



Blockchain Extractable Value

& other open problems in decentralized systems

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What is a blockchain useful for?

- Create tokens
- “Securely” exchange tokens among users:
 - Direct transfers: A sends 1:T to B
 - Programmable transfers (aka “smart contracts”)

```
contract Birthday {  
    deposit(a, t) { ... } // anyone deposits tokens  
    withdraw() { ... } // a withdraw tokens after t  
}
```

In practice...

> 1T \$

#	Name	Price	1h %	24h %	7d %	Market Cap 
☆ 1	 Bitcoin BTC	\$30,717.73	▼0.03%	▲1.20%	▲14.45%	\$596,336,486,922
☆ 2	 Ethereum ETH	\$1,884.38	▲0.15%	▲0.01%	▲8.88%	\$226,477,114,273
☆ 3	 Tether USDT	\$1.00	▲0.01%	▼0.01%	▲0.05%	\$83,236,539,174
☆ 4	 BNB BNB	\$239.74	▲0.13%	▲0.67%	▼0.41%	\$37,363,576,373
☆ 5	 USD Coin USDC	\$0.9999	▲0.01%	▼0.01%	▼0.02%	\$28,318,731,452
☆ 6	 XRP XRP	\$0.4826	▲0.39%	▼0.15%	▼0.17%	\$25,220,475,802
☆ 7	 Cardano ADA	\$0.2844	▼0.01%	▼1.50%	▲9.30%	\$9,936,328,176

Concurrency(?) theory for blockchains

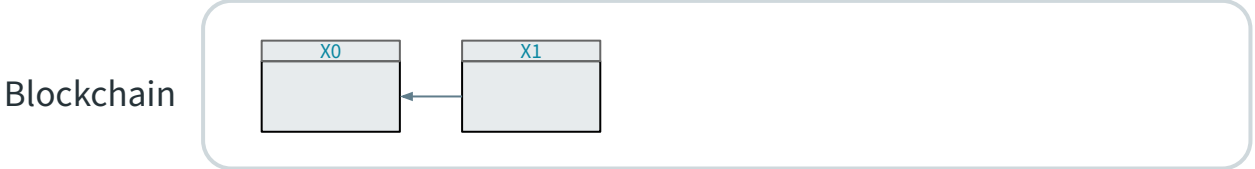
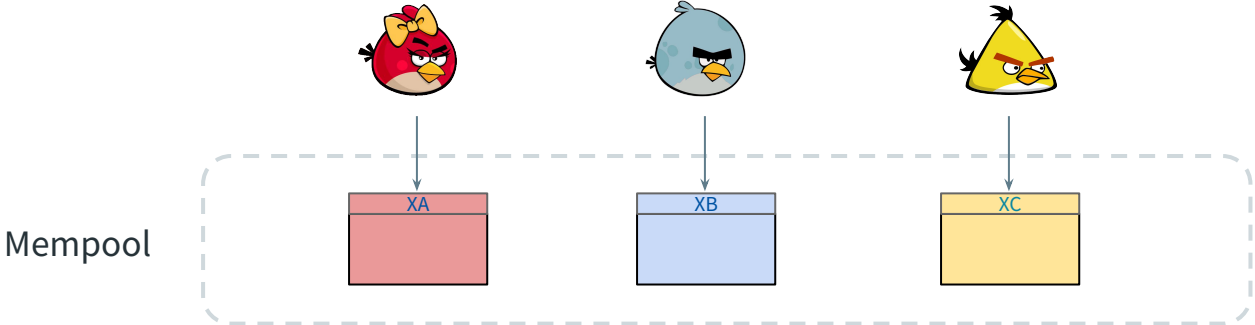
From a theoretical CS, blockchains *should* be interesting:

- Everything is public (code & transactions)
- Huge amounts of \$\$\$ at stake
- Complex objects: contracts, PLs, properties
- Security evaluation is **mostly empirical!**

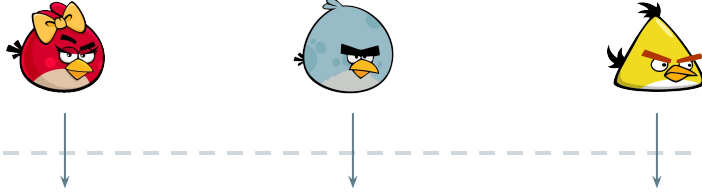
→ need for formal defs & analysis techniques

