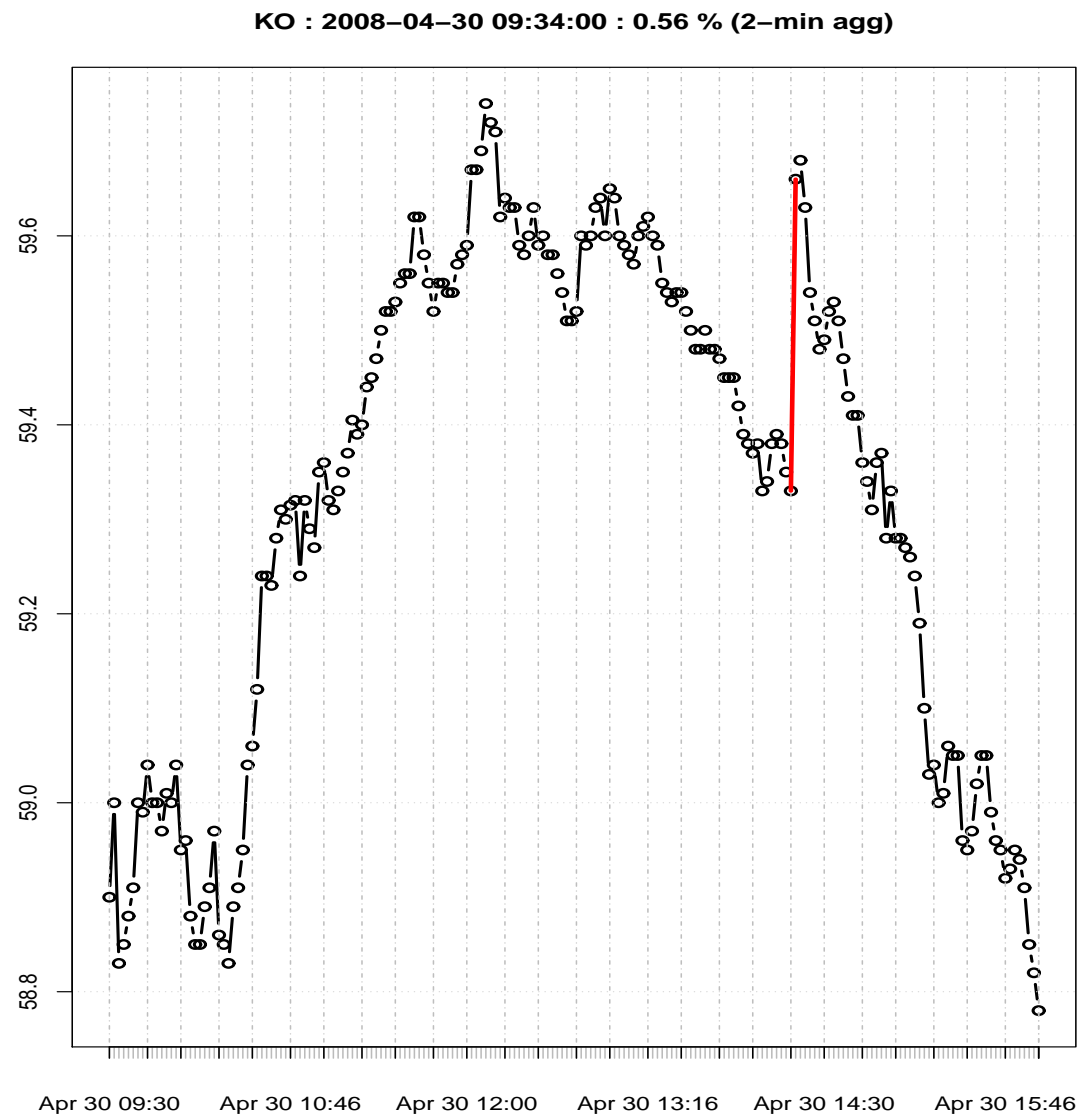
❖ spotVol and  
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# Estimation of $\sigma_{t,i} = \sigma_t f_i$

Outline

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❖ Event study

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Conclusions

- Function “spotVol” in RTAQ.
- Spot volatility has two main components:
  1.  $s_t$ : (stochastic) day-to-day variation in volatility
  2.  $f_i$ : (deterministic) intraday variation in volatility (due to recurring calendar-based events such as opening, lunch and closing of financial markets).
- Jump robust estimators.

# Estimated periodicity pattern in 2-min IBM data

[Outline](#)

[Data](#)

[Event: price jump](#)

