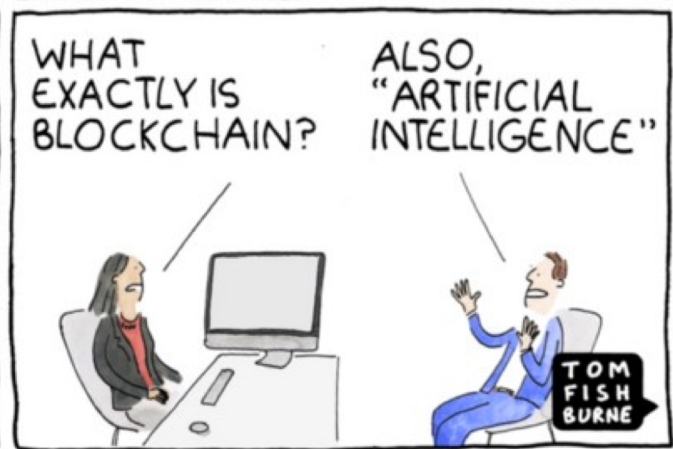
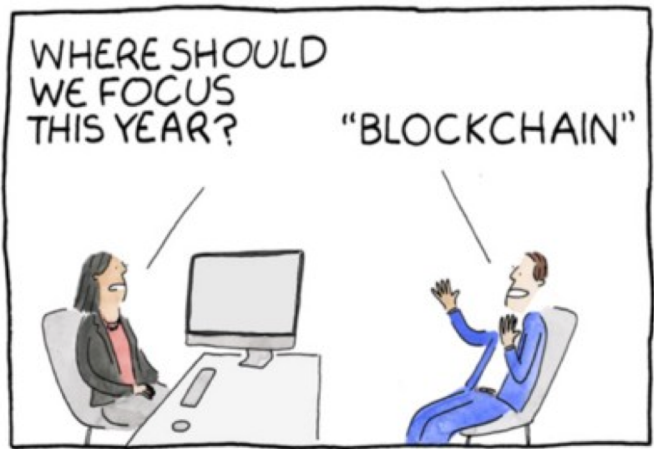


# Block chains: miracle cure or snake oil?

Henning Schulzrinne (Columbia University)

February 2019

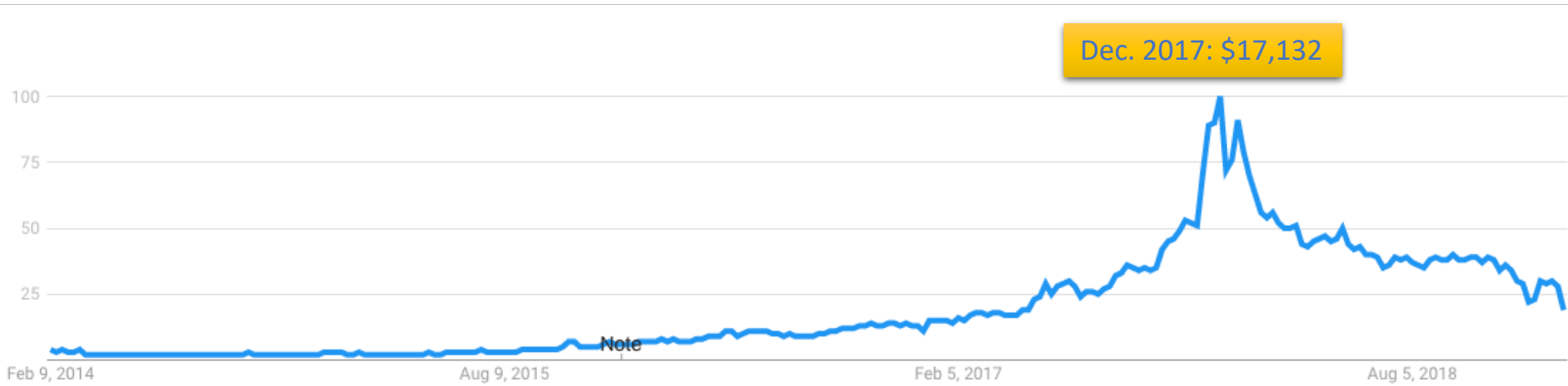
Federal Reserve New York



"ML is programmed in Python, AI in PowerPoint."  
Blockchain in exclamation marks!

© marketoonist.com

# Google searches: blockchain



# Bitcoin (1 year)

store of value?  
unit of account?

## Bitcoin Price (BTC)

**\$3,372.96** ▼-1.18%



# Bitcoin is the new gold – is it?



# High on blockchain

1,055 views | Jan 21, 2019, 05:58am

## How Blockchain Technology Can Help Cannabis Recovery Efforts In Natural Disasters



**Andre Bourque** Contributor ⓘ

Vices

*I provide insight and advice on cannabis and blockchain.*

# Recording research precedence

**TOOLBOX** • 04 FEBRUARY 2019

## Bitcoin for the biological literature

*Scientific publishing is increasingly adopting the technology underlying cryptocurrencies.*

Howard said blockchain is even less understood by the telecommunications industry than AI and ML, since most public discussions around it have been in regards to cryptocurrencies.

"Many executives believe that blockchain could be used to maintain data integrity and support peer-to-peer trust in call detail records (CDR), once the technology is ready and its value has been defined," Howard **wrote** in his report. "A few hopeful operators are confident that blockchain is a strong candidate to ease overall telecommunications business transactions."

There has been a fair amount of activity on the blockchain front over the past year. MEF showed its support for blockchain at **its MEF18 conference** in October. In addition to the blockchain demos at the conference, MEF CTO Pascal Menezes said the standards development organization was using blockchain to exchange money and allocate resources between carriers.

#### **RELATED: Colt and Zeetta Networks to demonstrate blockchain marketplace at MEF18**

One of the proof-of-concept (PoC) demonstrations at MEF18 was the MEF Lifecycle Service Orchestration (LSO) Sonata API to enable transactions across a blockchain-based marketplace. LSO Sonata includes intercarrier quoting capabilities and blockchain-based billing and settlement features.

BT, Colt, HGC Global, Telefonica and Telstra conducted a trial early last year that used blockchain for wholesale settlement. In August, CBCcom, PCCW Global, Sparkle, Tata Communications, Clear Blockchain Technologies and Cataworx announced **a blockchain PoC trial**.



# An early analog blockchain

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Nottingham, 1790

# Key idea: linkage

125

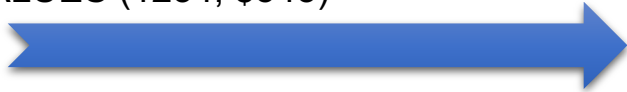
Dr. : Turner Capt. J. W. M.C. : ~~York House, 6 North Rd., The Park~~ : Cr  
 2nd Sherwood Foresters The Cottage, Barrow, Derby  
 Tel. Chellaston 38.

From A. 86.