→ huge gap between theory & practice

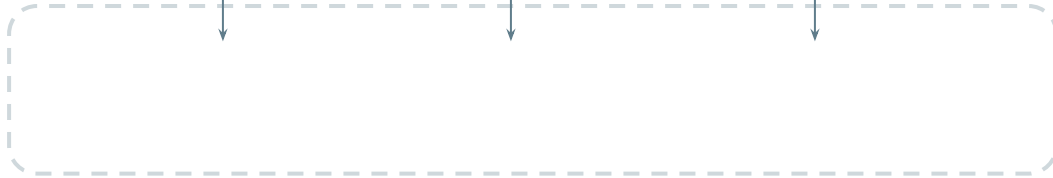
Transaction ordering



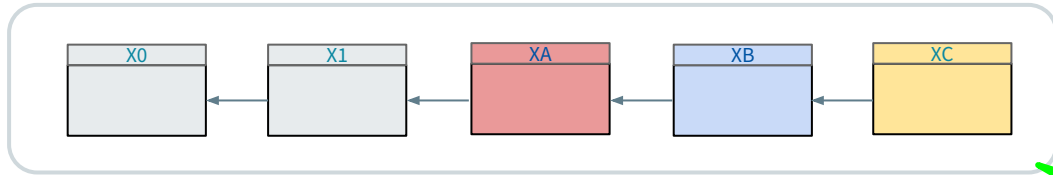
Transaction ordering



Mempool

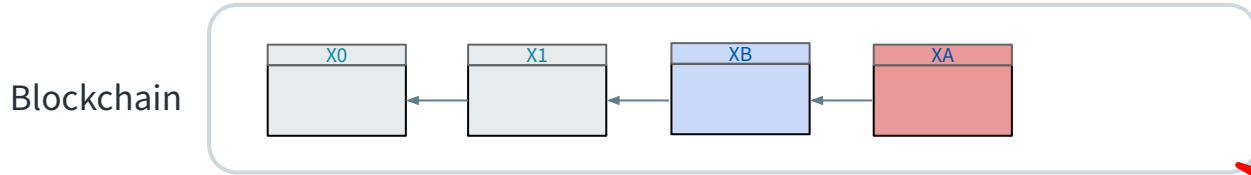
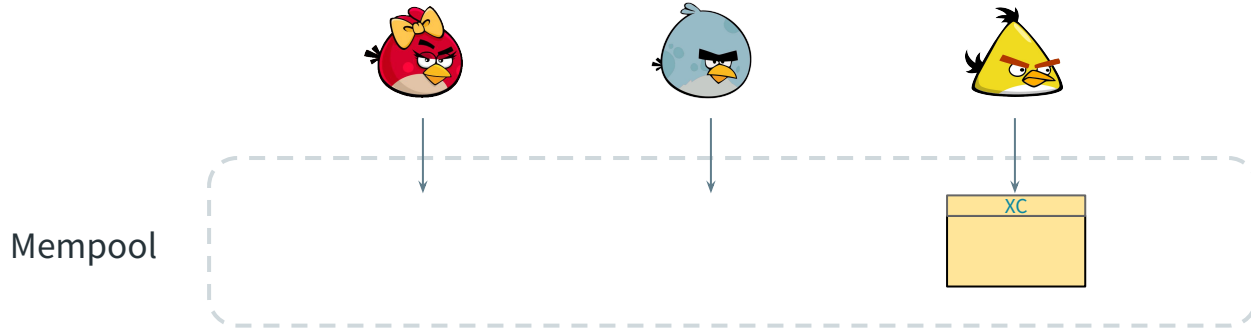


Blockchain



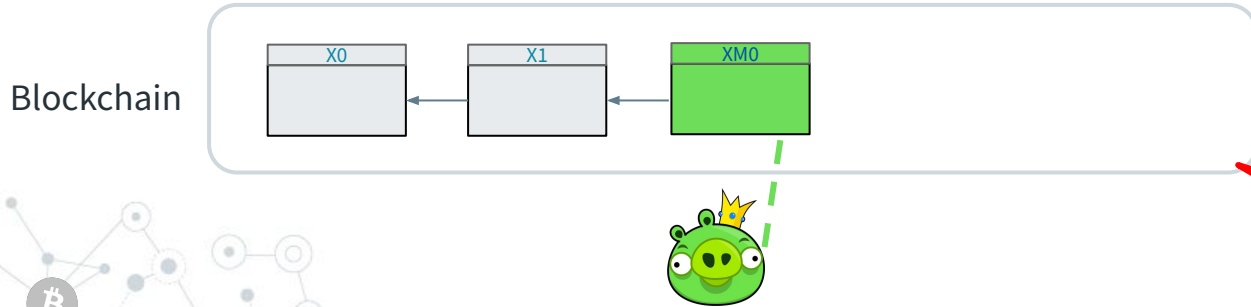
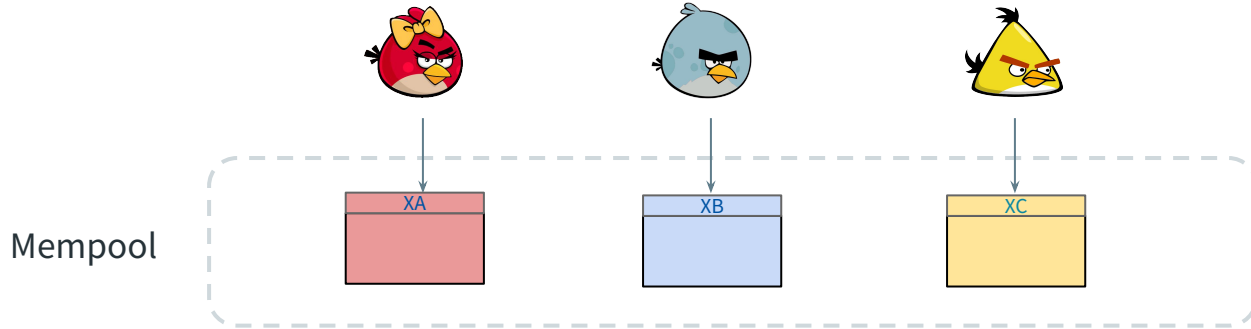
ideally: **fair** ordering

Transaction ordering



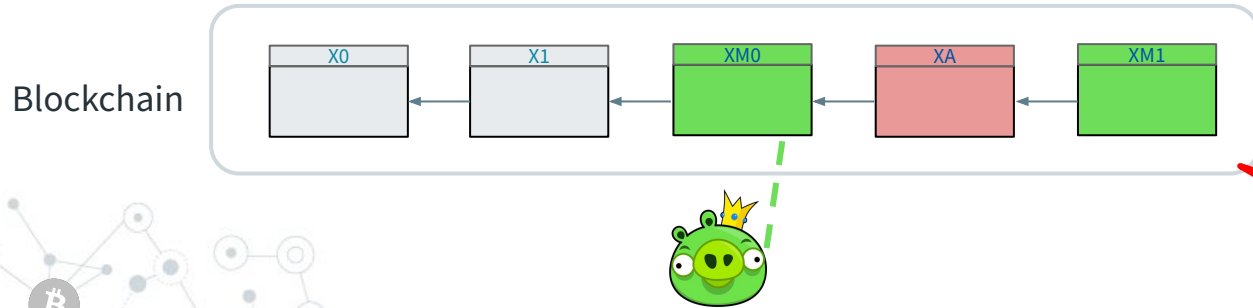
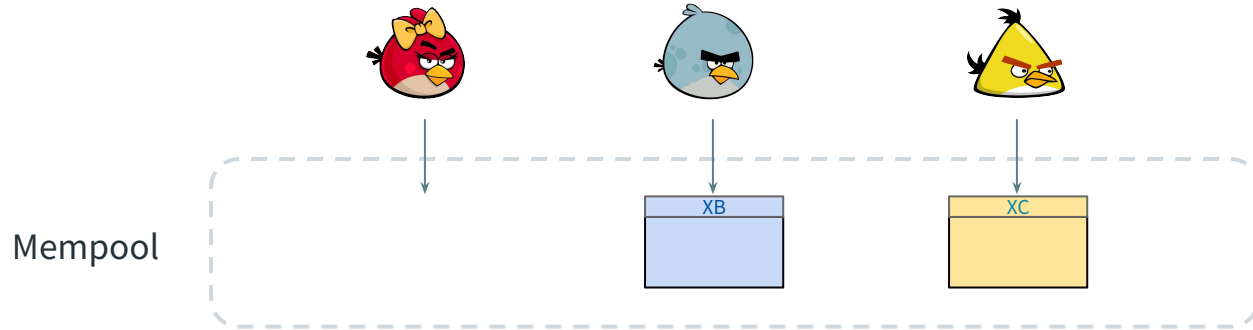
reorder & drop tx