❖ Test

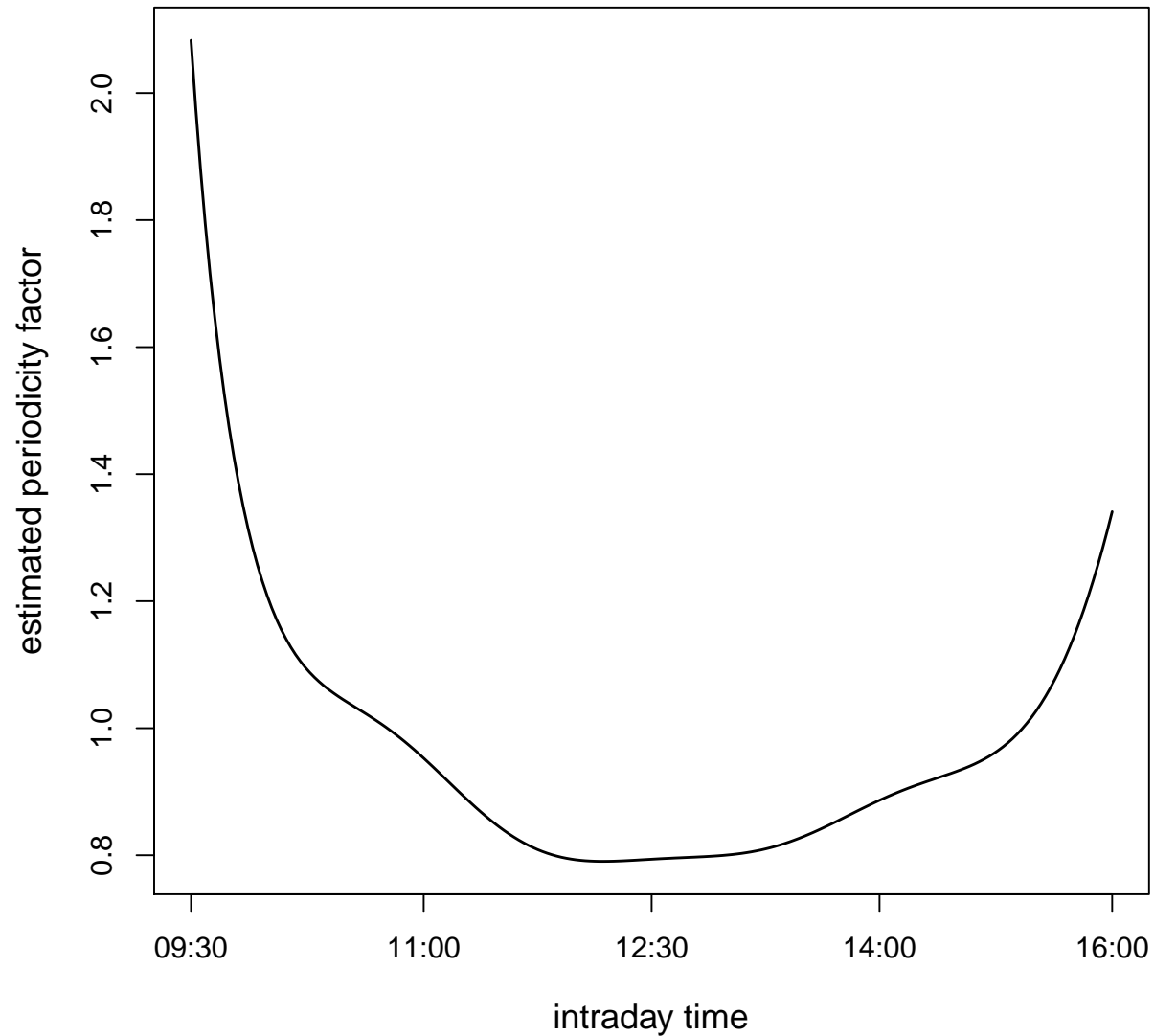
❖ spotVol and intraday periodicity

❖ Event study

Abnormal returns and vol around jumps

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[Conclusions](#)





# Jump detections per intraday period

Outline

Data

Event: price jump

❖ Test

❖ spotVol and  
intraday periodicity

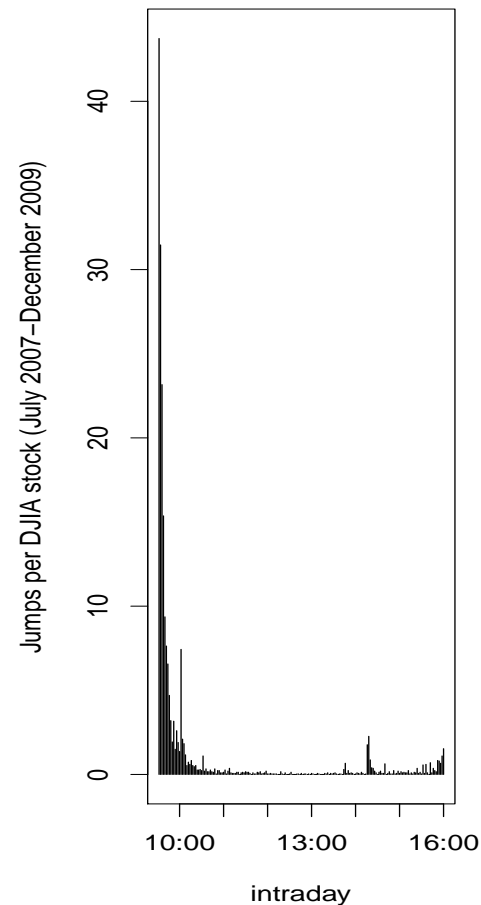
❖ Event study

Abnormal returns  
and vol around  
jumps

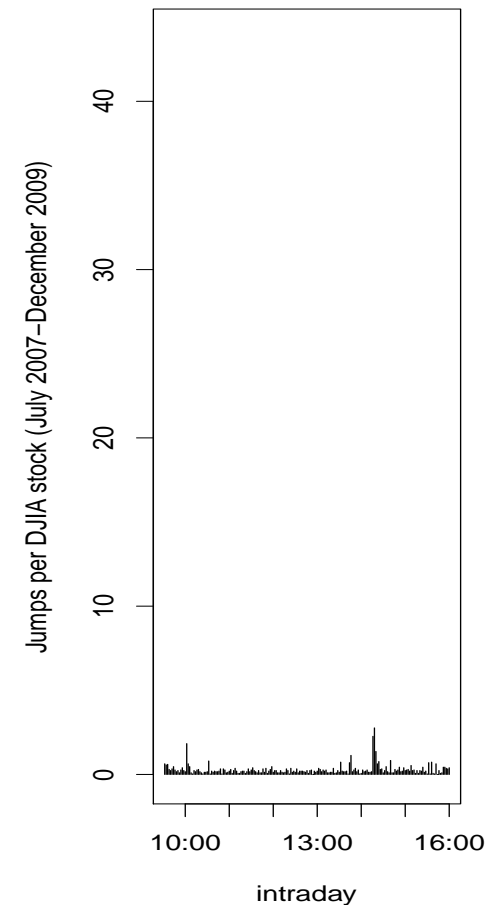
Abnormal liquidity  
around jumps

Conclusions

**No seasonal adjustment**



**With seasonal adjustment**



# Event study - event window

Outline

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Data

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Event: price jump

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❖ Test  
❖ spotVol and  
intraday periodicity