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April 15	" Dr. Coll net undershirts 40 knecker drawers 38	354	} R 1 10	
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" 23	" Angola fl. knnis shirts to or	361		} R 4 19
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June 1	" Chamois gloves 8 <sup>2</sup>	405		} R - 8 6
" 18	" Mt Dy <sup>2</sup> 1/2 hose <sup>fine</sup> " 4 1/2 hdkf	423	} R - 13 6	
		21		} R - 4

# What does a database do?

```
INSERT INTO ledger (customer, amount)  
VALUES (1234, $543)
```



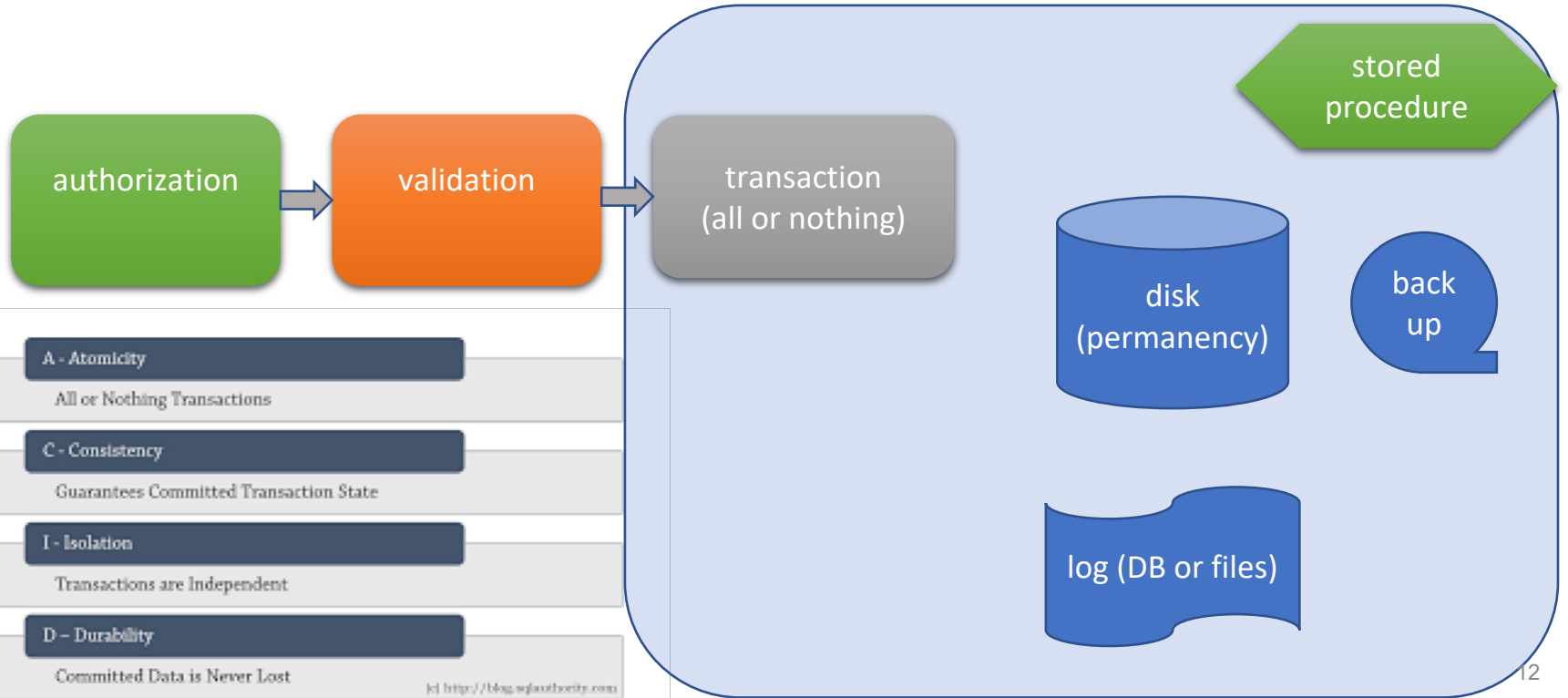
```
SELECT sum(amount) FROM ledger  
WHERE customer = 1234
```



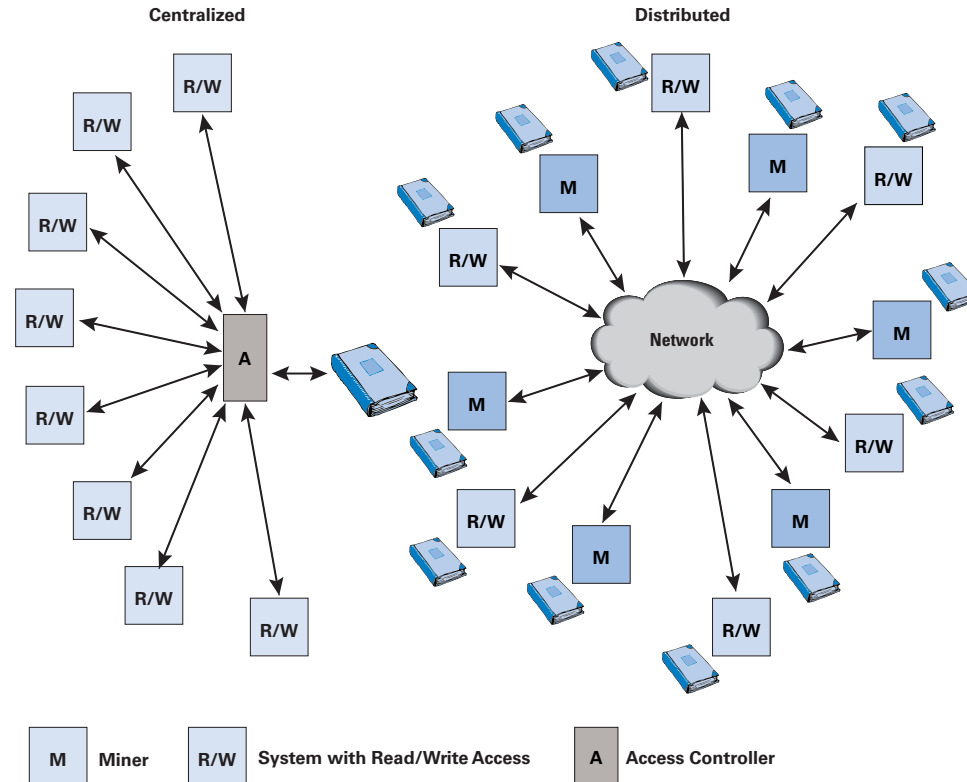
- trusted, reliable data store
- may be operated by third party (AWS, Azure, GC, ...)
- transaction may be signed by originator
- content may be encrypted

# Modern datastore architecture (simplified)

*SELECT person, amount FROM payment JOIN person USING (person) WHERE ...*



# Centralized → distributed



# Concept: non-repudiation

- “A statement's author cannot successfully dispute its authorship or the validity of an associated contract (or signature).”
- Traditional grounds (McCullagh):
  - The signature is a forgery;
  - The signature is not a forgery, but was obtained via:
    - Unconscionable conduct by a party to a transaction;
    - Fraud instigated by a third party;
    - Undue influence exerted by a third party.
- Crypto:
  - A service that *provides proof of the integrity and origin of data*, both in an *unforgeable relationship*, which can be verified by any third party at any time; or,
  - In authentication, an authentication that with high assurance can be asserted to be genuine, and *that can not subsequently be refuted*.
  - Typically, uses public-private key pair for validation and signing.
  - Refutation: author has to make plausible case that somebody stole their key.