Transaction ordering



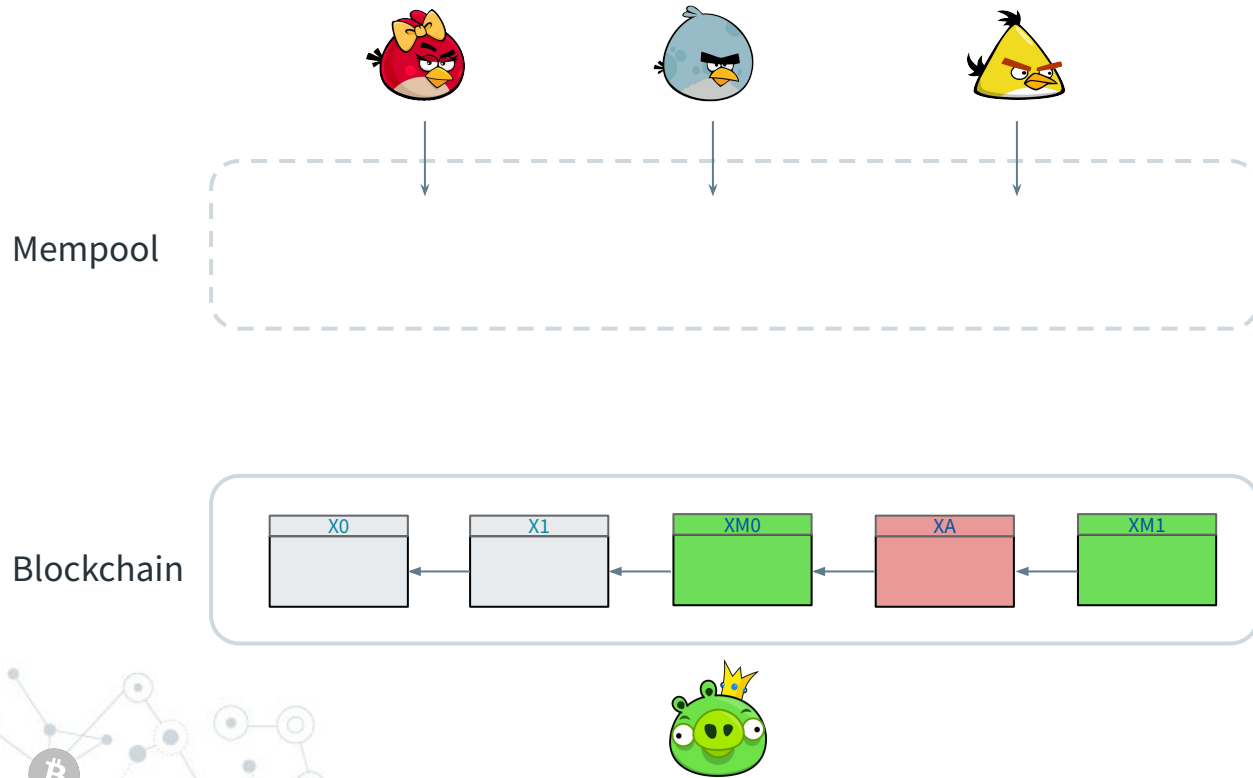
front-run users' tx

Transaction ordering



“sandwich” users’ tx

Transaction ordering

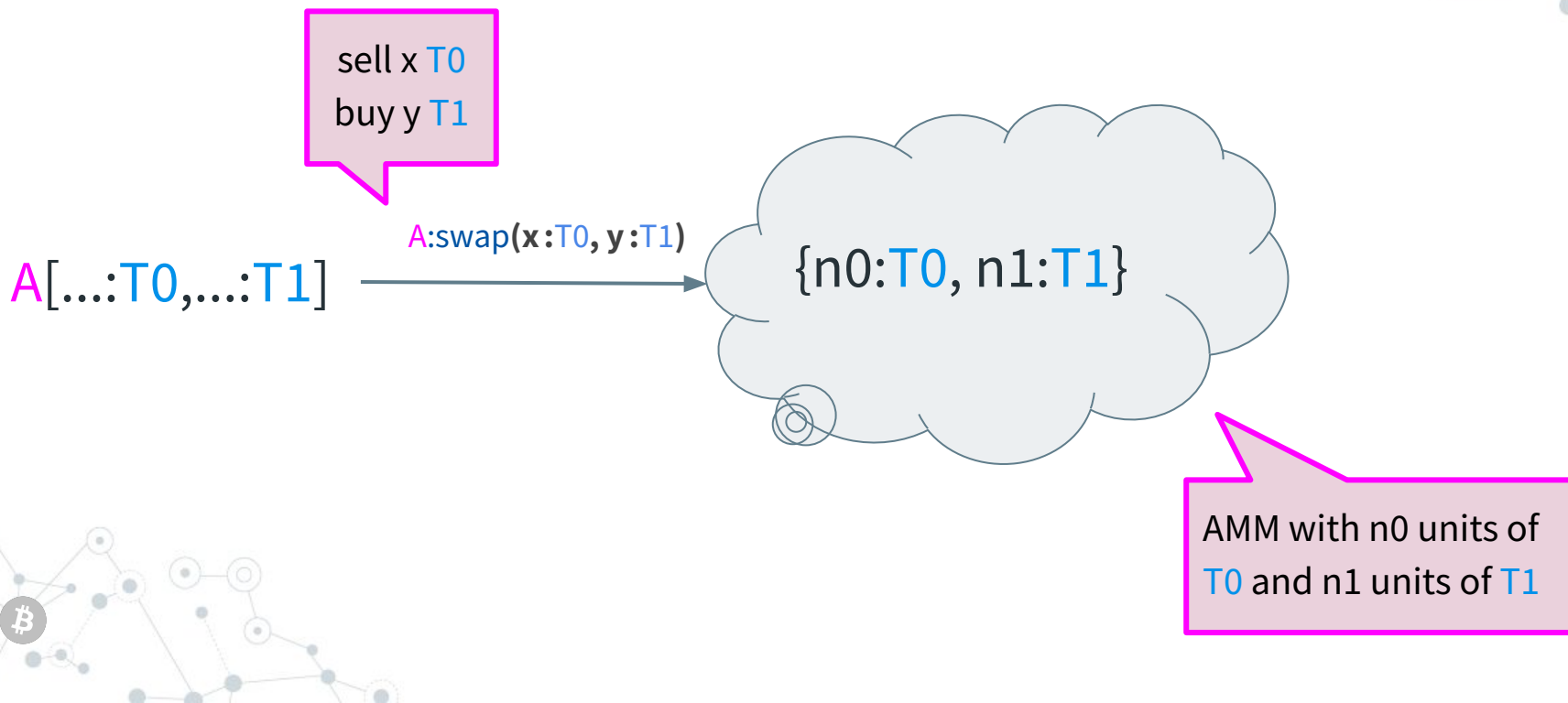


Rational miners exploit users' tx to gain \$\$\$

... usually, to the detriment of users'!