❖ Event study

Abnormal returns  
and vol around  
jumps

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Abnormal liquidity  
around jumps

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Conclusions

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- Event: a detected jump [1829 jumps];
- Window length:  $\pm 60$  minutes around the jump;
- Filters:
  1. Filter 1: complete event window [i.e. removing obs in 1 and last hour of the day] = 828
  2. Filter 2: no multiple jumps in one window = 527

# Abnormal std returns: $\frac{r_{t,i}}{\hat{f}_i \hat{\sigma}_t}$

Outline

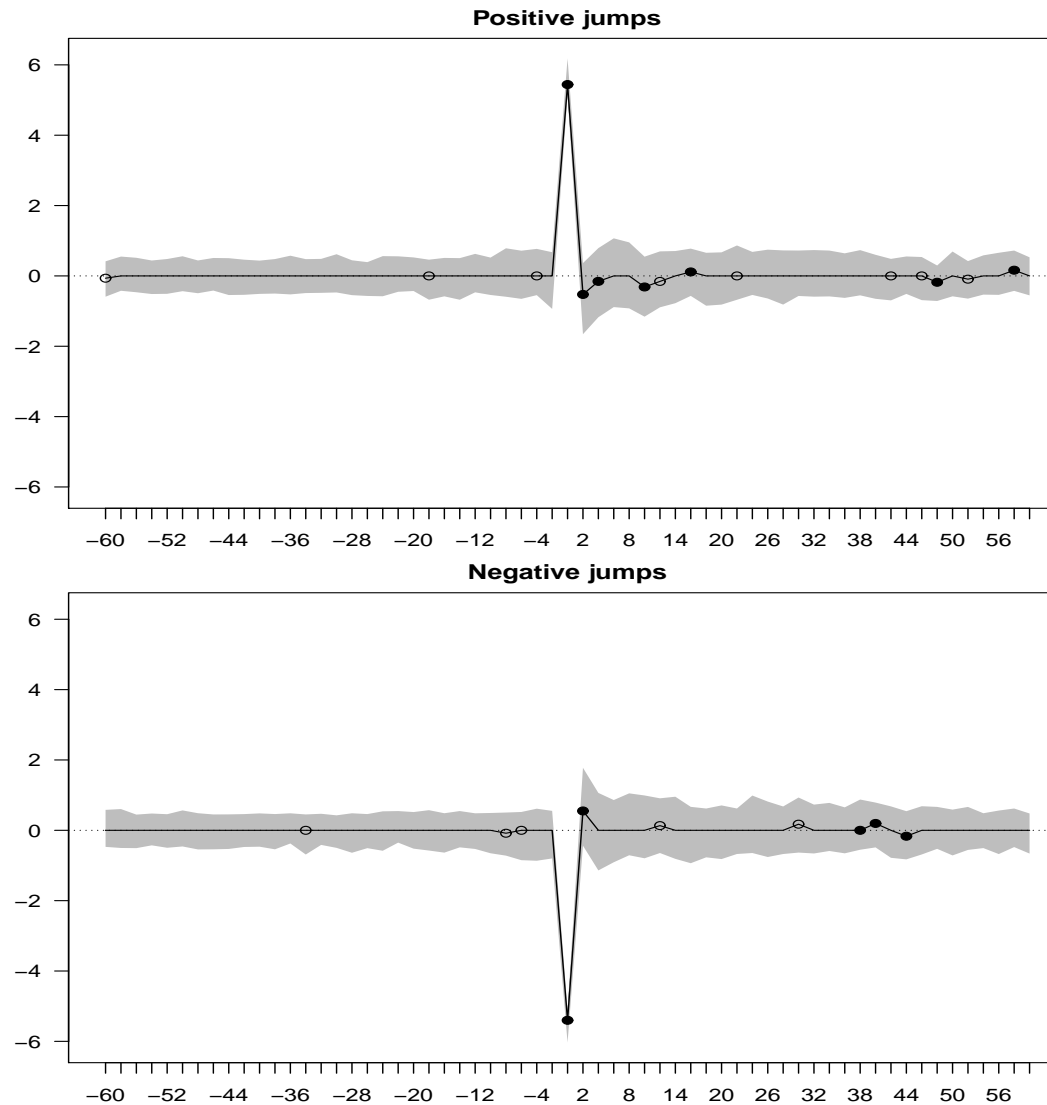
Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

Conclusions



Median standardized returns, 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Abnormal volatility: $\frac{|r_{t,i}|}{\hat{f}_i \hat{\sigma}_t} - 0.674$

