



PiterPy
Conference

2018

November 2-3



PASCAL VAN KOOTEN

Jibes Data Analytics

HIGH-FREQUENCY
CRYPTOCURRENCY TRADING
USING ASYNCIO



whoami

- BSc Sociology
- MSc Methods & Statistics
- Intel AI Innovator
- Loves:
 - Open-source
 - Innovation
 - Human & Machine Interaction
- Lead Data Scientist @ Jibes
 - 35 data scientists
 - 4 years and ~15 different companies
 - Worked on blockchain, social robots, NLP, ML / DL, computer vision
- Earlier at EuroPython with “When to use Machine Learning”



Open source



github.com/kootenpv

kootenpv.github.io

Pinned repositories

Customize your pinned repositories

≡ [whereami](#)

Uses WiFi signals 📶 and machine learning to predict where you are

● Python ★ 3k 🍴 197

≡ [neural_complete](#)

A neural network trained to help writing neural network code using autocomplete

● Python ★ 1k 🍴 107

≡ [yagmail](#)

yagmail makes sending emails very easy by doing all the magic for you

● Python ★ 1.2k 🍴 109

≡ [TwitterQA](#)

Forked from Conchylicultor/DeepQA

Deep learning based Twitter Imposter Chatbot

● Python ★ 148 🍴 34

≡ [xtoy](#)

Automated Machine Learning: go from 'X' to 'y' without effort.

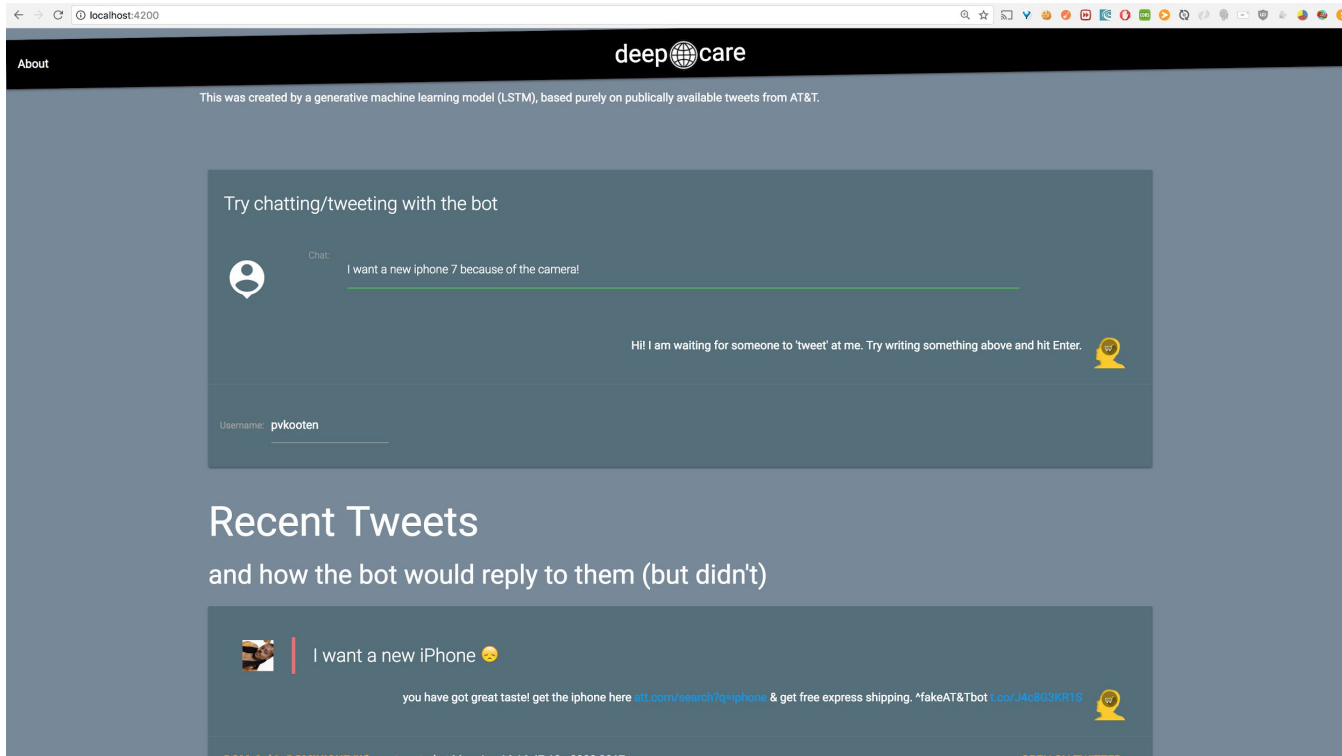
● Python ★ 30 🍴 5

≡ [sky](#)