# BAR actors: Byzantine, altruistic, rational

Byzantine: may deviate from protocol for any reason

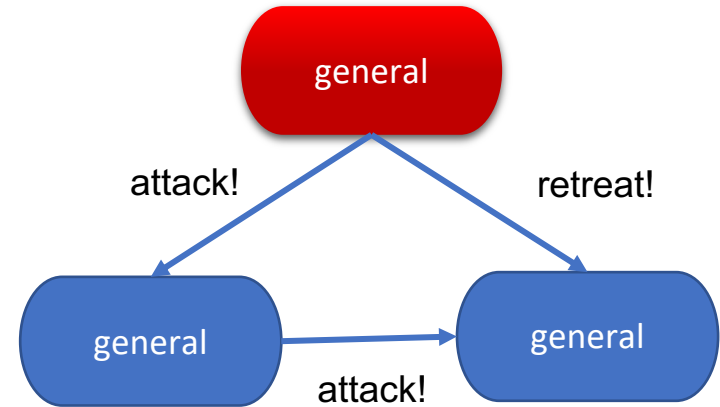
- technical failure
- deliberate harm
- gratuitous maliciousness

Rational: self interested

- maximize short-term or long-term benefit
- including any penalties or rewards

Altruistic: follow protocol exactly

- extrinsic or intrinsic motivation



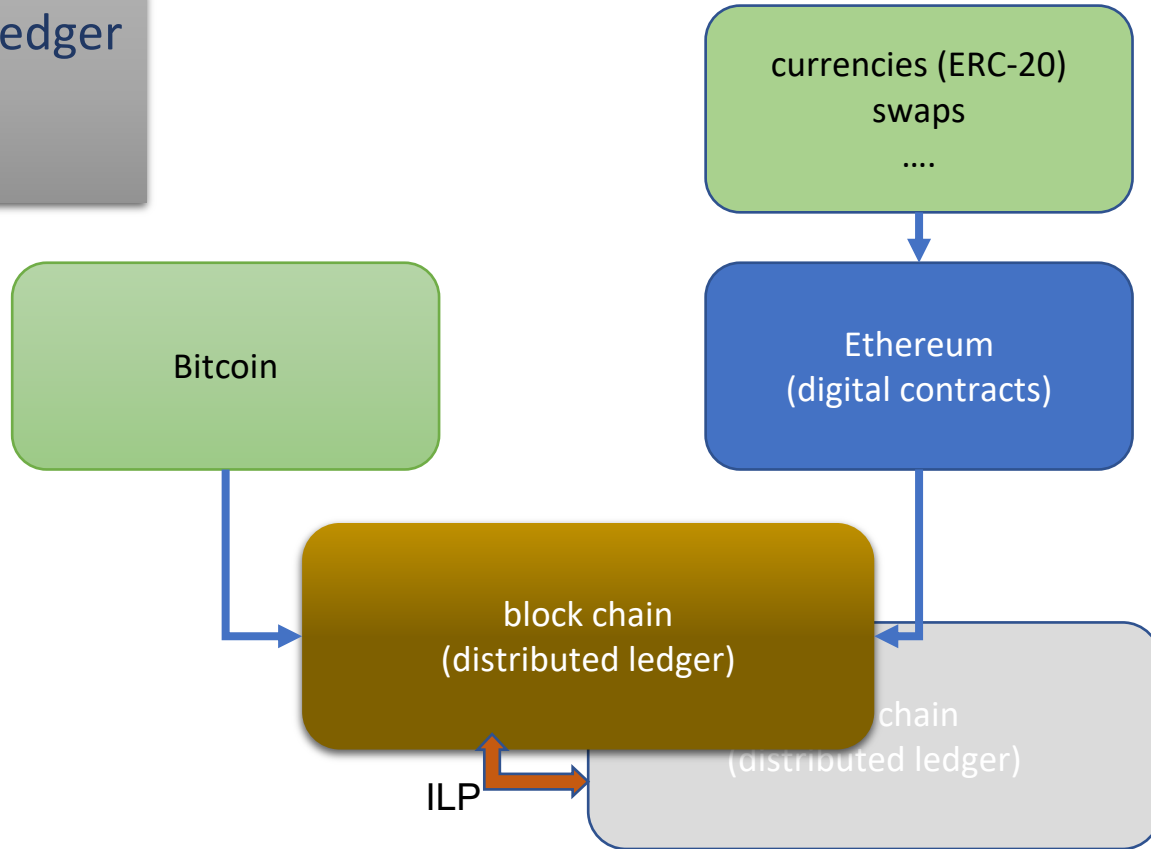
# What is a blockchain?

- Distributed ledger
  - *Indelible*, append-only log of transactions between parties
  - Which transactions happened?
    - "Alice transferred 10 coins to Bob"
  - Order of transactions
    - "Alice transferred 10 coins to Bob, and then Bob transferred title to his car to Alice"
  - Public (mostly) & accessible to all parties
  - Tamper-proof: no party can add, delete, or modify ledger entries once they have been recorded
- ➔ *Ledgers must be immune to attack, ensuring the ledger remains secure even if some parties misbehave, whether accidentally or maliciously.*