Outline

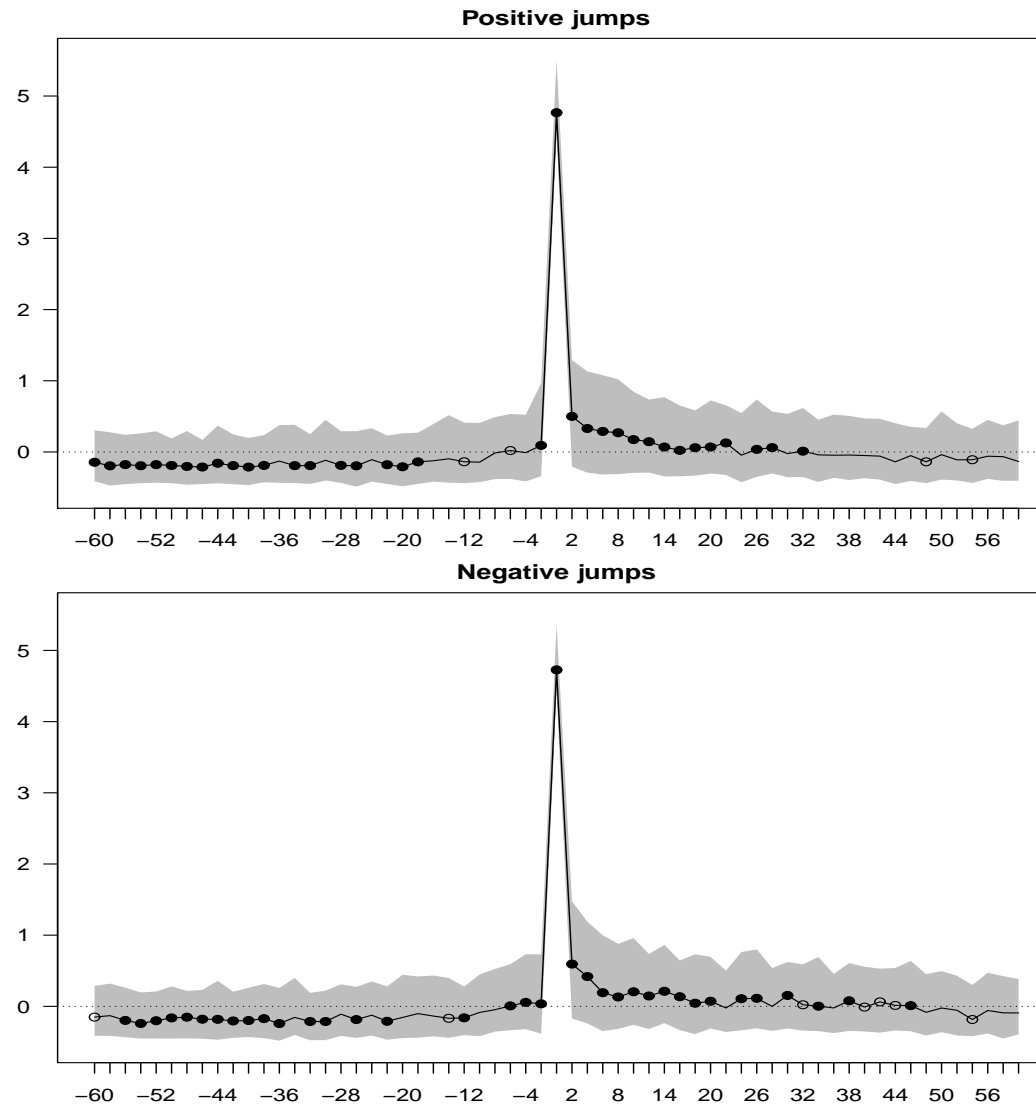
Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

Conclusions



Median centered absolute standardized returns, 2.5% and 97.5% quantiles. ● (○)

indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Measuring the abnormal liquidity

Outline

Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

❖ Abnormal liquidity

❖ Spreads

❖ Volume

❖ Depth

Conclusions

- Multiplicative model: spreads, volume, depth (no jump day)

$$L_{t,i} = L_t L_i \eta_{t,i}, \quad \text{with } \eta_{t,i} \text{ iid and } \text{median} \eta_{t,i} = 1.$$

For identification:  $\text{median} L_i \eta_{t,i} = 1.$

- Then on days without jumps

$$\hat{L}_t \equiv \text{median}_i L_{t,i} \rightarrow L_t$$

$$\hat{L}_i \equiv \text{median}_{t \in ND} \frac{L_{t,i}}{\hat{L}_t} \rightarrow L_i.$$

# Measuring the abnormal liquidity

Outline

Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

❖ Abnormal liquidity

❖ Spreads

❖ Volume

❖ Depth

Conclusions

- Abnormal liquidity:

$$\bar{L}_{t,i} = \frac{L_{t,i} - \hat{L}_i \hat{L}_t}{\hat{L}_i \hat{L}_t}.$$

Has median 0 if no impact of jumps on liquidity.

# Order and depth imbalance

Outline

Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

❖ Abnormal liquidity

❖ Spreads

❖ Volume

❖ Depth

Conclusions

- Order imbalance:

$$OI_i = \frac{\sum_{k=1}^{NT_i} D_{i,k} Size_{i,k}}{SumSize_i},$$

where  $D_{i,k}$  is 1 if the  $k$ th trade of interval  $i$  was a buy, -1 if it was a sell.

- Depth imbalance:

$$DI_i = \frac{(MeanAskDepth_i - MeanBidDepth_i)}{MeanDepth_i}$$

# Order and depth imbalance

Outline

Data

Event: price jump

Abnormal returns  
and vol around  
jumps

Abnormal liquidity  
around jumps

❖ Abnormal liquidity

❖ Spreads

❖ Volume

❖ Depth

Conclusions

- Additive model: order imbalance and depth imbalance (no jump day)

$$L_{t,i} = L_t + L_i + \varepsilon_{t,i}, \quad \varepsilon_{t,i} \text{ iid and } \text{median} \varepsilon_{t,i} = 1.$$

For identification:  $\text{median} L_i = 0$ .

