



Provisions Privacy Preserving Proof of Solvency

Jeremy Clark

A photograph of a modern glass skyscraper at dusk. The building's windows are illuminated from within, and the sky is a deep blue. An orange arrow points from the text 'Where I am' to a specific window on the building.

Where I am

Jeremy Clark


- Assistant Professor at the Concordia Institute for Information Systems Engineering (CIISE) in Montreal
- PhD from the University of Waterloo (2009)
- Team of six graduate students
- Numerous academic papers on Bitcoin, including one of the earliest
- Contributed to courses (Princeton, MIT) & textbook on Bitcoin
- Organized/chaired academic workshop on Bitcoin
- Testified to Canadian Senate on Bitcoin

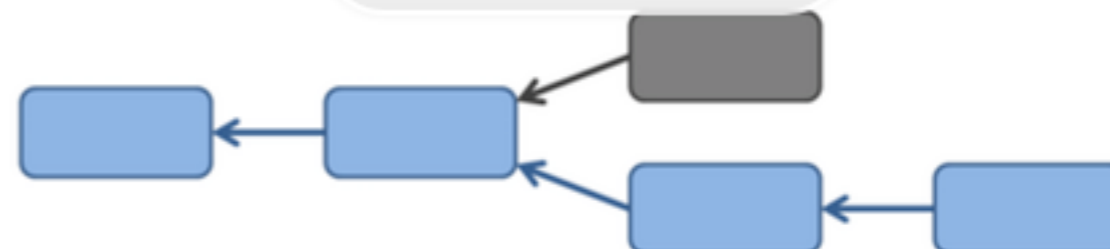


Bitcoin and Cryptocurrency Technologies

There's a lot of excitement about Bitcoin, but also a lot of confusion about what Bitcoin is and how it works. We're offering this course focusing on the computer science behind Bitcoin to help cut through the hype and get to the core of what makes Bitcoin unique.



Watch Intro Video 



About the Course

To really understand what is special about Bitcoin, we need to understand how it works at a technical level. We'll address the important questions about Bitcoin, such as:

How does Bitcoin work? What makes Bitcoin different? How secure are your Bitcoins? How anonymous are Bitcoin users? What determines the price of Bitcoins? Can cryptocurrencies be regulated? What might the future hold?

After this course, you'll know everything you need to be able to separate fact from fiction when reading claims about Bitcoin and other cryptocurrencies. You'll have the conceptual foundations you need to engineer secure software that interacts with the Bitcoin network. And you'll be able to integrate ideas from Bitcoin in your own


Sessions


September 4, 2015 - April 22, 2016

[Go to Course](#)