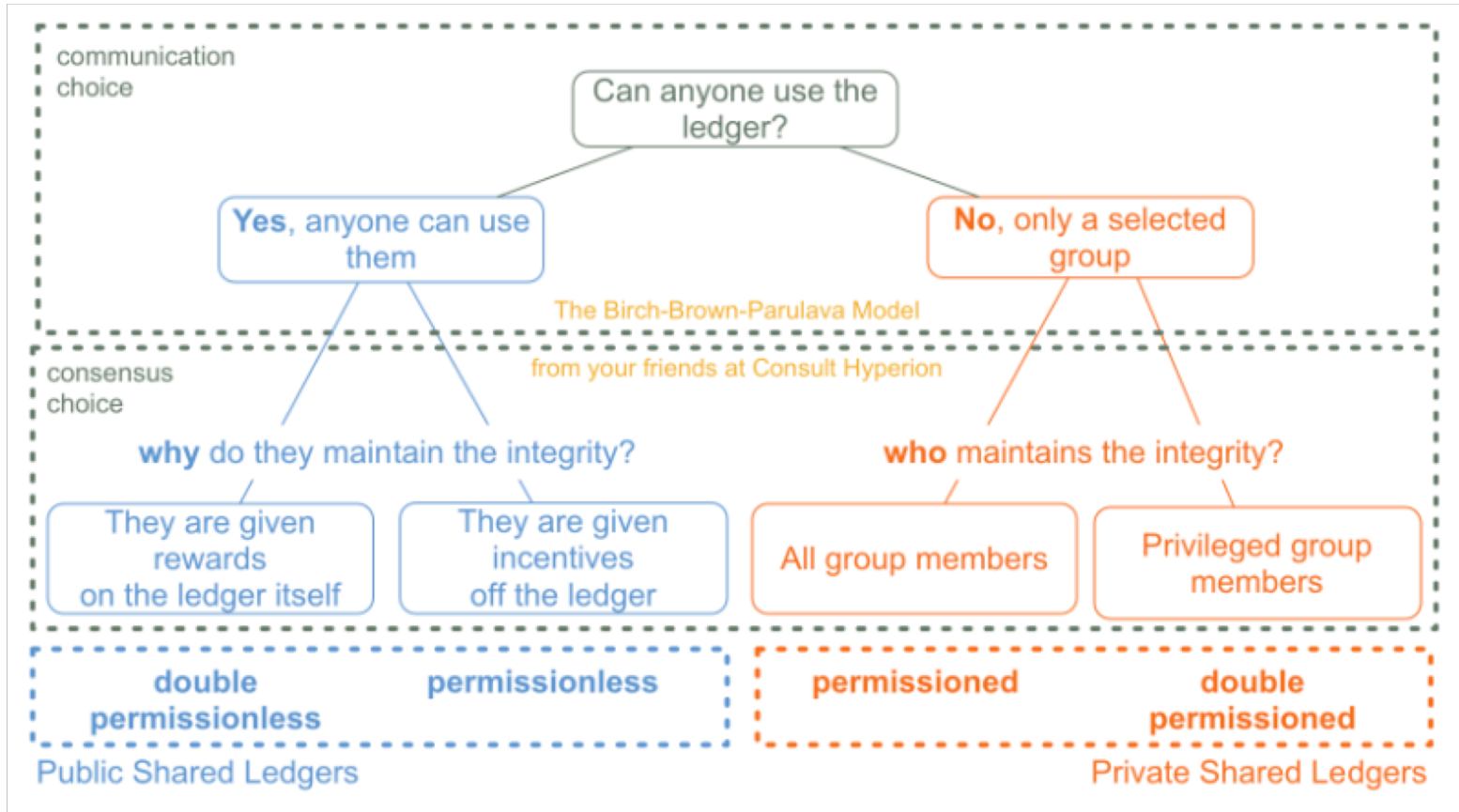


# Public blockchain architecture

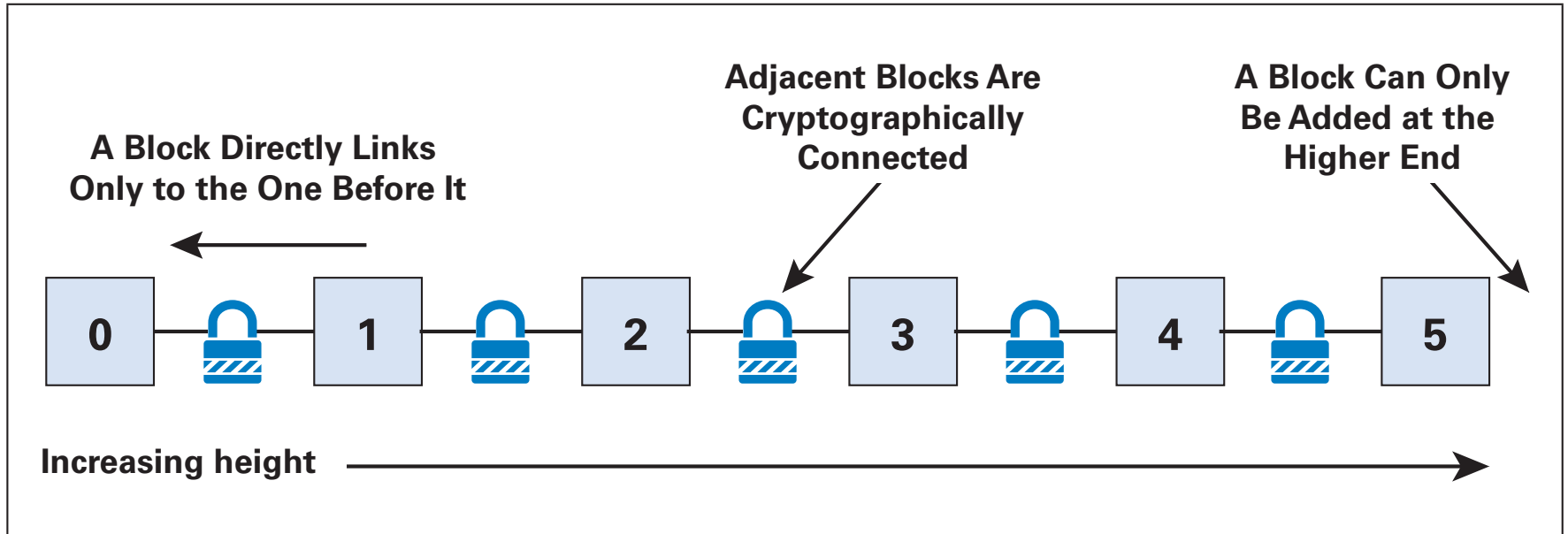
distributed ledger  
+ consensus  
+ currency



# What kind of ledger?



# Block chaining



# Concept: identifier

- Bitcoin addresses are tokens
- May (should) use unique address for each transaction
- Examples
  - P2PKH: 1BvBMSEYstWetqTFn5Au4m4GFg7xJaNVN2
  - Bech32: bc1qar0srrr7xfkvy5l643lydnw9re59gtzzwf5mdq


**BLOCKCHAIN** WALLET DATA API ABOUT  [GET A FREE](#)

### Bitcoin Address

Addresses are identifiers which you use to send bitcoins to another person.

Summary		Transactions	
Address	1219YDPgwueZ9NyMgw519p7AA8lajr6SMw	No. Transactions	130
Hash 160	14a477954ed719135d1598da348a858b18b44fd5	Total Received	19.41549422 BTC
		Final Balance	1.64436385 BTC

[Request Payment](#) [Donation Button](#)

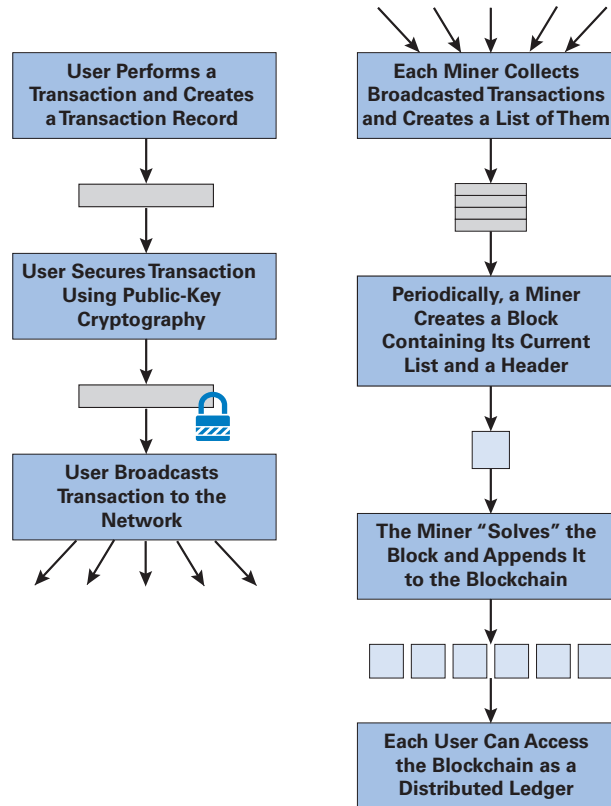


### Transactions (Oldest First)

[Filter](#)

8f8747463dd5edd2edcb2ab7ee2b436e8ccb6b5e272a9de747513205492d7422	2019-01-16 12:44:34
1BhNfB1suWwNZgfkXgThVuCDmGdpYwgpj	→ 1219YDPgwueZ9NyMgw519p7AA8lajr6SMw
	0.00288652 BTC
	0.00288652 BTC

# Adding transactions



# What's in a block?

Table 17. Contents of a block.

Item	Description
Magic Number	A unique identifier for the blockchain; remains constant for all subsequent blocks
Blocksize	Number of bytes following up to end of block
Version Number	Block format version
Link to Previous Block	Hash of preceding block header
Transaction Hash	The root node of a Merkle Tree, a descendant of all the hashed pairs in the tree. The root node is a 256-bit hash based on all of the transactions in the block.
Timestamp	When block was created
Mining Difficulty	A relative measure of how difficult it is to find a new block. The difficulty is adjusted periodically as a function of how much hashing power has been deployed by the network of miners.
Nonce	Used to calculate proof-of-work
Transaction Counter	Number of transactions in this block
Transactions	The (nonempty) list of transactions

# Consensus algorithms

- Goal: make it difficult for (cheating) participants to collude – 51% problem
  - may also provide incentive to participate in validation – e.g., 12.5 BTC reward
- Idea: make it expensive to cheat
  - preferably more than you can gain
- Encourage distribution of block approver → decentralization
  - assumes implicitly linear cost → no or limited efficiencies of scale or scope
  - only needed if identities are easily forged and no external recourse (e.g., criminal prosecution)
- Variations, among many:
  - **Proof of Work (PoW)**: solve “hard” problem that requires computation → hardware + energy cost
    - reward given to first miner who solves cryptopuzzle
    - scale: mining farms (human labor, ASICs)
    - scope: own or access to cheap electricity or specialized circuits (ASICs)
  - **Proof of Stake (PoS)**: validator chosen based on wealth

# PoW ingredient: hash

Hash (SHA-256 for Bitcoin  
ethash for Ethereum)




```
hash('sha256', 'The quick brown fox jumped over the lazy dog.');
```

68b1282b91de2c054c36629cb8dd447f12f096d3e3c587978dc2248444633483

- Transforms any text or bit string into 32-byte (256 bit) number.
- 256 bit =  $1.15 \cdot 10^{77}$  = ~0.1% of number of atoms in visible universe.
- Need exhaustive search to construct string that creates same hash.
- Difficulty can be calibrated (number of matching digits).



