Liquidity Monitoring Insights

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Vienna Graduate School of Finance Perm Winter School 2019

Which market provides the best execution?

Definition of Liquidity?

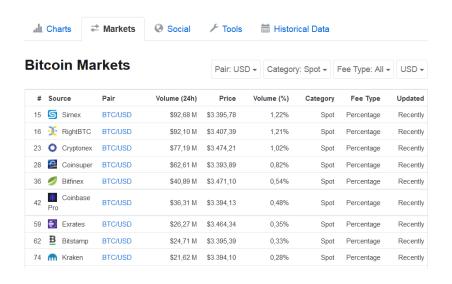
 "Degree to which the quick sale or purchase of an asset affects the asset's price"

Important for all market participants

- · Day traders face implementation shortfall when executing strategies
- Long-term investors have to sell assets when experiencing shocks

Market segmentation raises choice of trading venue

We typically look at CoinMarketCap for price information



CoinMarketCap only provides very limited information

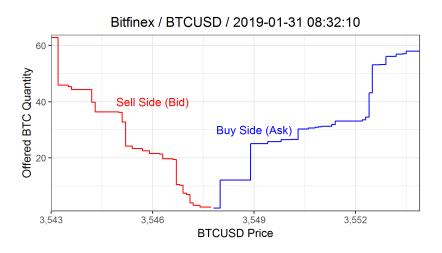
How much does my trade move the price?

- Traders & market makers offer price-quantity schedules (orderbook)
- I assume orderbooks show true liquidity

How much fees do I have to pay?

- Exchanges provide fee menu depending on trading quantity
- · I do not consider fees in my presentation

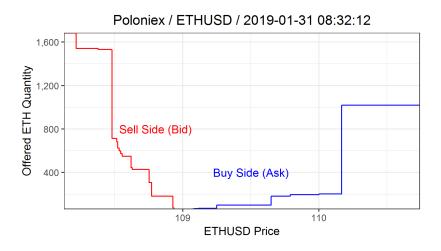
Example of a typical orderbook



Lykke orderbook at the same time



Another example of an orderbook



Again Lykke at the same time



Overview of my talk

1. Data collection

2. Descriptive statistics

3. Liquidity measurement

4. Outlook & potential questions

How do we collect data?

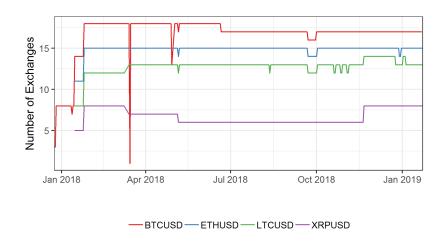
We run several servers & use our own code

- DigitalOcean (free credit: https://education.github.com/pack)
- CryptoX R Package (https://github.com/ckscheuch/CryptoX)

Every minute we simultaneously ping 17 exchanges

Every day we create a backup on Google drive

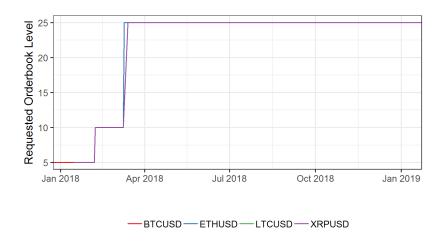
Number of exchanges in our sample



We currently track these exchanges

| | ВТС | ETH | XRP | LTC | Tether | Company Location |
|--------------|-----|-----|-----|-----|--------|-----------------------|
| Binance | 1 | / | / | / | 1 | Tokyo, Japan |
| Bitfinex | ✓ | ✓ | 1 | X | X | Central, Hong Kong |
| bitFlyer | 1 | X | X | X | X | Tokyo, Japan |
| Bitstamp | 1 | 1 | 1 | / | X | London, UK |
| Bittrex | 1 | 1 | 1 | / | ✓ | Las Vegas NV, USA |
| BTCC | 1 | X | X | X | X | Shanghai, China |
| CEX.IO | 1 | 1 | 1 | / | X | London, UK |
| Gate | 1 | 1 | 1 | / | X | Sparta NJ, USA |
| Gatecoin | 1 | 1 | X | / | ✓ | Wanchai, Hong Kong |
| Coinbase Pro | 1 | 1 | X | / | Х | San Francisco CA, USA |
| Gemini | 1 | / | X | / | X | New York NY, USA |
| HitBTC | 1 | / | X | / | ✓ | Hong Kong |
| Kraken | 1 | / | / | / | X | San Francisco CA, USA |
| Liqui | 1 | / | X | / | ✓ | Kiev, Ukraine |
| Lykke | / | / | / | / | X | Zug, Switzerland |
| Poloniex | / | ✓ | / | / | ✓ | Wilmington DE, USA |
| xBTCe | ✓ | ✓ | X | ✓ | X | Charlestown, Nevis |