☀️ next generation web crawling using machine intelligence

● Python ★ 169 🍴 23

@ O'Reilly & Intel AI Conference



The screenshot shows a web browser window with the address bar at localhost:4200. The page header features the 'deep care' logo. Below the header, a disclaimer states: 'This was created by a generative machine learning model (LSTM), based purely on publically available tweets from AT&T.'

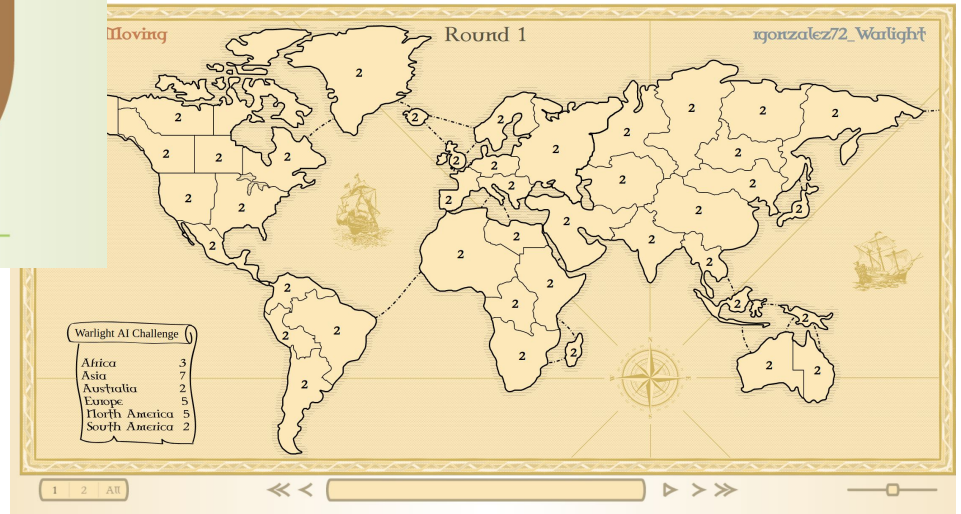
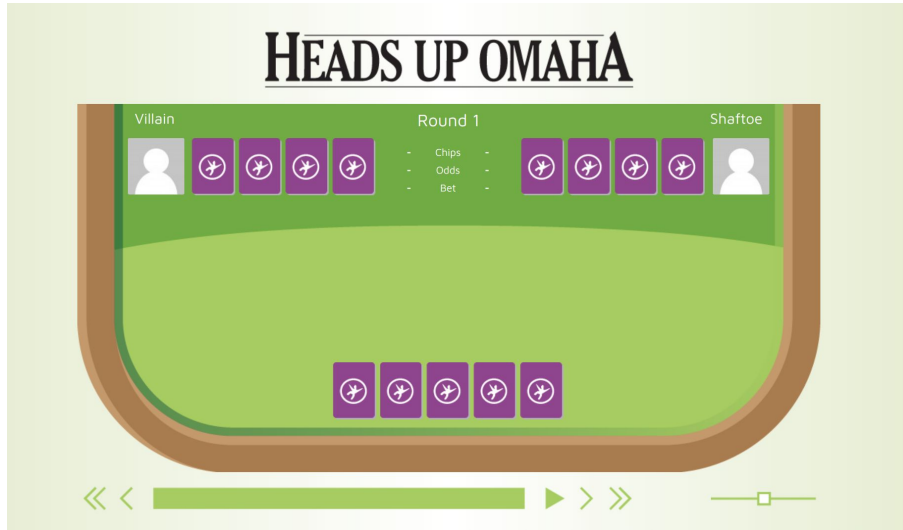
The main content area is titled 'Try chatting/tweeting with the bot'. It contains a chat interface with a user icon and a text input field. The user has typed: 'I want a new iphone 7 because of the camera!'. Below the input field, a message from the bot reads: 'Hi! I am waiting for someone to 'tweet' at me. Try writing something above and hit Enter.' A yellow bot icon is visible next to the bot's message.