# Mine bitcoins at home!



Shark Mini

Most compact and lightweight mining rig on the market

AMD RX570/580 based model:




- **Recommended** Ethereum: 120 MH/s (up to \$300/month)
- **Recommended** Bitcoin Gold / ZCash: 1200 H/s (up to \$200/month)
- +55 Other coins available.

Numbers are reference only and may vary.  
[More details »](#)

**LIMITED SALE! \$100 OFF!**

Starting at ~~\$2,690~~ **\$2,590**

PATENT PENDING


 CASH     ETHEREUM     MONERO

**+50 MORE COINS**

[SELECT](#)    [ASK EXPERT](#)

Shark Mini, \$2,590

# This is not investment advice

Active

## BitcoinGold (BTG)

<https://bitcoingold.org/>

Algorithm: Zhash  
Block time: 9m 48s  
Last block: 566,616  
Bl. reward: 12.50  
Bl. reward 24h: 12.50  
Difficulty: 187,086.105  
Difficulty 24h: 181,197.592  
Difficulty 3 days: 179,697.589  
Difficulty 7 days: 190,505.820  
Nethash: 2.61 Mh/s  
Ex. rate: [0.00288500 \(Binance\)](#)  
Ex. rate 24h: [0.00291680 \(Binance\)](#)  
Ex. rate 3 days: [0.00287263 \(Binance\)](#)  
Ex. rate 7 days: [0.00296182 \(Binance\)](#)  
Ex. volume 24h: 117.39 BTC  
Market cap: \$175,389,965  
Create 1 BTC in: 415.03 Days  
Break even in: 461.01 Days

Hash rate 1160.0 h/s	Power 600.0 W	Cost 0.194 \$/kWh
Block reward 12.5 BTG	Pool fee 1.0 %	Hardware cost 2590.0 \$
Difficulty 181197.592	Exchange rate 0.00288500 BTC	BTC value 3491.1 \$
Reset		Calculate



Pay for hardware & electricity with crypto backed Nexo loans. Don't sell on the dip.

Please note that calculations are based on mean values, therefore your final results may vary.

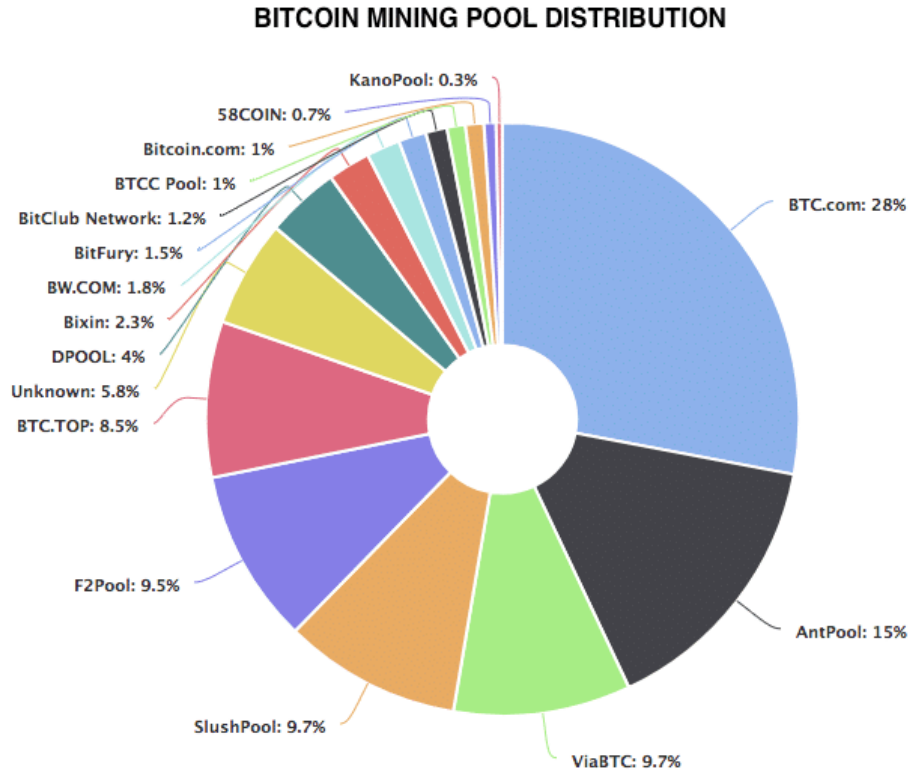
Estimated Rewards

Per	Pool Fee	Est. Rewards	Rev. BTC	Rev. \$	Cost	Profit
Hour	0.000352	0.034799	0.000100	\$0.35	\$0.12	\$0.23
Day	0.008436	0.835170	0.002409	\$8.41	\$2.79	\$5.62
Week	0.059052	5.846192	0.016866	\$58.88	\$19.56	\$39.33
Month	0.253082	25.055110	0.072284	\$252.35	\$83.81	\$168.54
Year	3.079163	304.837170	0.879455	\$3,070.27	\$1,019.66	\$2,050.60

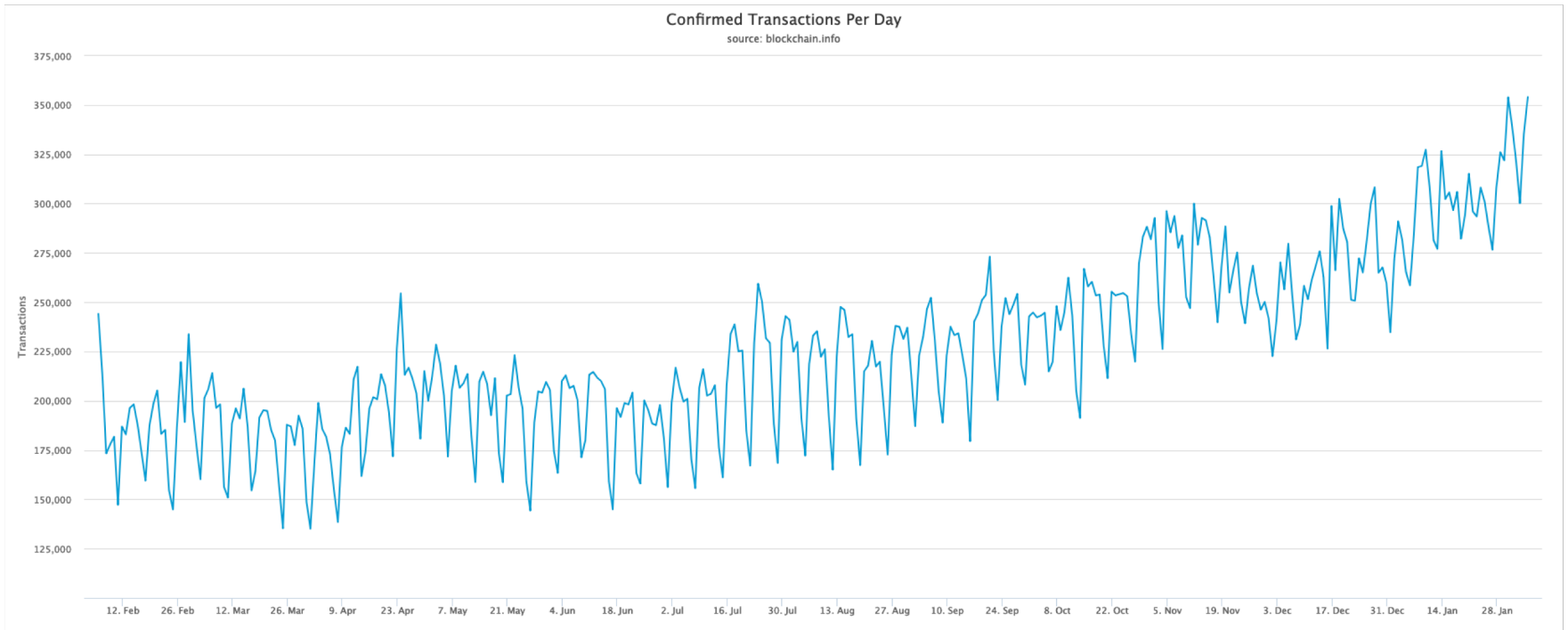
# Bitmain Ordos facility, Inner Mongolia



