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# Remove uncertainty about unknown events 

## Politics

Sports
Weather

## Market Share

Product
Completion

## Scientific

Discoveries

## Sales <br> Awards

## Prediction Markets

Polls vs predictions

## per cent

| Likelihood of victory |  |
| :---: | :---: |
| - IEM Obama $\quad \cos 538$ Obama |  |
| - IEM Romney $\quad \cos 538$ Romney |  |

90




## Prediction Markets

Obama
Romney
Johnson
Winner: \$10
Losers: \$0
Other

## Prediction Markets

Obama \$6.10 61\% Romney<br>\$3.80 38\%<br>Winner: \$10<br>Johnson<br>Other<br>\(\begin{array}{ll}\$ 0.09 \& 0.9 \%<br>\$ 0.01 \& 0.1 \%\end{array}\)<br>Losers: \$0

## Prediction Markets

Obama \$6.10
Romney \$3.80
Johnson \$0.09
Other \$0.01

## Prediction Markets

$\begin{array}{ll}\text { Obama } & \$ 6.10 \\ \text { Romney } & \$ 3.80 \\ \text { Johnson } & \$ 0.09 \\ \text { Other } & \$ 0.01\end{array}$

Obama - $\$ 6.10$

## Prediction Markets

$\begin{array}{lll}\text { Obama } & \$ 6.10 & \$ 7.30 \\ \text { Romney } & \$ 3.80 & \$ 2.65 \\ \text { Johnson } & \$ 0.09 & \$ 0.04 \\ \text { Other } & \$ 0.01 & \$ 0.01\end{array}$

Obama -\$6.10

## Prediction Markets

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Obana $-\$ 6.10+\$ 7.30$

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$$
\text { Doana }-\$ 6.10+\$ 7.30=\$ 1.20
$$

## Prediction Markets

| Obama | $\$ 6.10$ | $\$ 7.30$ |
| :--- | :--- | :--- |
| Romney | $\$ 3.80$ | $\$ 2.65$ |
| Johnson | $\$ 0.09$ | $\$ 0.04$ |
| Other | $\$ 0.01$ | $\$ 0.01$ |

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Romney Johnson Other
$-\$ 2.70=\$ 2.65+\$ 0.04+\$ 0.01$

## Prediction Markets

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Romne
$-\$ 2.70$

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## Romney

Johnson
Other
$-\$ 2.70+\$ 3.60=\$ 0.90$

## Prediction Markets

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Romne
$-\$ 2.70$

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## Romney

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## Romney

Johnson
Other
Obama
$-\$ 2.70-\$ 6.40+\$ 10.00=\$ 0.90$

## Decentralization

## Decentralization

Centralized Market:

- Money escrowed
- Shares escrowed
- Proprietary markets
- Match orders
- Vendor lock-in
- Adjudicate outcome
- Go offline
- Potentially transparent
- High fees

Decentralized Market:

- Hold your own money
- Hold your own shares
- Choose any market
- Open order matching
- Use any exchange
- Trust agility
- Fault tolerant
- Transparent by design
- Low fees


## Decentralization

Centralized Market:

- Money escrowed
- Shares escrowed
- Popular markets
- Match orders
- Exchange lock-in
- Adjudicate outcome
- Easily disrupted
- Transparent by choice
- High fees

Decentralized Market:

- Hold your own money
- Hold your own shares
- Choose any market
- Open order matching
- Use any exchange
- Trust agility
- Fault tolerant
- Transparent by design
- Low fees


## Decentralization



Bitcoin

## Bitcoin

$K_{A}$
$K_{B}$

## Bitcoin

$K_{A}$
$K_{B}$

| From | To | Amount |
| :---: | :---: | :---: |
| K | K | 10 BTC |
| K | K | 5 BTC |
| K | K | 18 BTC |

Ledger

## Bitcoin



| From | To | Amount |
| :---: | :---: | :---: |
| K | K | 10 BTC |
| K | K | 5 BTC |
| K | K | 18 BTC |
| K | K | 5 BTC |

Ledger

## $\mathrm{K}_{A} \longrightarrow \mathrm{~T}-9833 \quad \mathrm{~K}_{B}$



T-2351
T-4528
T-9636
T-9833




## Design Decisions

Underlying digital currency \& block chain

- Extend Bitcoin
- Altcoin (XFT)
- Colored Coins


## Design Decisions

How to Declare a Winner:

- Machine-readable feed
- Trusted (human) arbiter
- Miners vote
- Users vote


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How to Declare a Winner:

- Machine-readable feed
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Threats:

- Wrong decision -> profitable
- No decision -> DoS


## Design Decisions

How to Declare a Winner:

- Machine-readable feed
- Trusted (human) arbiter
- Miners vote
- Users vote

Arbiters:

- Choose who you trust (agility)
- Low barrier to entry
- History \& external reputation
- Trustworthiness built into price


## Design

New Operations (Simplified)

- OpenMarket( ) Description \& Arbiter, signed by arbiter
- CloseMarket( ) Outcome, signed by arbiter


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- OpenMarket( ) Description \& Arbiter, signed by arbiter
- CloseMarket( ) Outcome, signed by arbiter
- BuyPortfolio( ) Convert 1 XFT into complete set of shares, signed by currency holder
- SellPortfolio( ) Convert complete set for 1 XFT, signed by share holder


## Design

New Operations (Simplified)

- OpenMarket( ) Description \& Arbiter, signed by arbiter
- CloseMarket( ) Outcome, signed by arbiter
- BuyPortfolio( ) Convert 1 XFT into complete set of shares, signed by currency holder
- SellPortfolio( ) Convert complete set for 1 XFT, signed by share holder
- Exchange( ) Exchange shares for XFT between two parties, signed by both parties


## Design



## Order Book

Most common: continuous, price-time priority
Broadcast orders to Bitcoin-style network:

- Nodes drop competitive orders
- No way to establish time
- Blockchain: updated in batches
- Miners drop competitive orders
- Miners front-run well-priced orders


## Order Book

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The best we can + support external exchanges

## Order Book

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Broadcast to all known neighbours

## Order Book

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- No way to establish time
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Call Market: Market opens, orders pile up, randomly close market, match orders

Matching: Lowest ask matched to highest bid until no more matching possible

## Order Book

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Miners keep spread: spreads can replace fees \& miners can execute at best price (added perk)

Order Book


## Discussion

Design landscape, not a specific proposal
Regulatory issues: not attempting regulatory avoidance
Platform for other financial exchanges
Not suitable for forecasts about underlying currency