MEV attacks

Example: Automated Market Makers



Example: Automated Market Makers

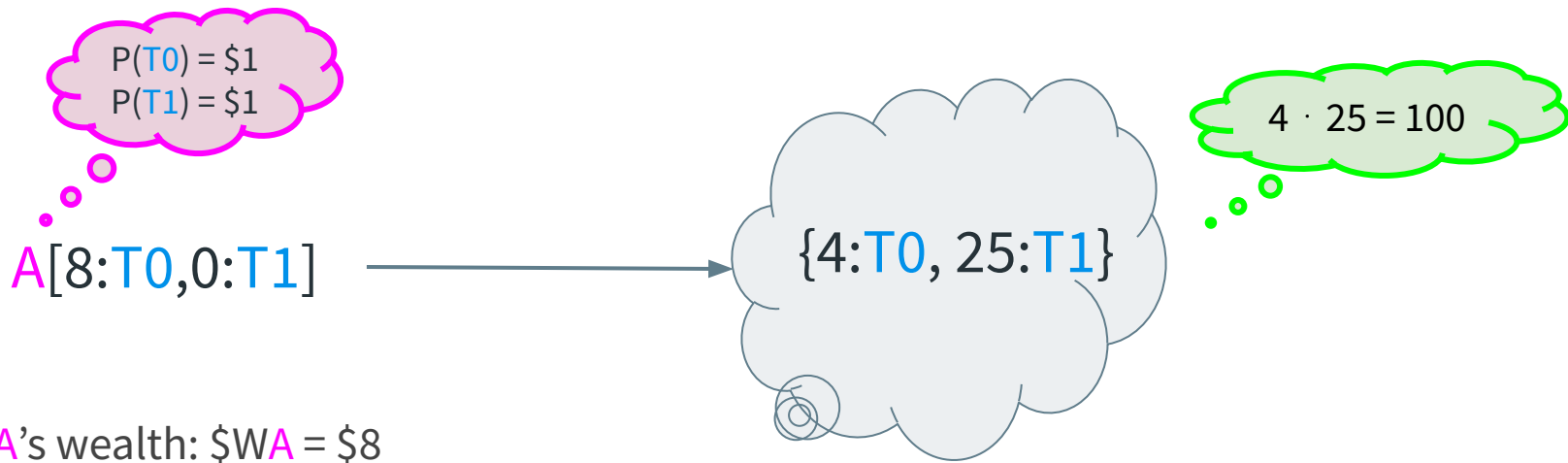
sell x T_0
buy y T_1

$A[\dots -x:T_0, \dots +y:T_1]$ $\xrightarrow{A:\text{swap}(x:T_0, y:T_1)}$

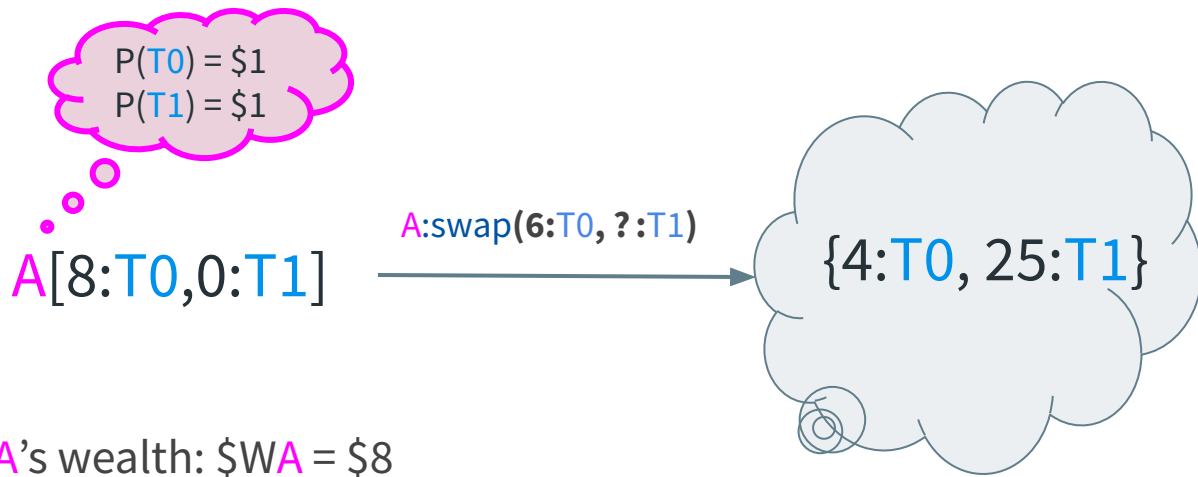
$\{n_0+x:T_0, n_1-y:T_1\}$

Constant-product AMMs:
 $(n_0+x)(n_1-y) = n_0 n_1$

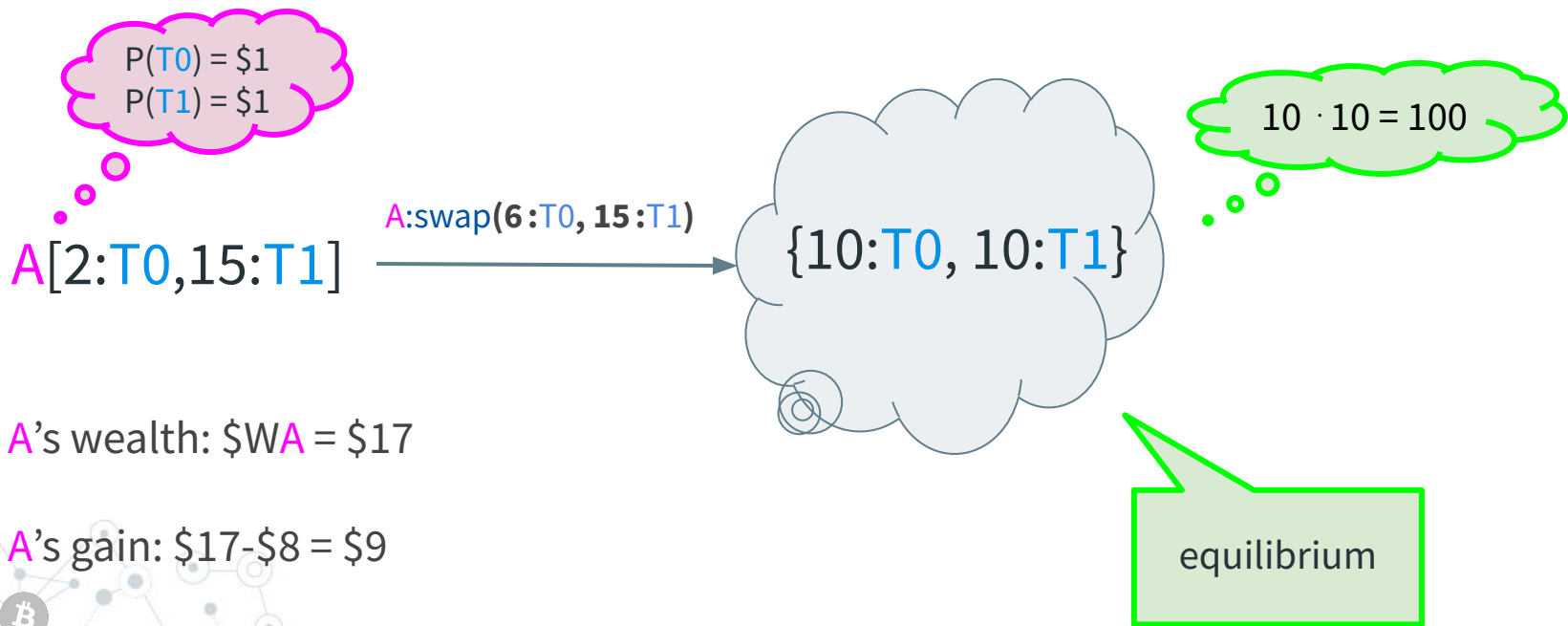
Example: Automated Market Makers