# Bitcoin mining pool distribution



# Bitcoin transactions



medium of exchange?

# Smart contracts

- Most financial service applications will need more than key-value storage
- Most blockchains (BTC, ETH) include a programming language
  - functions get executed on "commit" by nodes
- Example asset transfer (Alice wants to trade share coupons for bitcoins):
  - *hashlock*  $h$  prevents an asset from being transferred until the contract receives a matching secret  $s$ , where  $h = H(s)$
  - Alice creates a secret  $s$ ,  $h = H(s)$ , and publishes a contract on the coupon blockchain with hashlock  $h$  and timelock 48 hours in the future, ensuring the contract will transfer the coupons to Bob if Bob can produce  $s$  within 48 hours. If he cannot, the coupons will be refunded to Alice.
  - When Bob confirms that Alice's contract has been published on the coupon blockchain, he publishes a contract on the Bitcoin blockchain with the same hashlock  $h$  but with timelock 24 hours in the future, ensuring the contract will transfer the bitcoins to Alice if Alice can produce  $s$  within 24 hours. If she cannot, the bitcoins will be refunded to Bob.
  - When Alice confirms that Bob's contract has been published on the Bitcoin blockchain, she sends the secret  $s$  to Bob's contract, taking possession of the bitcoins, and revealing  $s$  to Bob.
  - Bob sends  $s$  to Alice's contract, acquiring the coupons and completing the swap.

# AWS SQL server vs. bitcoin

## AWS RDS server (m4.2xlarge)

- 2,100 SQL transactions/second
- \$3,521/year
- **Intel Xeon E5-2676 v3: 120 W**

## Bitcoin

- 3-7 transactions/second
- \$6,800 'all-in' cost per BTC
- 12.5 BTC per block reward
- 10 minutes per block
- → 657k blocks/year → \$4.46B
- 3.4 GW

	Assertion	Answer
Network	A significant number of participants will be transacting on the network (>100)	Agree/Yes <input type="checkbox"/>
	You don't trust the participants in the network and don't need/want to know them	Agree/Yes <input type="checkbox"/>
Performance	A limited amount of data needs to be stored for every transaction (a few fields)	Agree/Yes <input type="checkbox"/>
	The business process doesn't requires a high throughput (scalability)	Agree/Yes <input type="checkbox"/>
Business logic	The business logic is simple	Agree/Yes <input type="checkbox"/>
	Privacy of transactions is not an important feature	Agree/Yes <input type="checkbox"/>
	The system will be standalone, it doesn't need to access external data or be integrated in the IT legacy	Agree/Yes <input type="checkbox"/>
Consensus	No arbitrator shall be involved in case of a dispute	Agree/Yes <input type="checkbox"/>
	All participants can be involved in the validation of transactions (Vs only a group of known validators)	Agree/Yes <input type="checkbox"/>
	You need strict immutability of the record (no amend & cancel, even by admin)	Agree/Yes <input type="checkbox"/>



# Miracle cure vs. snake oil – public & private blockchain

## **Miracle cure (or at least good fit)**

### **(all private)**

- Distributed, semi-trusting users
- Limited ability to fund and administer common infrastructure
- Supply chain records
- Notary (time-stamped) services
  - non-repudiability (but limited time resolution)

## **Not FDA approved**

### **(mostly public)**

- Bitcoin, most digital currencies
- ICOs
- Consumer payments
- High-volume & low latency transactions (< minutes)
- Complex business logic

# The blockchain conundrum

- Public blockchains don't work all that well in practice
  - high cost
  - high risk
  - low performance
  - difficult governance (forks, ossification)
  - hard to balance privacy vs. prevention of illegal uses
- Private blockchains work
  - can avoid expensive consensus algorithms (no 51% problem)
  - can share computational resources (instead of paying a fee)
  - but if you have a trusted entity running the blockchain, why not run a database + cryptographically signed records?

# What makes systems hard in practice?

- Adversarial environment
  - attacker almost always has the advantage
    - has to find one flaw, you have to find all of them
  - particularly, if one cannot back out mistakes
- Near-100% uptime
- Unknown scaling
- Versioning and backward compatibility
  - no clear ability to upgrade
  - unknown dependencies
  - unclear governance (who gets to decide)

Leslie Lamport (1987): A distributed system is one in which the failure of a computer you didn't even know existed can render your own computer unusable.

# Cryptography is (relatively) easy, security is hard

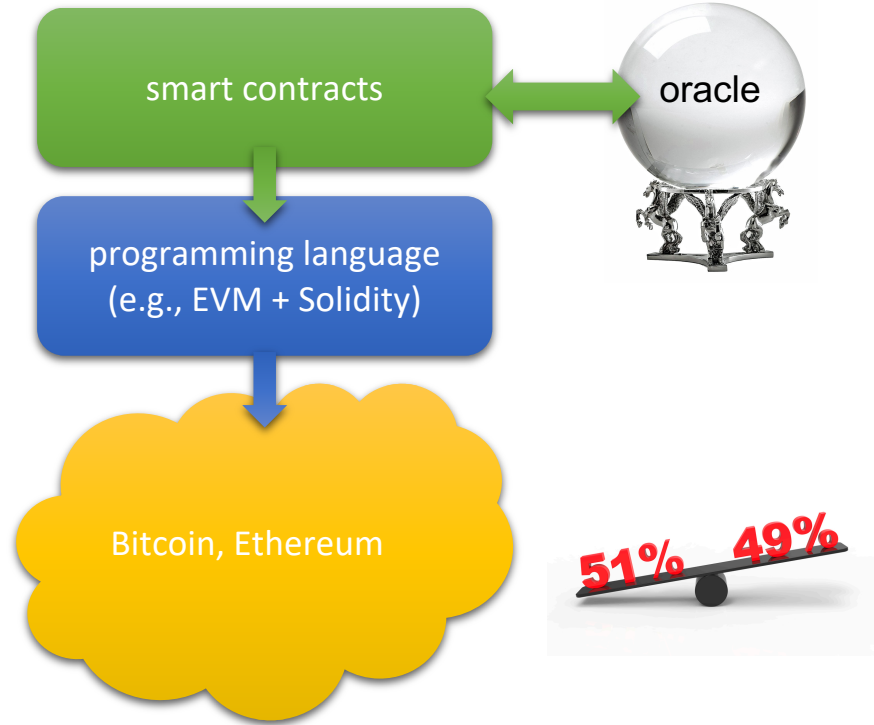


phishing



exchange

cyber attack  
fraud



# Security problems

## Same as all software systems

- Specification flaws
  - protocol timing, bid down, man-in-the-middle, ...
- Implementation flaws
  - in underlying system software
  - in application software
  - in configuration
- Credential theft or exposure
- Insider attacks
  - and other non-technical issues