Below the chat interface, the text 'Recent Tweets and how the bot would reply to them (but didn't)' is displayed. A tweet is shown with a user icon and the text: 'I want a new iPhone 🙄'. Below the tweet, the bot's reply is visible: 'you have got great taste! get the iphone here bit.ly/search?q=iphone & get free express shipping. *fakeAT&Tbot | [co/J4c8G3KR1S](https://t.co/J4c8G3KR1S)'. A yellow bot icon is visible next to the bot's reply.

Today

- My Background for this talk
- Explaining Cryptocurrency & Trading
- High-Frequency Crypto Trading
- Explaining Asyncio
- Live Coding

Background for this talk



Who has been **trading** cryptocurrency?

~~Trading~~ because:

- ✗ need "big/beefy" machines...
- ✗ "Short" cable to the exchange
- ✗ commission for trading is very high
- ✗ data is expensive

Crypto...currency?

- E-currency
- Bitcoin
- Unregulated field:
 - Obtained a few Ethers
 - And lost them...



76

























[r/ethereum](#) · Posted by [u/pvkooten](#) 8 months ago



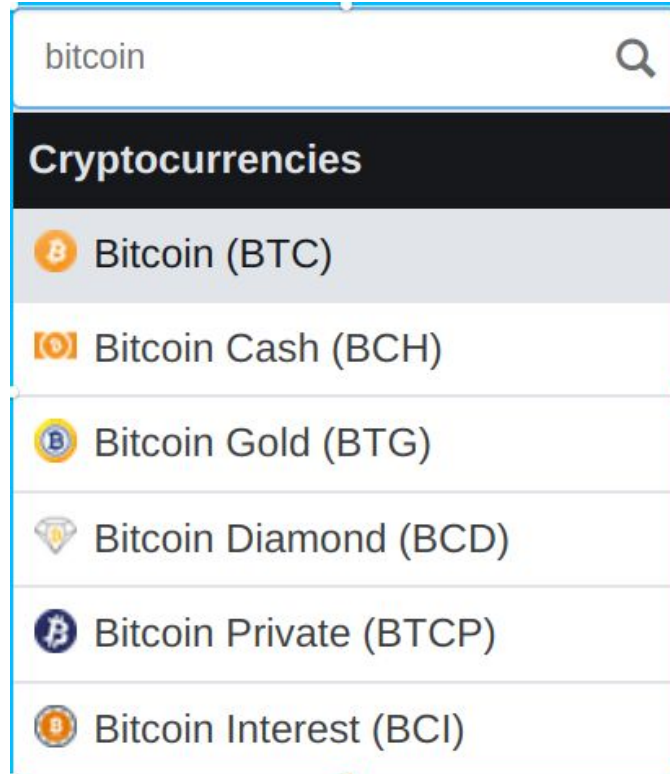
I lost 24.04 ether 2 years ago to the 0x0 address while trying to do the split.

Explaining Cryptocurrency & Trading

18	 NEM	\$878,092,519	\$0.097566	\$11,221,834	8,999,999,999 XEM *	-3.01%		...
19	 VeChain	\$744,396,400	\$0.013423	\$17,237,049	55,454,734,800 VET *	-3.12%		...
20	 Zcash	\$670,649,221	\$137.74	\$141,291,164	4,869,106 ZEC	5.87%		...
21	 Dogecoin	\$665,039,001	\$0.005719	\$18,175,581	116,280,623,285 DOGE	-1.90%		...
22	 OmiseGO	\$501,774,785	\$3.58	\$40,000,849	140,245,398 OMG *	-0.58%		...
23	 Bytecoin	\$428,486,837	\$0.002328	\$7,085,107	184,065,170,335 BCN	15.68%		...
24	 0x	\$385,652,204	\$0.714220	\$21,123,347	539,962,574 ZRX *	13.66%		...
25	 Bitcoin Gold	\$385,239,307	\$22.33	\$5,196,658	17,251,824 BTG	-0.83%		...
26	 Lisk	\$379,221,091	\$3.43	\$4,381,856	110,466,960 LSK *	-2.09%		...
27	 Ontology	\$361,770,582	\$1.96	\$38,109,139	184,206,203 ONT *	-4.63%		...
28	 Qtum	\$349,383,605	\$3.93	\$129,293,563	88,913,536 QTUM *	-3.00%		...