Example: Automated Market Makers



Example: Automated Market Makers



Sandwich attack!



Advs can **reorder**, **drop** or **insert** transactions in a block!

M[6:T0,0:T1]

A[8:T0,0:T1]

A:swap(6:T0,?:T1)

{4:T0, 25:T1}

\$WA = \$8

\$WM = \$6

Sandwich attack!



M[6:T0,0:T1]

M:swap(6:T0,?:T1)

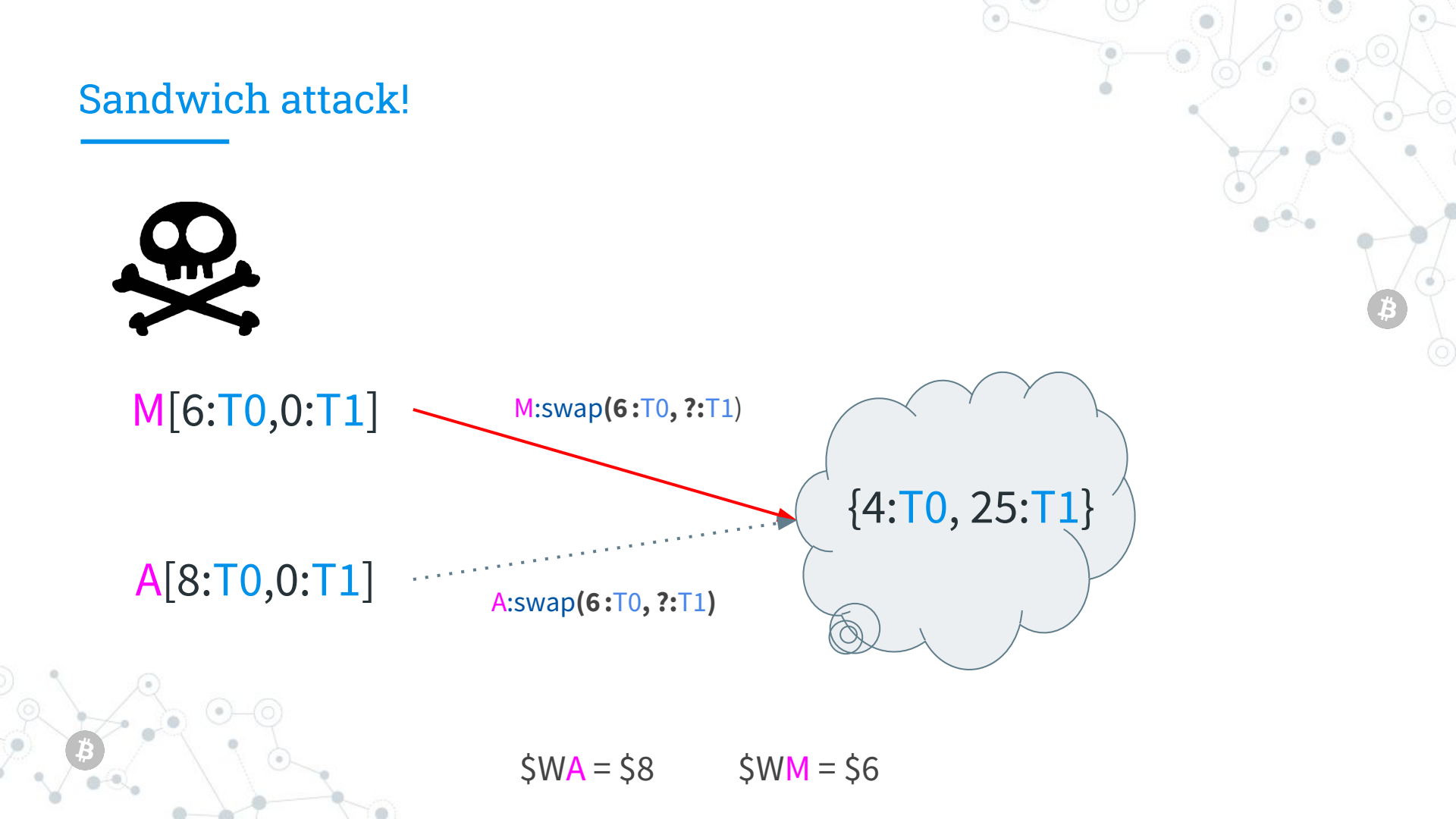
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Sandwich attack!