$$\hat{L}_i = \text{median}_{t \in ND} (L_{t,i} - \text{median}_i L_{t,i})$$

- Abnormal liquidity:

$$\bar{L}_{t,i} = L_{t,i} - \text{median}_i L_{t,i} - \hat{L}_i$$



# Effective bid/ask spreads

## Outline

## Data

## Event: price jump

## Abnormal returns and vol around jumps

## Abnormal liquidity around jumps

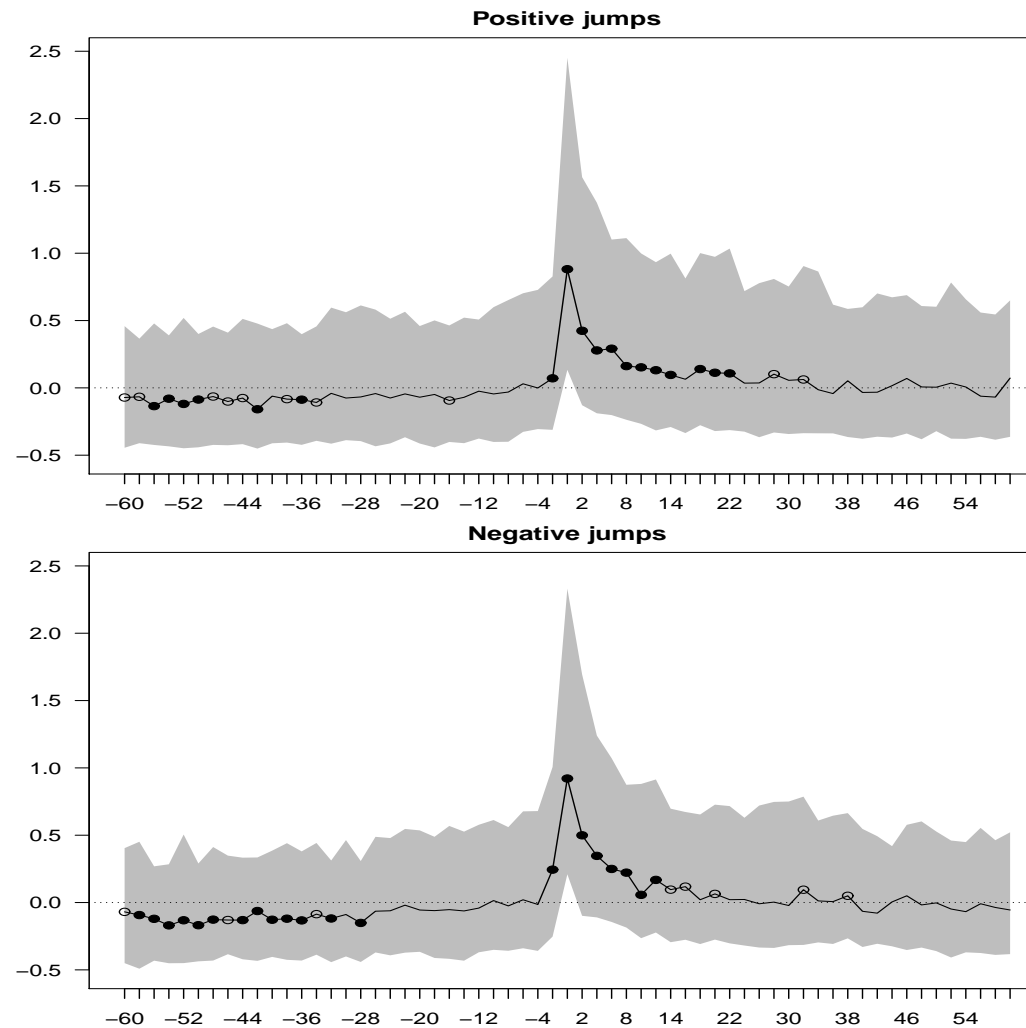
## ❖ Abnormal liquidity

## ❖ Spreads

## ❖ Volume

## ❖ Depth

## Conclusions



Median standardized liquidity measure, 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Quoted bid/ask spreads