Explaining Cryptocurrency & Trading

Fork me on GitHub



3 Ways to trade

- **Fundamental**
- Technical
- Arbitrage
- Intrinsic value
- Uses financials, macro
- Usually longer term

3 Ways to trade

- Fundamental
- **Technical**
- Arbitrage
- Historic price
- Time series / patterns
- Usually short term



3 Ways to trade

- Fundamental
- Technical
- **Arbitrage**

Exchange A: 1 BTC for \$6000

Exchange B: 1 BTC for \$5800

∃ 4 Ways to trade

- Fundamental
- Technical
- Arbitrage
- **Event driven**

Event driven

IOTA Charts

Linear S

Zoom 1d 7d 1m 3m 1y YTD ALL

From Jun 13, 2017 To Sep 30, 2018



Event driven

28th of November 2017

MICROSOFT TECH

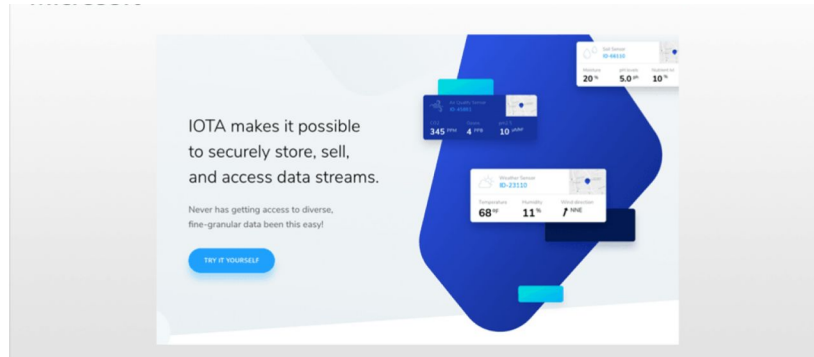
Microsoft and IOTA launch first cryptocurrency