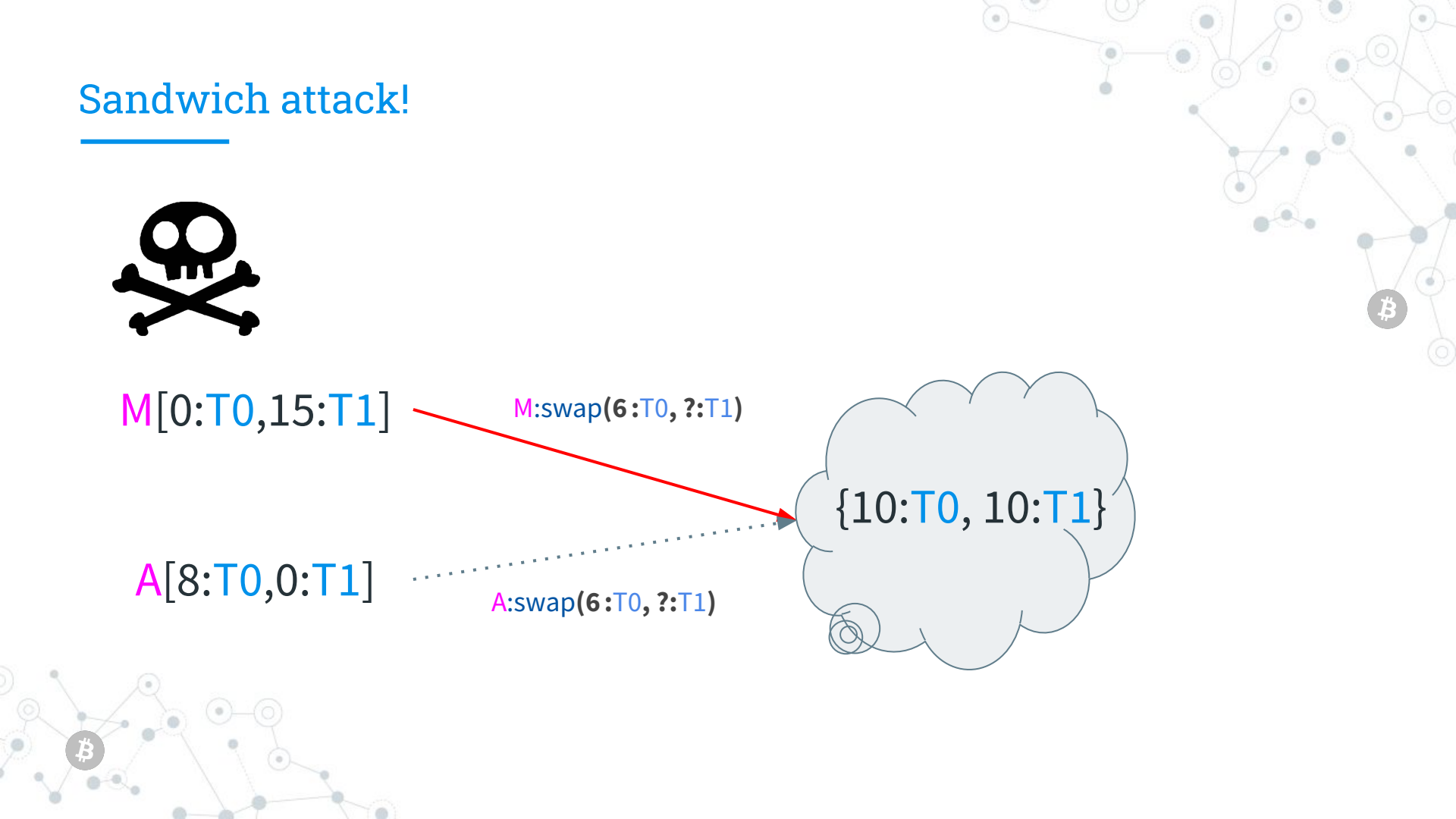
M[0:T0,15:T1]

M:swap(6:T0,?:T1)

A[8:T0,0:T1]

A:swap(6:T0,?:T1)

{10:T0, 10:T1}



Sandwich attack!



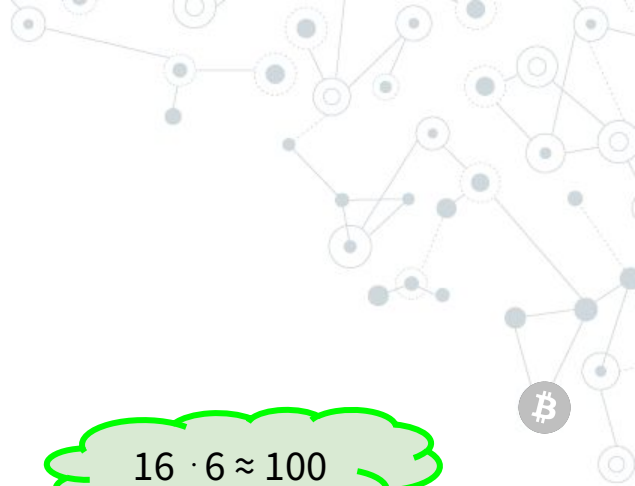
$M[0:T_0, 15:T_1]$

$A[2:T_0, 4:T_1]$

$A:\text{swap}(6:T_0, ? :T_1)$

$\{16:T_0, 6:T_1\}$

$16 \cdot 6 \approx 100$



Sandwich attack!