## Specific to public blockchains

- Little legal recourse
- International
- No “backup”
- No “undo” (fund reversal)
- No intermediary (e.g., credit card charge-back)
- May not be able to recover credentials

# Limitations of computer science



- We do not know how to prove (most) specifications correct
  - People routinely find problems in security protocols years later
- Programming languages themselves are often buggy
- Distributed systems are much harder than centralized systems
  - “concurrency” – things can happen in various orderings
  - many more failure possibilities → impossibility results
- We depend on assumptions on the underlying system that may not be true
  - see Spectre & Meltdown
- Maintaining and configuring software is not well understood
  - dependencies
- Cryptographic key management is *logistically* hard



# Random examples

GONE —

## Digital exchange loses \$137 million as founder takes passwords to the grave

QuadrigaCX survivors try to hack encrypted laptop in hopes of accessing cold wallet.

DAN GOODIN - 2/2/2019, 11:40 AM

By Saturday, 18th June, the attacker managed to drain more than [3.6m ether](#) into a “child DAO” that has the same structure as The DAO. The price of ether dropped from over \$20 to under \$13.

Several people made attempts to split The DAO to prevent more ether from being taken, but they couldn't get the votes necessary in such a short time. Because the designers didn't expect this much money, all the ether was in a single address (bad idea), and we believe the attacker stopped voluntarily after hearing about the fork proposal (see below). In fact, that attack, or another similar one, could continue at any time.

The group found ways of hacking hardware wallets via four different methods; [supply chain attack](#), firmware vulnerability, side-chain attack, and chip-level vulnerability. All techniques required access to the actual device, so if your wallet has never left your possession...then you could still be at risk from a supply chain attack.



# Unalterable is maybe not that great an idea

Someone added images of child sexual abuse to an immutable blockchain ledger, the [BBC reported](#). The images were added to the Bitcoin Satoshi Vision (BSV) core ledger through the payment processing app Money Button.

“We have confirmed that was the case and we have banned the user responsible for creating those transactions,” Money Button wrote. “We believe it is important to be proactive about moderating content. Now that [Bitcoin SV has the ability to write large amounts of data to the blockchain](#), it is likely that criminals will continue to attempt to abuse this technology for illegal purposes.”



# My tentative questions & recommendations

- Can a simpler (less general) system do the same thing?
  - E.g., a digital notary service
- What other systems are connected to the blockchain and what effects can they have?
  - Eco system, not blockchain (e.g., exchanges, wallets, mining pools, ...)
- Governance and sustainability is more important than technical details
  - Who gets to do overrides when things go wrong?
  - Who decides and how when there are conflicts between stake holders?
- Speed kills – slow down execution and allow reversals
  - see Bangladesh Bank cyber heist
- What are the emergency brakes?
  - see autonomous cars (remote control) – autonomous driving is easy; it's the lack of braking that causes accidents
- What are the data privacy and accountability trade-offs?

# JPMorgan report 2019

"Blockchain solutions making a meaningful difference for banks are at least three to five years away," JPMorgan said.

On the contrary, the bank believes the true potential of blockchain lies in its capability to streamline and automate cumbersome banking processes — for instance, it says that trade finance, **which refers to monetary activities facilitating domestic and international trade**) will benefit the most. The industry is worth \$2 trillion and accounts for 15% of global trade, according to the report.

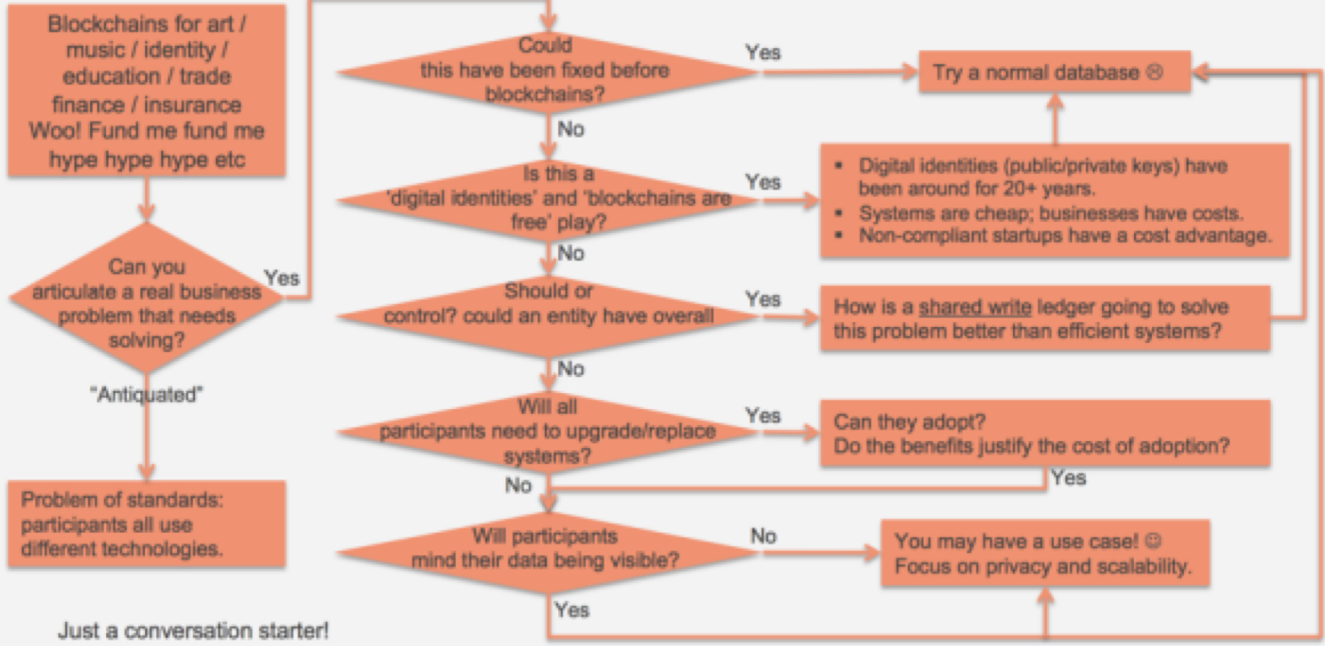
# Conclusion

- Blockchain offers a variation of an old computing abstraction (database)
- Important to distinguish public vs. private blockchains
- Useful general-purpose service for mid-to-low trust interaction
- Distributed, decentralized, limited trust → at cost of energy, privacy
- But many of the permissioned blockchain problems can be solved with less effort and complexity
  - Does not ensure truth, but may ensure non-repudiation
  - But may offer convenient standard and infrastructure ("BaaS")
- May assume more maturity of computer science than realistic
  - More potential security issues, not fewer

# Useful not-too-technical tutorials and opinions

- NIST, "Blockchain Technology Overview", NISTIR 8202, Oct. 2018  
<https://doi.org/10.6028/NIST.IR.8202>
- W. Stallings, "A Blockchain Tutorial", Cisco *Internet Protocol Journal*, Nov. 2017.
- Maurice Herlihy, "Blockchains From a Distributed Computing Perspective," *Communications of the ACM (CACM)*, Feb. 2019.
- Bruce Schneier, "There's no good reason to trust blockchain technology," *Wired*, Feb. 6, 2019.