Posted by u/7hr0w7h475h17 10 months ago

↑
524
↓

Microsoft and IOTA launch first cryptocurrency market for the Internet of Things

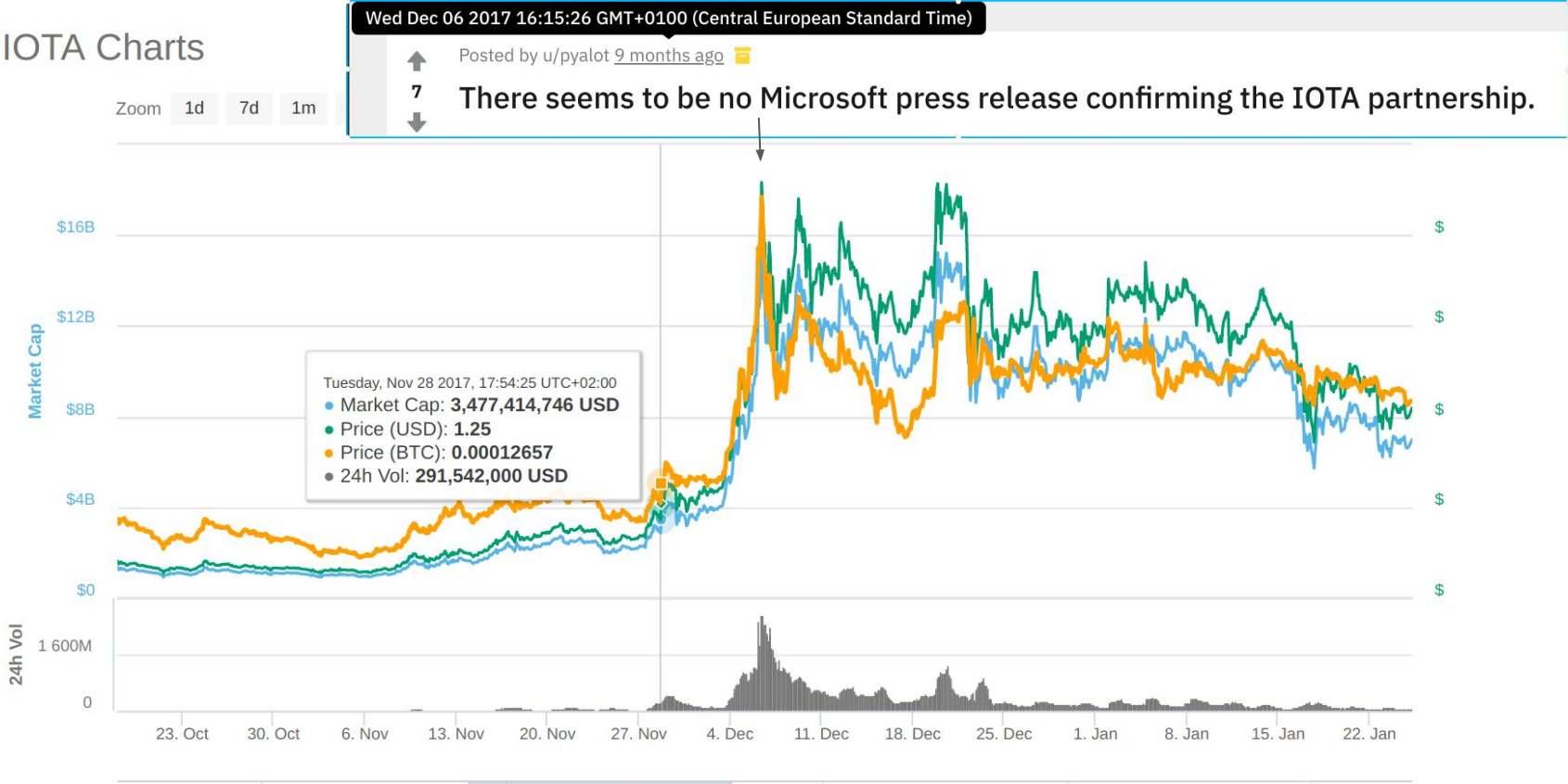
thenextweb.com/hardfo...



Bitcoin hard fork nightmare becomes reality after testnet splits

Event driven

IOTA Charts



Event driven

Oct 23, 21:33:38	0.000000071	855000/855000	0.000000071	0.060705000	Filled
Oct 23, 21:31:54	0.000000079	0/855000	0	0	Cancelled
Oct 23, 21:31:47	0.000000070	855000/855000	0.000000070	0.059850000	Filled
Oct 23, 21:31:34	0.000000095	0/855000	0	0	Cancelled
Oct 23, 21:31:05	0.000000068	855000/855000	0.000000068	0.058140000	Filled
Oct 23, 21:30:50	0.000000079	0/855000	0	0	Cancelled
Oct 23, 21:30:38	0.000000067	3017000/3017000	0.000000067	0.202139000	Filled
Oct 23, 21:29:49	0.000000095	0/855000	0	0	Cancelled
Oct 23, 21:27:05	0.000000058	855000/5384000	0.000000056	0.047880000	Expired
Oct 23, 21:26:49	0.000000049	4727000/10987000	0.000000048	0.226896000	Expired

Simulation

Live Coding!