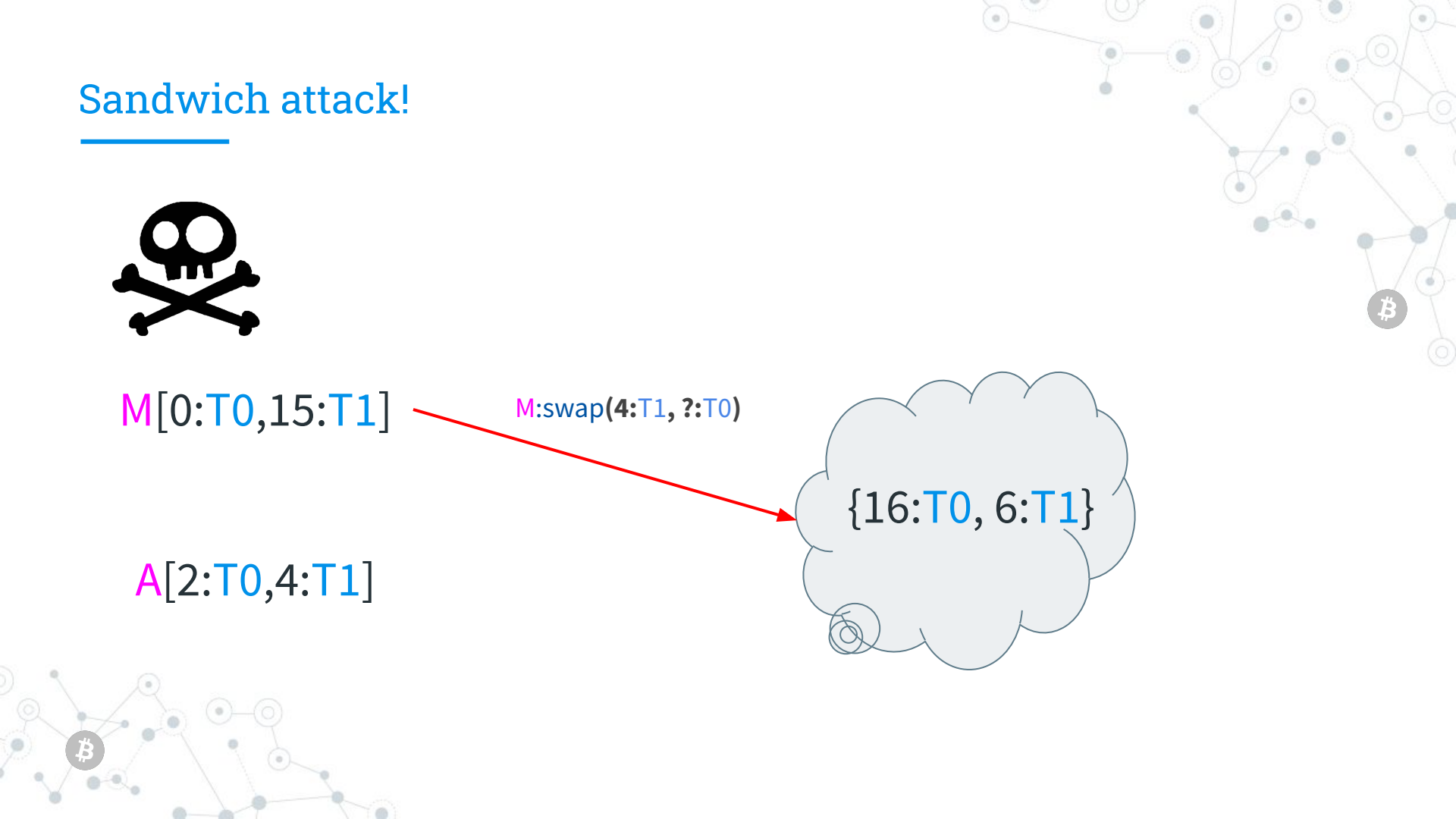


M[0:T0,15:T1]

M:swap(4:T1, ?:T0)

A[2:T0,4:T1]

{16:T0, 6:T1}



Sandwich attack!



M[6:T0, 11:T1]

M:swap(4:T1, ?:T0)

{10:T0, 10:T1}

A[2:T0, 4:T1]

A's gain = \$6 - \$8 = **-\$2**

M's gain = \$17 - \$6 = **\$11**

216,620 ETH

Total extracted REV since the merge

Cumulative weekly ETH paid to proposers from all



Current research & challenges

- Quantification of MEV in the wild
- Precise & efficient MEV extraction strategies
- **Formal def** (current ones are not general, not correct)
- Verification techniques for MEV-freedom
- **Secure composition of contracts**
- Countermeasures: fair ordering, confidential transactions

Understanding MEV, in an abstract setting

```
contract Airdrop {  
  deposit(a?x:T) { require x>0 && a==EM }  
  withdraw(a,y) { require y<#T; a!y:T }  
}
```

We would like to study this in an abstract setting:

$A[1:T] \mid \mathbf{Airdrop}[9:T] \mid \dots \xrightarrow{\text{withdraw}(A,9)} A[10:T] \mid \mathbf{Airdrop}[0:T] \mid \dots$



Clockwork Finance: Automated Analysis of Economic Security in Smart Contracts

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September 10, 2021

Abstract

We introduce the *Clockwork Finance Framework* (CFF), a general purpose, formal verification framework for mechanized reasoning about the economic security properties of *composed decentralized-finance (DeFi) smart contracts*.

CFF features three key properties. It is *contract complete*, meaning that it can model any smart contract platform and all its contracts—Turing complete or otherwise. It does so with asymptotically *optimal model size*. It is also *attack-exhaustive by construction*, meaning that it can automatically and mechanically extract all possible economic attacks on users' cryptocurrency across modeled contracts.

[cs.CR] 9 Sep 2021



MEV, formally

$$\text{MEV}_A(S, \mathbf{P}) = \max \{ \text{gain}_A(S, \underline{X}) \mid \underline{X} \in K_A(\mathbf{P})^* \}$$

$K_A(\mathbf{P})$ = set of tx that users A can **deduce** from mempool \mathbf{P}

This definition is not yet completely satisfactory:

1. what is $K_A(\mathbf{P})$??

→ not just the tx in \mathbf{P} , but any tx that A can **infer** from \mathbf{P}

2. MEV_A is the gain of a *given* set A

→ actual MEV should be extractable by anyone!