Requested orderbook levels



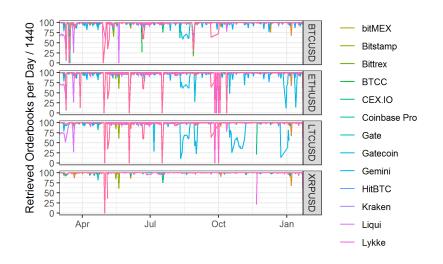
How does our data look like?

| $asset_pair$ | exchange | ts | ts_received | $ts_exchange$ | ${\tt requested_level}$ | side | level price | size |
|---------------|----------|-------------|-------------|----------------|--------------------------|------------------|---|----------|
| <chr $>$ | <chr $>$ | <dbl $>$ | <dbl></dbl> | <dbl></dbl> | <int $>$ | <chr> <</chr> | $\langle int \rangle \langle dbl \rangle$ | <dbl $>$ |
| 1 XRPUSD | cex | 1521504063. | 1521504064 | 1521504063 | 25 | ask | $1 \ 0.728$ | 100 |
| 2 XRPUSD | cex | 1521504063. | 1521504064 | 1521504063 | 25 | bid | $1 \ 0.723$ | 2000 |
| 3 XRPUSD | bitfinex | 1521504063. | 1521504064 | . 1521504061 | 25 | ask | 1 0.713 | 12000 |
| 4 XRPUSD | bitfinex | 1521504063. | 1521504064 | 1521504061 | 25 | bid | 1 0.711 | 26987. |
| 5 XRPUSD | bitstamp | 1521504063. | 1521504064 | 1521504059 | 25 | ask | $1 \ 0.714$ | 3594. |
| 6 XRPUSD | bitstamp | 1521504063. | 1521504064 | 1521504059 | 25 | bid | $1 \ 0.712$ | 992. |
| 7 XRPUSD | bitstamp | 1521504123. | 1521504137 | 1521504117 | 25 | ask | $1 \ 0.714$ | 13959. |

How often do we successfully retrieve data (% of all minutes)?

| | BTCUSD | ETHUSD | LTCUSD | XRPUSD |
|--------------|--------|--------|--------|--------|
| Binance | 97.39 | 95.58 | 96.62 | 97.20 |
| Bitfinex | 97.05 | 95.16 | 96.10 | 97.35 |
| bitFlyer | 97.26 | | | |
| bitMEX | 97.68 | | | |
| Bitstamp | 96.94 | 95.26 | 96.24 | 97.42 |
| Bittrex | 97.32 | 95.49 | 96.52 | 97.69 |
| BTCC | 81.98 | | | |
| CEX.IO | 97.05 | 95.03 | 96.52 | 97.18 |
| Gate | 97.62 | 95.63 | 96.70 | 97.86 |
| Gatecoin | 95.98 | 92.48 | 90.76 | |
| Coinbase Pro | 97.27 | 95.48 | 96.45 | |
| Gemini | 96.46 | 94.60 | | |
| HitBTC | 97.47 | 95.42 | 96.40 | |
| Kraken | 97.13 | 95.49 | 96.50 | 88.32 |
| Liqui | 93.71 | 91.50 | 93.04 | |
| Lykke | 97.32 | 95.29 | 97.92 | 97.09 |
| Poloniex | 96.93 | 94.72 | 95.93 | 97.78 |
| xBTCe | 96.35 | 95.29 | 96.32 | 92.67 |

Coverage ratio by exchange and asset pair



Percentage spread as a simple measure of liquidity

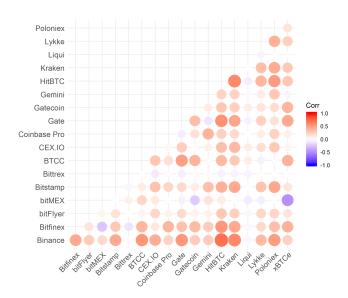
Definition of percentage spread

$$Spread = \frac{A - B}{A} \cdot 100$$

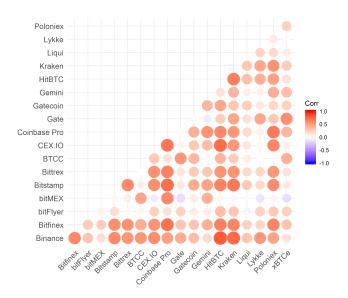
Median percentage spreads by asset pair & exchange