## BLOCKCHAIN CHEAT SHEET v0.1



Just a conversation starter!



[www.bitsonblocks.net](http://www.bitsonblocks.net)

# DHS model

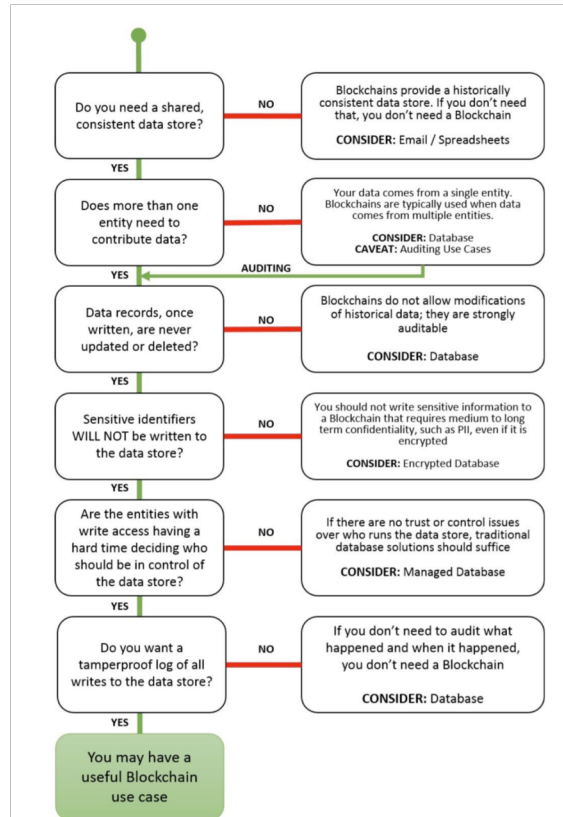


Figure 6 - DHS Science & Technology Directorate Flowchart

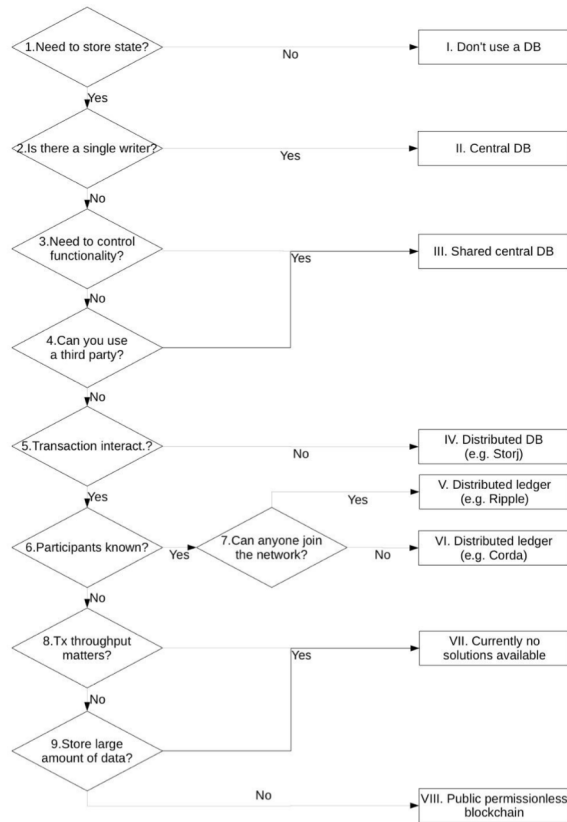
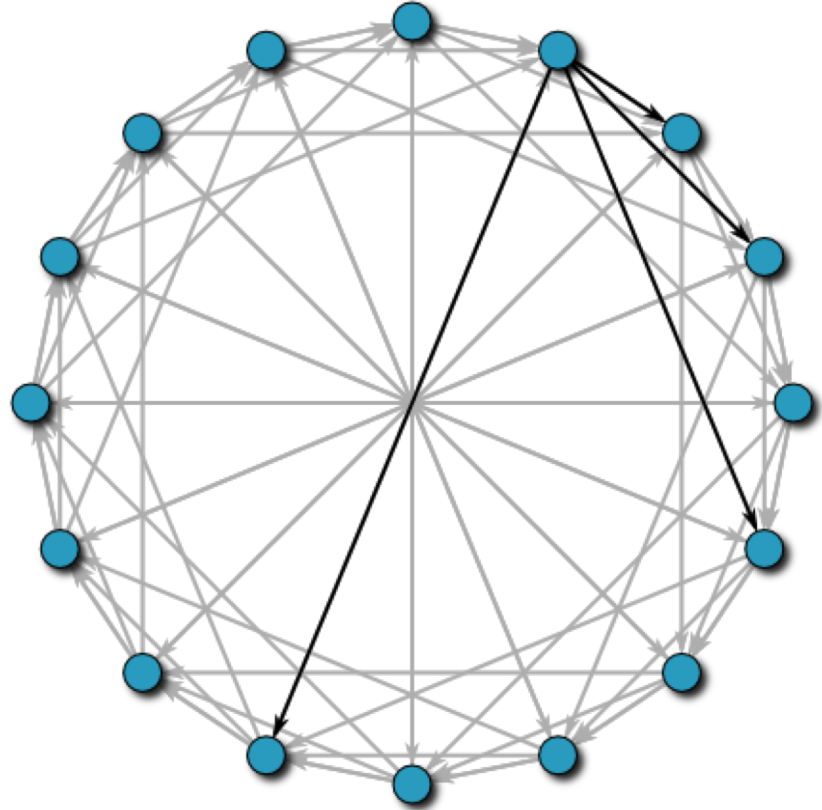


Fig. 2. Scheme for determining which type of database is appropriate

# Predecessor: peer-to-peer systems

key – value mapping  
("noSQL")  
distributed storage  
but: no inherent protection against





# Bruce Schneier on private blockchains

Private blockchains are completely uninteresting. (By this, I mean systems that use the blockchain data structure but don't have the above three elements.) In general, they have some external limitation on who can interact with the blockchain and its features. These are not anything new; they're distributed append-only data structures with a list of individuals authorized to add to it. Consensus protocols have been studied in distributed systems for more than 60 years. Append-only data structures have been similarly well covered. They're blockchains in name only, and—as far as I can tell—the only reason to operate one is to ride on the blockchain hype.

# Trust models

- *Liars and Outliers* (Schneier, 2012):
  - morals
  - reputation
  - institutions → "laws formalize reputation" + sanctions + incentives (credit score)
  - security systems (locks, fences, alarm systems, audit systems, ...)
- *Blockchain and the New Architecture of Trust* (Werbach, 2018):
  - peer-to-peer trust
  - leviathan trust (institutional)
    - contracts
  - intermediary trust
    - credit cards, escrow, ...
  - distributed trust
    - blockchain (maybe also online review systems)

# Practical CS: The power of a few service abstractions

- Key-value store → noSQL, file system, AWS S3
- Database → linked tables with predicates
- Process → protection domain → containers (Docker, Kubernetes)
- Virtual machine
- Queue → AWS SQS, work queues
- Messaging → email, SMS, EDI
- Query-Response (API) → HTTP
- Serialization: data structures → portable objects (ASN.1, XML, JSON, ...)
- Pattern matching
- Public key systems