## Outline

## Data

## Event: price jump

## Abnormal returns and vol around jumps

## Abnormal liquidity around jumps

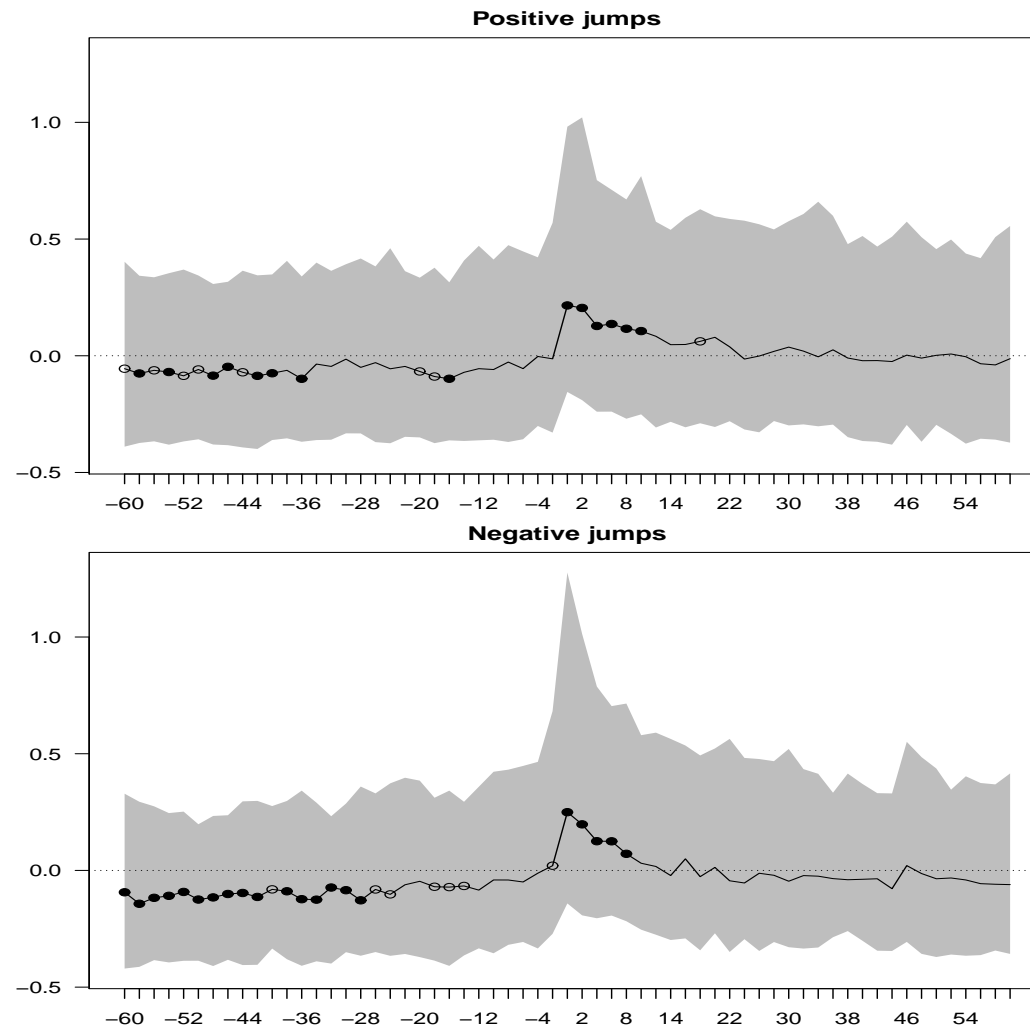
## ❖ Abnormal liquidity

## ❖ Spreads

## ❖ Volume

## ❖ Depth

## Conclusions



Median standardized liquidity measure, 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Trade volume

## Outline

## Data

## Event: price jump

## Abnormal returns and vol around jumps

## Abnormal liquidity around jumps

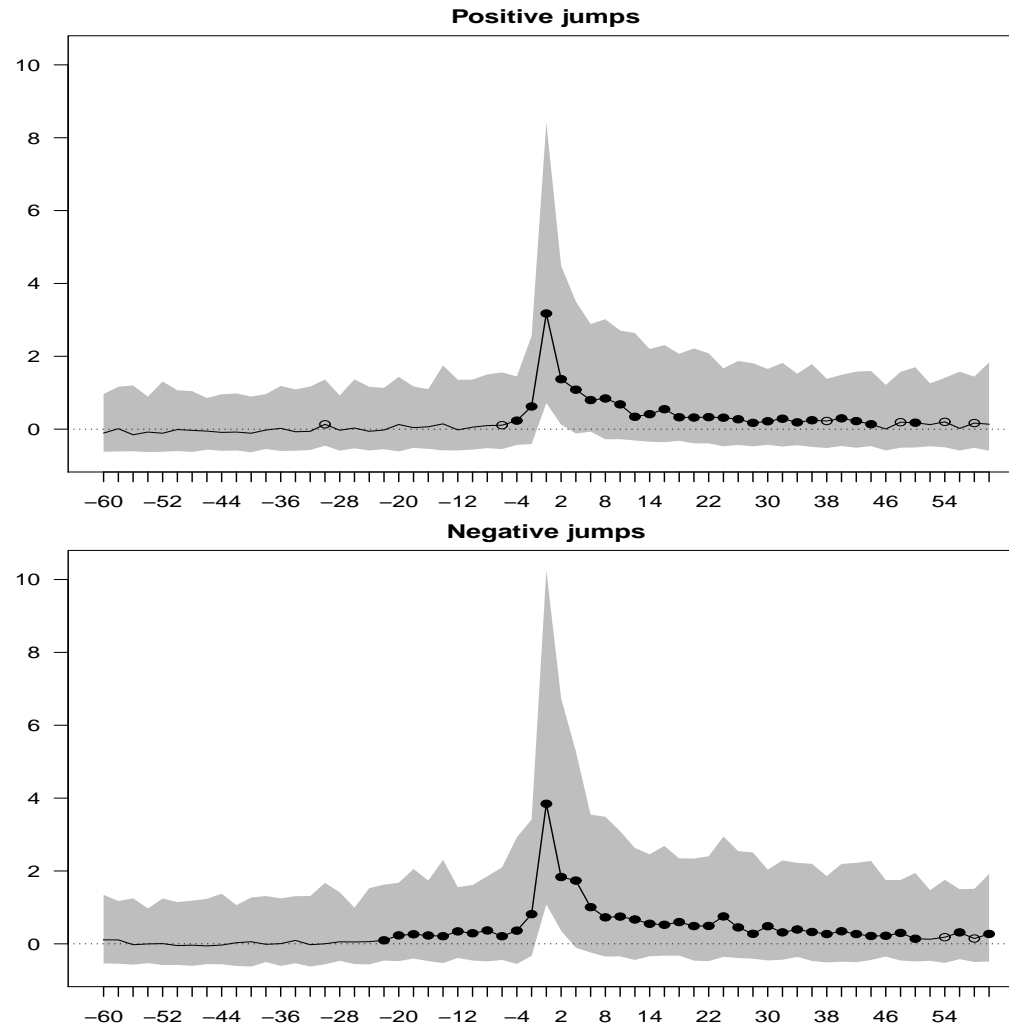
## ❖ Abnormal liquidity

## ❖ Spreads

## ❖ Volume

## ❖ Depth

## Conclusions



Full black line is the median standardized liquidity measure. The shaded region is the range between the 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Order imbalance