| | BTCUSD | ETHUSD | LTCUSD | XRPUSD |
|--------------|--------|--------|--------|--------|
| Binance | 0.03 | 0.05 | 0.12 | 0.08 |
| Bitfinex | 0.00 | 0.01 | 0.04 | 0.05 |
| bitFlyer | 0.17 | | | |
| bitMEX | 0.19 | | | |
| Bitstamp | 0.06 | 0.15 | 0.21 | 0.17 |
| Bittrex | 0.16 | 0.28 | 0.51 | 0.42 |
| BTCC | 1.37 | | | |
| CEX.IO | 0.15 | 0.29 | 1.16 | 0.39 |
| Gate | 0.33 | 0.33 | 1.21 | 1.16 |
| Gatecoin | 0.73 | 9.20 | 24.34 | |
| Coinbase Pro | 0.00 | 0.01 | 0.02 | |
| Gemini | 0.02 | 0.06 | | |
| HitBTC | 0.03 | 0.05 | 0.22 | |
| Kraken | 0.03 | 0.07 | 0.13 | 0.20 |
| Liqui | 0.46 | 0.50 | 0.64 | |
| Lykke | 0.31 | 0.49 | 0.60 | 0.46 |
| Poloniex | 0.09 | 0.18 | 0.30 | 0.25 |
| xBTCe | 0.05 | 0.46 | 0.93 | 17.97 |

Correlation matrix of spreads for BTCUSD



Correlation matrix of spreads for all asset pairs



Change in marginal prices for given trading quantities

Ask Impact
$$(q) := \left(\frac{A(q)}{A} - 1\right) \cdot 100,$$

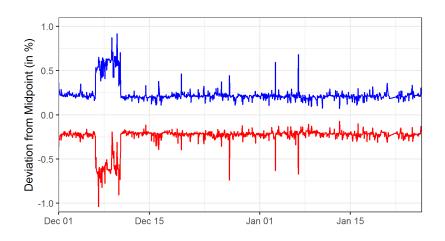
Bid Impact $(q) := \left(1 - \frac{B(q)}{B}\right) \cdot 100$

where A(q) (B(q)) is price of buying (selling) q USD of the asset

Alternative definition: q in terms of units of the asset

Caveat: hard to compare across assets!

Market impact measure of trading 1k USD on Lykke



Trading different quantities on Lykke

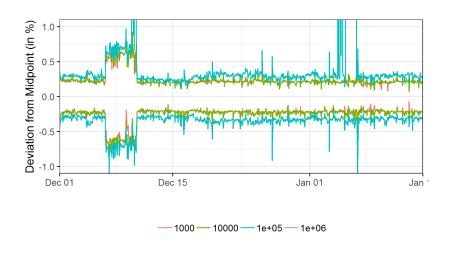
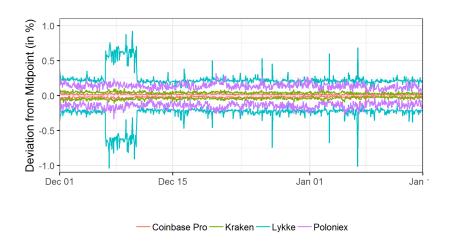
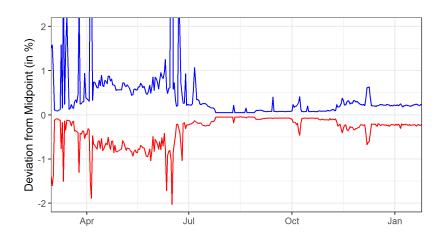


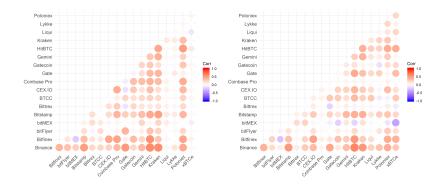
Illustration of trading 10k USD on different exchanges



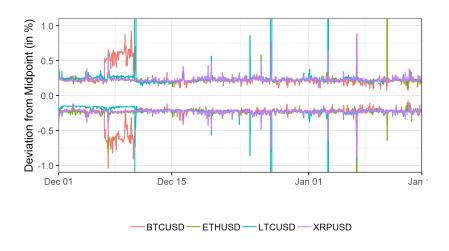
Average daily price impacts for 10k USD on Lykke



Correlation of trading 10k USD on different exchanges



Trading 10k USD in different assets on Lykke



Tool for live monitoring of price differences?

Can we exploit price differences across exchanges?

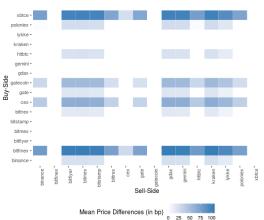
https://ckscheuch.shinyapps.io/arbitrage

App downloads orderbooks from all exchanges & computes potential arbitrage opportunities

Example of very simple app to look for arbitrage

Arbitrage Possibilities





Some suggestions for further exploration

Technological perspective

- · What is the most efficient way to retrieve & store orderbook data?
- · How often / fast can we ping exchanges?
- Which exchanges provide the stablest connection?

Applied finance perspective

- · How much do fees shift prices?
- How much can we trust orderbooks (fake liquidity)?
- How stable are liquidity relations over time?

Academic finance perspective

 How are cryptos / blockchains different from current financial system & what can we learn from them?

Thank you!

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