Adversarial knowledge

A 's knowledge $K_A(P)$ = set of tx that A can craft using:

- A 's private knowledge $K_A(\emptyset)$

- deposit(A ?1:T)

- (with $A \in \mathcal{A}$)

- reveal(s)

- (with s secret generated by A)

- mempool P

- any tx in P belongs to $K_A(P)$

- A can **combine** their private knowledge with parameters in P

Axiomatization of $K_A(P)$

1. Extensivity: $P \subseteq K_A(P)$
2. Idempotence: $K_A(K_A(P)) = K_A(P)$
3. Monotonicity: $P \subseteq P', A \subseteq A' \Rightarrow K_A(P) \subseteq K_{A'}(P')$
4. Continuity: $K_A(\bigcup_{i \in \mathbb{N}} P_i) = \bigcup_{i \in \mathbb{N}} K_A(P_i)$
5. Finite causes: $\forall P \text{ finite} . \exists A \text{ finite} . P \subseteq K_A(\emptyset)$
6. Private knowledge: $K_A(\emptyset) \subseteq K_{A'}(\emptyset) \Rightarrow A \subseteq A'$
7. No shared secrets: $K_A(P) \cap K_B(P) \subseteq K_{A \cap B}(P)$

closure operator

Induced properties on MEV

$$\text{MEV}_A(S, \mathbf{P}) = \max \{ \gamma_A(S, \underline{X}) \mid \underline{X} \in K_A(\mathbf{P})^* \}$$

$$\text{MEV}_A(S, \mathbf{P}) = \text{MEV}_A(S, \mathbf{P} \setminus K_A(\emptyset))$$

$$\mathbf{P} \subseteq \mathbf{P}' \Rightarrow$$

$$\text{MEV}_A(S, \mathbf{P}) \leq \text{MEV}_A(S, \mathbf{P}')$$

$$A \subseteq A' \not\Rightarrow$$

$$\text{MEV}_A(S, \mathbf{P}) \leq \text{MEV}_{A'}(S, \mathbf{P})$$

$$\forall A. \exists A_0 \subseteq_{\text{fin}} A. \text{MEV}_A(S, \mathbf{P}) = \text{MEV}_{A_0}(S, \mathbf{P})$$

$$\forall \mathbf{P}. \exists \mathbf{P}_0 \subseteq_{\text{fin}} \mathbf{P}. \text{MEV}_A(S, \mathbf{P}) = \text{MEV}_A(S, \mathbf{P}_0)$$

$$\mathbf{C} \text{ wallet mono} \Rightarrow \text{MEV}_A(S, \mathbf{P}) \leq \text{MEV}_A(S + W_{\Delta}, \mathbf{P})$$

mono

exts

idem

mono

mono

fin.cs

no.ss

cont

Adversarial MEV

- In our def of $MEV_A(S, P)$: the set A is fixed;
- In practice: the identity of the adversary is immaterial!

$MEV(S, P)$ = value that can be extracted by **anyone** with the power to reorder, drop or insert tx!

Example: Whitelist

```
contract Whitelist {  
    pay(a?1:T) {  
        require a==A;  
        a!#T:T  
    }  
}
```

$S = M[1:T] \mid \text{Whitelist}[100:T]$

$$\text{MEV}(S, P) = 0 \quad (\forall P)$$

Hard-coded users are
not MEV adversaries!

Example: Blacklist

```
contract Blacklist {  
  pay(a?1:T) {  
    require a!=A;  
    a!#T:T  
  }  
}
```

$S = M[1:T] \mid \text{Blacklist}[100:T]$

Any MEV adversary can generate an identity $\neq A$

$\text{MEV}(S, P) = 100 P(T) \quad (\forall P)$

Example: Bank

```
contract Bank {  
  deposit(a?x:T) { bal[a]+=x }  
  withdraw(a?0:T,x) {  
    require bal[a]>=x;  
    bal[a]-=x; a!x:T }  
}
```

$S = A[0:T] \mid \text{Bank}[\text{bal} = \{100/A\}]$

$$\text{MEV}_A(S, \emptyset) = 100 P(T)$$

$$\text{MEV}(S, \emptyset) = \mathbf{0}$$

Registered users are **not** MEV adversaries!

Example: Coinpusher

```
contract Coinpusher {  
    pay(a?x:T) {  
        if #T>99 then a!#T:T }  
}
```

$S = A[1:T] \mid \text{Coinpusher}[0:T] \mid \dots$ $\text{MEV}(S, \emptyset) = 0$

$P = \{ \text{pay}(A?1:T) \}$ $\text{MEV}(S, P) = 1 P(T)$

Assuming the MEV
adversary has 98:T

Adversarial MEV

Idea: min-max game between honest users and Adv

- **min:** honest users choose Adv (any cofinite set B)
- **max:** Adv chooses $A \subseteq B$ and redistributes tokens:

$S \sim S'$ iff $W(S)$ and $W(S')$ have the same tokens

$$\text{MEV}(S, P) = \min_{B \text{ cofinite}} \max_{\substack{A \subseteq B \\ S \sim S'}} \text{MEV}_A(S', P)$$

Properties of adversarial MEV

$$\text{MEV}(S, \mathbf{P}) = \min_{B \text{ cofinite}} \max_{\substack{A \subseteq B \\ S \sim S'}} \text{MEV}_A(S', \mathbf{P})$$

$$\mathbf{P} \subseteq \mathbf{P}' \Rightarrow \text{MEV}(S, \mathbf{P}) \leq \text{MEV}(S, \mathbf{P}')$$

$$\mathbf{C} \text{ wallet mono} \Rightarrow \text{MEV}(S, \mathbf{P}) \leq \text{MEV}(S + W_{\Delta}, \mathbf{P})$$

Challenges

MEV not easy to capture formally!

- time? (clogging)
- MEV of a contract (requires users' strategies)
- probabilistic strategies?
- **secure contract composition?**



Further challenges: the “Lego of money”

- Contract compositions are quite common in DeFi:
 - Lending Protocols + AMMs (“flash loans”)
 - any contract + AMM as price oracles
- How to def when a contract composition is secure?
 - $MEV(C, C') \leq (1 + \epsilon) MEV(C)$ (from Clockwork Finance)
 - several problems with this def...