Further Requirements

- Interactivity
- Only trade on *real* signals
- Ability to quickly react

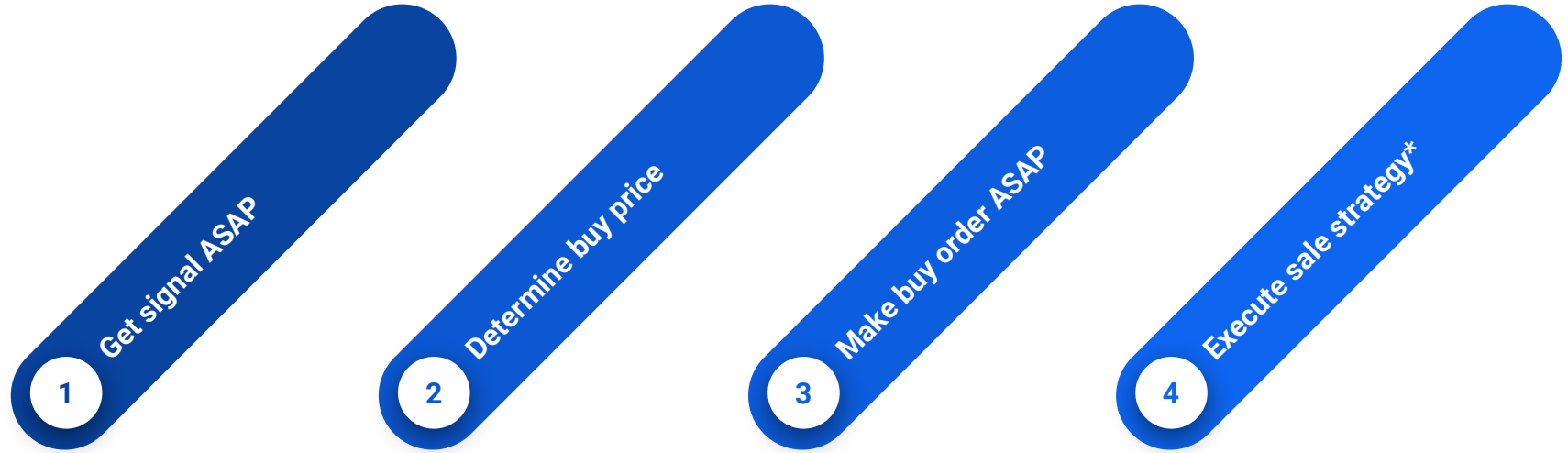
What was next?

- Create wrapper on Exchange API to send myself a direct link to buy
 - Buy: /buy?symbol=IOTBTC -> **go all-in**
 - Sell: /sell?symbol=IOTBTC -> convert IOT back to BTC
 - Slackbot

- Would always be too slow - bots were trading almost immediately

Who ever needed **high-frequency** transaction speed?

High-Frequency Crypto Trading



High-Frequency Crypto Trading

```
order = {  
    "method": "newOrder",  
    "params": {  
        "type": "limit",  
        "side": "buy",  
        "symbol": "BTCUSD",  
        "quantity": float_round(USD_AMOUNT / TICKER_PRICE),  
        "price": TICKER_PRICE,  
        "timeInForce": "IOC",  
        "clientOrderId": "uniqueperday1",  
    },  
}
```

High-Frequency Crypto Trading

- Minimize delay between real-time-event and buy order
- “Stories” in trading
- Spoiler: in the end I got it down to **~0.7ms**