## Outline

## Data

## Event: price jump

## Abnormal returns and vol around jumps

## Abnormal liquidity around jumps

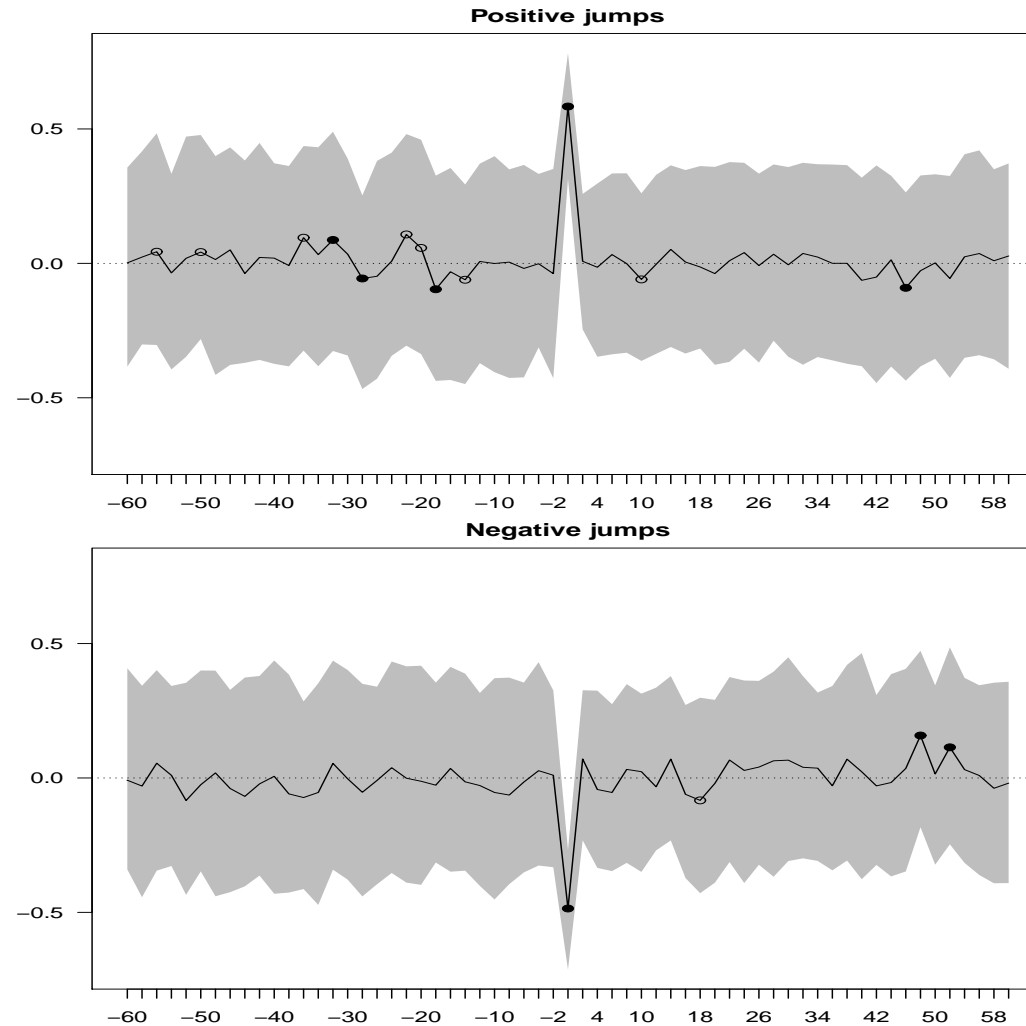
## ❖ Abnormal liquidity

## ❖ Spreads

## ❖ Volume

## ❖ Depth

## Conclusions



Full black line is the median standardized liquidity measure. The shaded region is the range between the 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Mean depth (at the best ask,bid)

## Outline

## Data

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## Abnormal liquidity around jumps

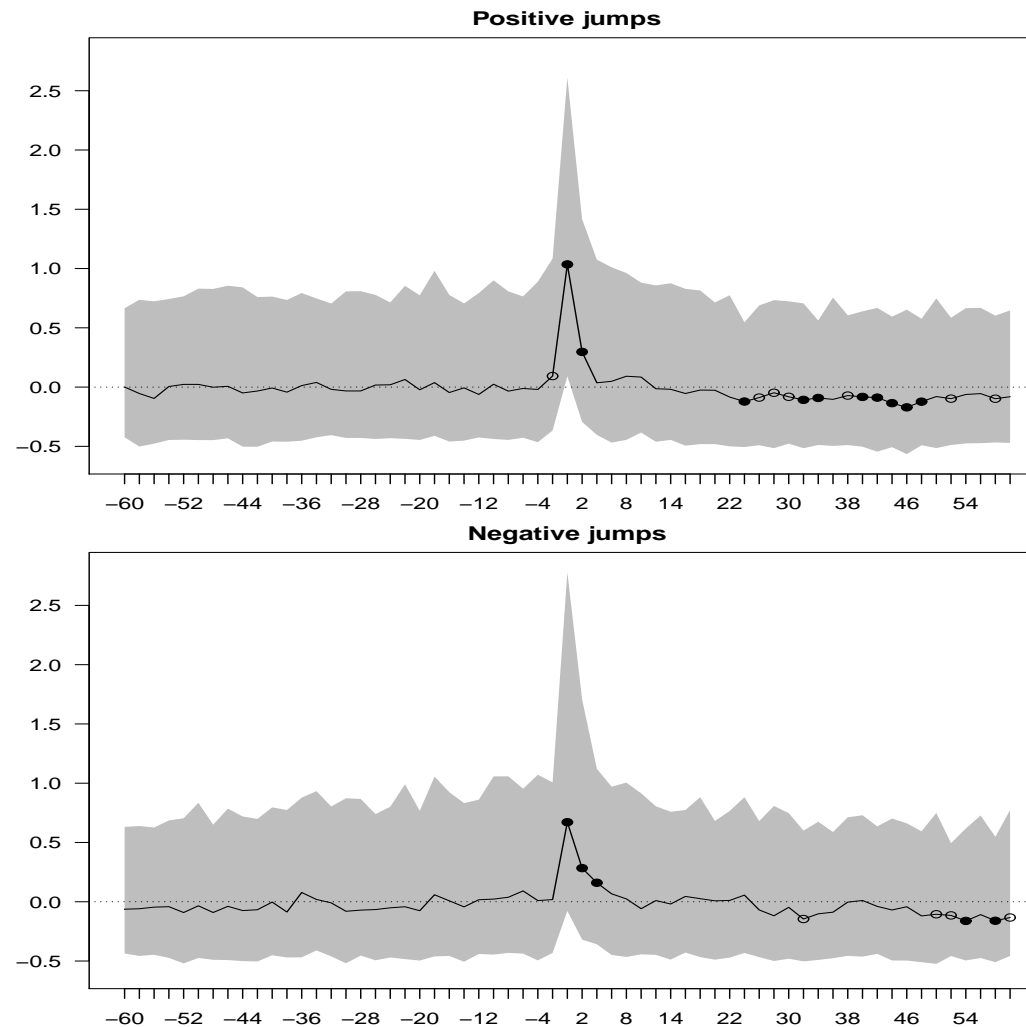
### ❖ Abnormal liquidity

### ❖ Spreads

### ❖ Volume

### ❖ Depth

## Conclusions



Full black line is the median standardized liquidity measure. The shaded region is the range between the 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Depth imbalance