High-Frequency Crypto Trading

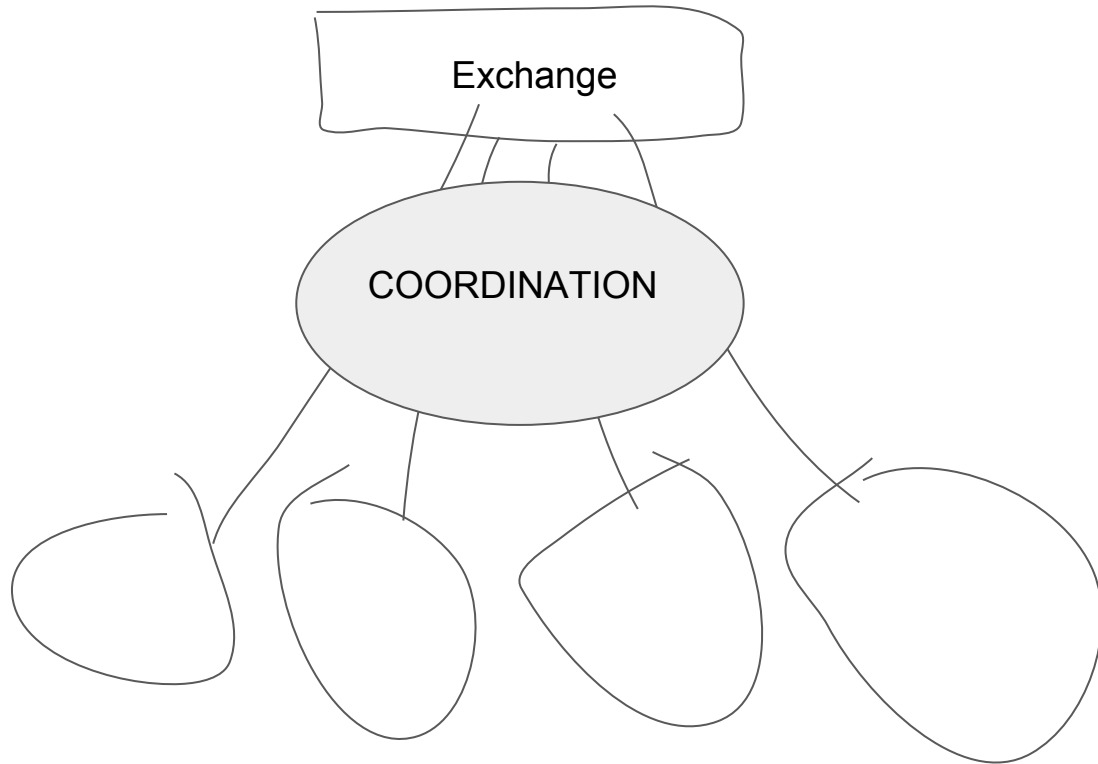
- Phone / Email / Slack notification
- Sentry (“error” tracking)
- Quart (async flask)
- healthcheck.py
 - Recent enough URLs visited
 - Process alive

High-Frequency Crypto Trading

Cloud comparison in June, 2018 (\$5 dollar offering):

	Internet speed	Geographical Availability	CPU
GCP (Google)	Great	Great	VCPU
DigitalOcean	Average	Limited	VCPU
AWS EC2 (Amazon)	Average	Great	VCPU
Dedicated Machine*	Slow	Very limited	Good
Linode	Great	Sufficient	<3

Technical Architecture v10.1.2.1 Final.docx.py



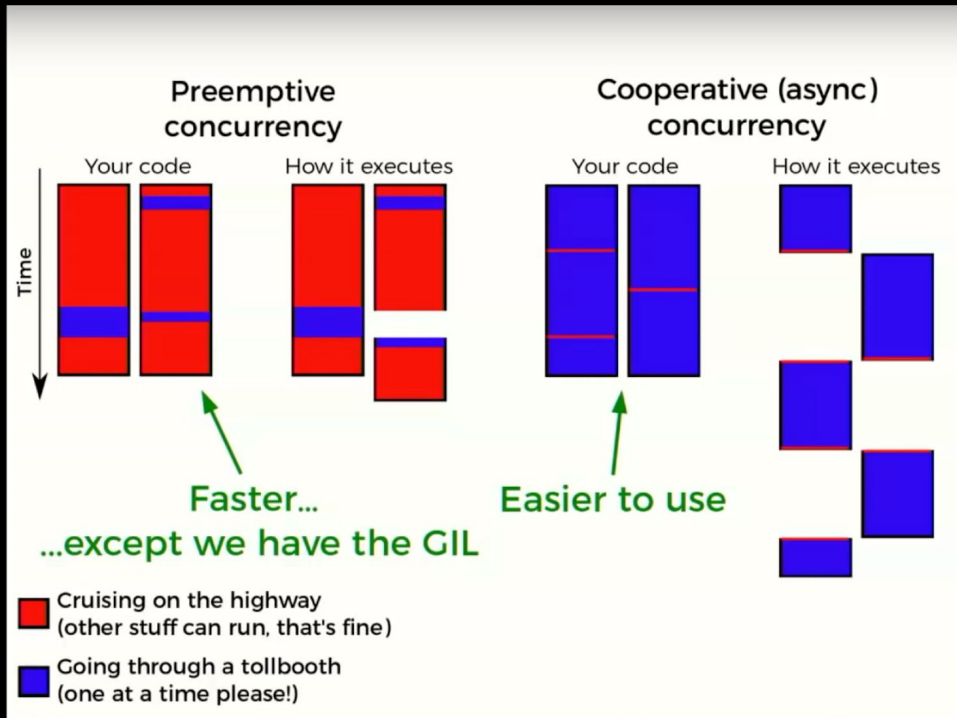
Who has **used asyncio**?

Asyncio

- Challenge: doing multiple things at the same time:
 - CPU (calculations, natural language classification) -> use multiple processes
 - IO (http connections, sockets, database) -> use multiple threads / asyncio
- I did not like the Thread interface at all :-)
- Bonus: no need for locks!

Asyncio

Nathaniel J. Smith - Trio: Async concurrency for mere mortals - PyCon 2018

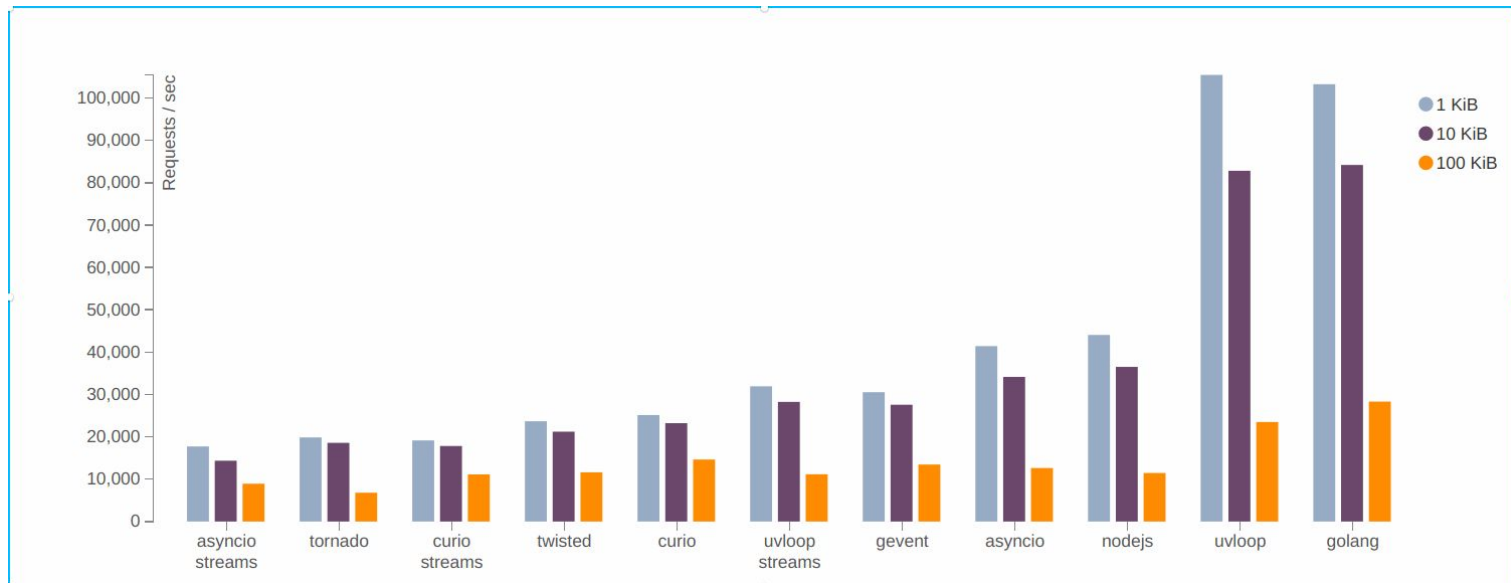


Asyncio over time

- 3.3
- By 3.6 it was an ok experience
- 3.7: distinction became clear between user and library creators

Asncio

uvloop makes asyncio 2-4x faster



Asyncio

- Async code can only be called by other async functions...
- ... or by ``asyncio.run``

Live Coding!

Key Takeaways

- **Disclaimer:** no trading advice! You will lose money.
- It's not all fun - on one trade I lost 20%
 - Still, coding with this kind of pressure taught me some nice tricks
- Benefits of introspection, centralized error logging, round-robin deploy
- Always do backtesting & favor a simpler model
- Use ML/analysis upfront -> deploy rule based
- Python's async implementation is much better than you'd think!
- Once you go async, you have to fully go async

-> And now is a better time than ever to get started!