## Outline

## Data

## Event: price jump

## Abnormal returns and vol around jumps

## Abnormal liquidity around jumps

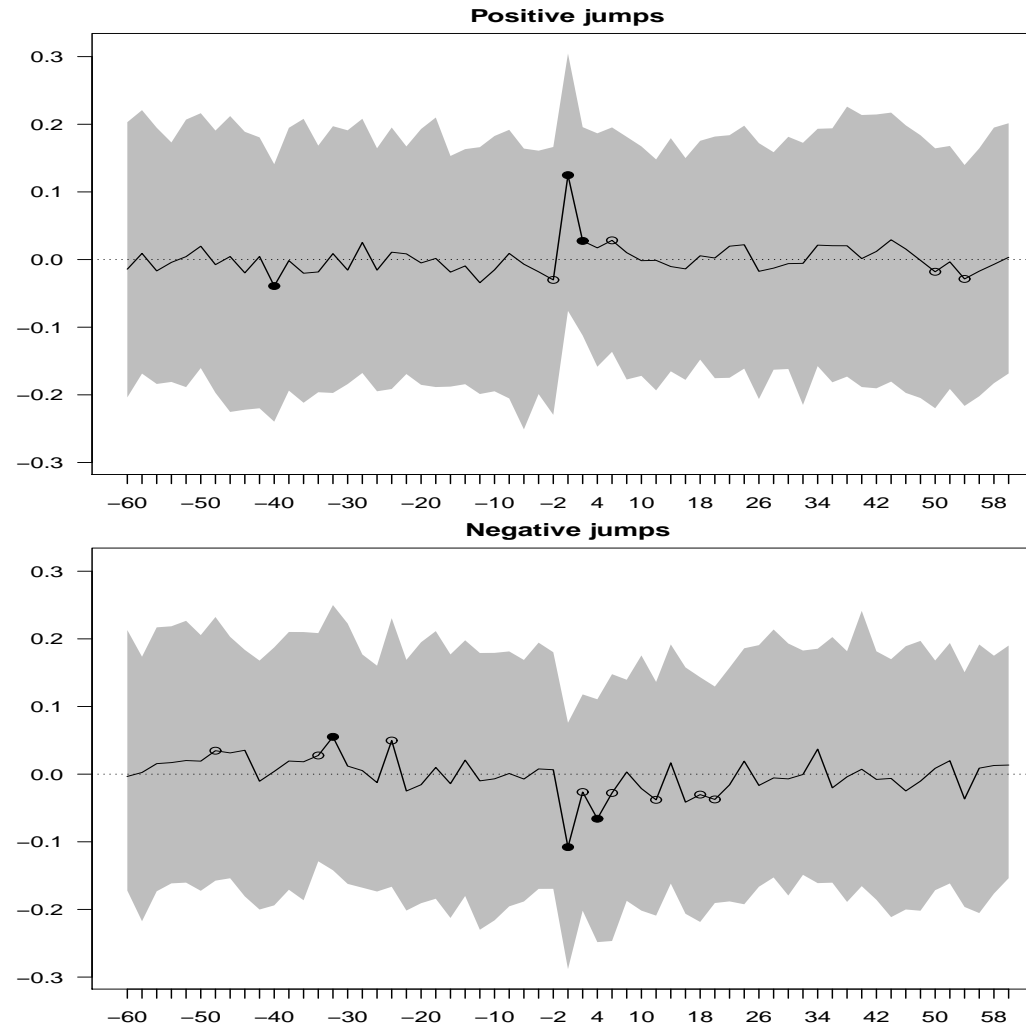
### ❖ Abnormal liquidity

### ❖ Spreads

### ❖ Volume

### ❖ Depth

## Conclusions



Full black line is the median standardized liquidity measure. The shaded region is the range between the 2.5% and 97.5% quantiles. ● (○) indicate rejection at the 99% (95%) confidence using the Mann-Whitney test.

# Conclusions

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❖ Conclusions

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After a jump:

- Some overreaction. Persistent increase in volatility
- Liquidity: ability to trade large quantities quickly at low cost with little price impact
  - ✓ **Increase in spreads** [30 min], some anticipation
  - ✓ Sharp and persistent **increase in volume** [ $> 60$  min], anticipation
  - ✓ **Increase in depth**: goes to the most aggressive side [6min], but dissipates quickly, anticipation

# References

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❖ Conclusions

❖ References

- Intraday jump detection [Boudt K., Croux C. and Laurent S. 2011. Robust estimation of intraweek periodicity in volatility and jump detection. *Journal of Empirical Finance* 18, 353-367.]
- Jumps and liquidity [Boudt K., Ghys H. and Petitjean M. The dynamics of liquidity around price jumps. Work in progress.]
- Software package RTAQ [Cornelissen J. and Boudt K. **RTAQ**: Tools for the analysis of trades and quotes in R. On CRAN.]

[www.econ.kuleuven.be/kris.boudt/public](http://www.econ.kuleuven.be/kris.boudt/public)