Course at a Glance

 7 weeks of study

 3-6 hours/week

 English

Bitcoin and Cryptocurrency Technologies

Arvind Narayanan, Joseph Bonneau, Edward Felten,
Andrew Miller, Steven Goldfeder

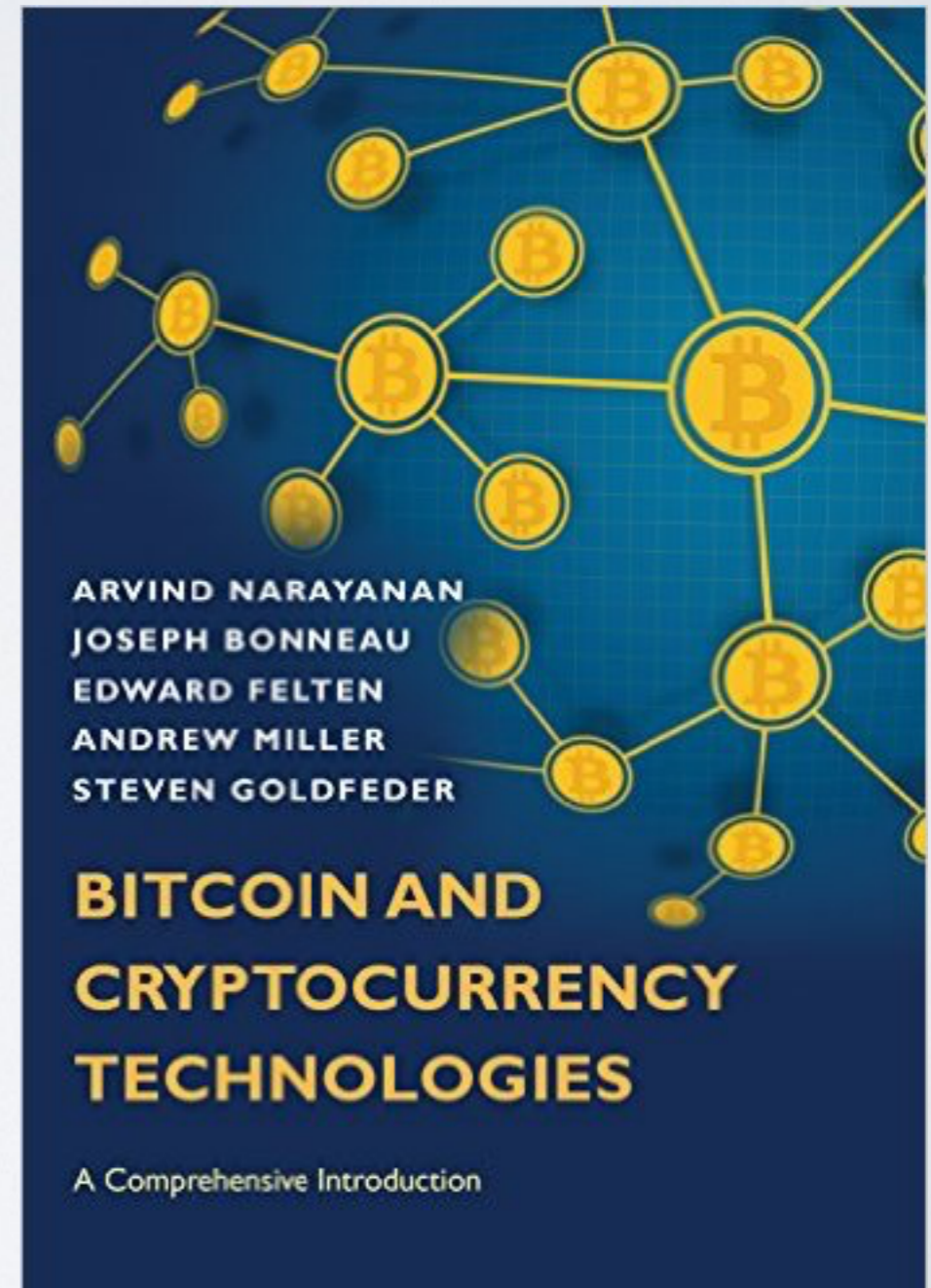
with a preface by Jeremy Clark

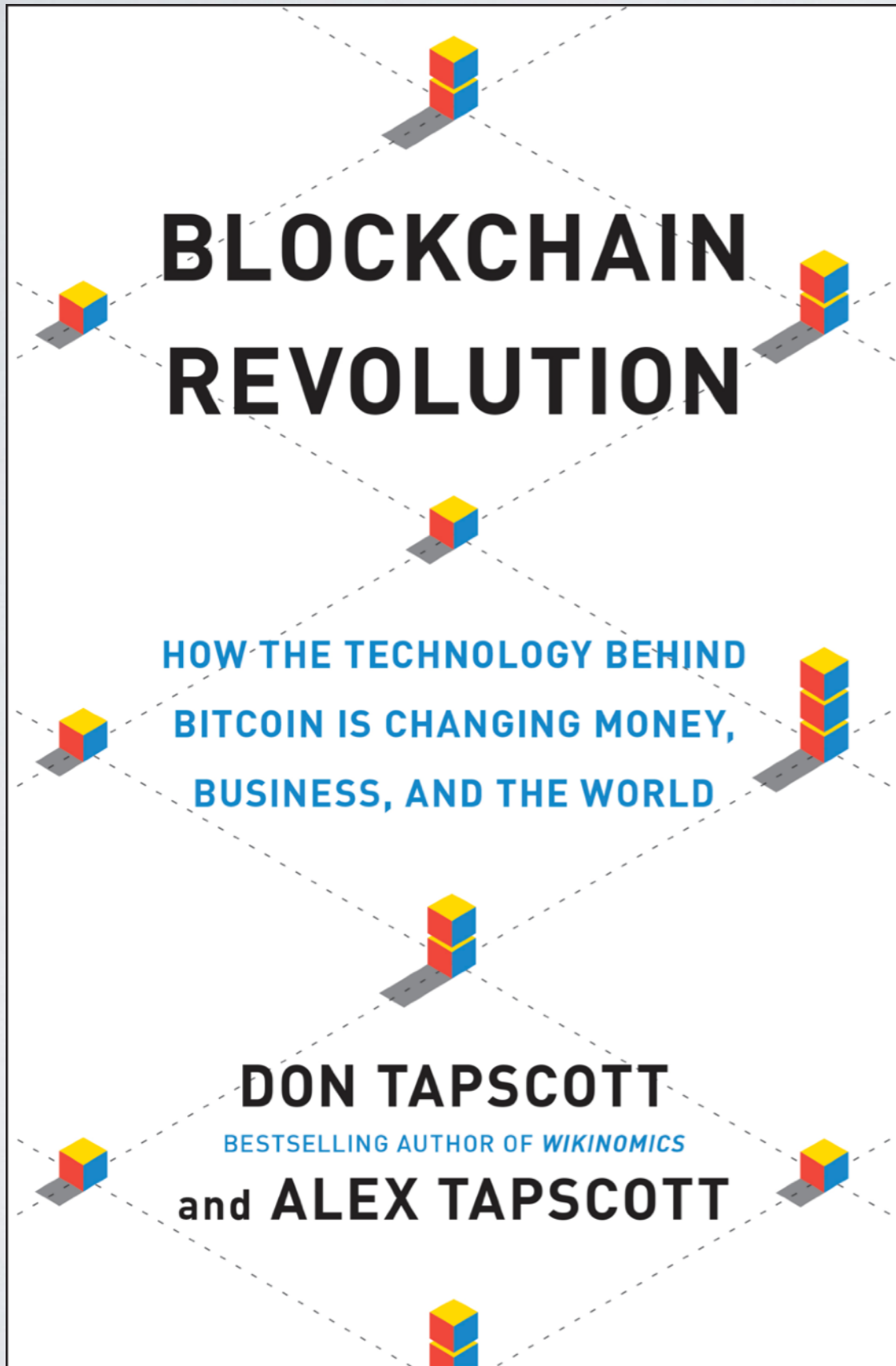
Draft — Feb 9, 2016

Feedback welcome! Email bitcoinbook@lists.cs.princeton.edu

For the latest draft and supplementary materials including programming assignments,
see our [Coursera course](#).

The official version of this book will be published by Princeton University Press in 2016.
If you'd like to be notified when it's available, please sign up [here](#).





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DealB%k

WITH FOUNDER ANDREW ROSS SORKIN

Bitcoin Technology Piques Interest on Wall St.

By NATHANIEL POPPER | AUG. 28, 2015

Fredrik Voss is overseeing work at Nasdaq to use the technology behind Bitcoin to make trading faster and cheaper. Sasha Maslov for The New York Times

Most people still think of Bitcoin as the virtual currency used by drug dealers and shadowy hackers looking to evade the authorities.



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Skry

点融网
Dianrong.com

SORAMITSU
ソラミツ

symbiont

THOMSON REUTERS

Case Study: Proof of Solvency

Joint Work

Gaby Dagher - Boise State University

Benedikt Bünz - Stanford

Joe Bonneau - Stanford & EFF

Dan Boneh - Stanford

Exchange Services

Provide mechanisms for depositing Bitcoin and fiat currency into an account

Provide an order book where you can buy/sell Bitcoin

Trades are cleared/settled automatically

You can withdrawal at any time, but for Bitcoin, users like keeping money on an exchange

Last updated: February 28, 2014 6:35 pm

Bitcoin exchange Mt Gox files for bankruptcy protection

By Ben McLannahan in Tokyo



A Bitcoin trader holds a placard to protest against Mt Gox in Tokyo

The Bitcoin exchange at the centre of a \$480m heist has filed for bankruptcy protection, in a move that leaves thousands of virtual-currency investors in limbo.

Events unfolding at Tokyo-based Mt Gox, once the dominant platform for trading and storing Bitcoin, had drawn increasing attention over the past three weeks, as a freeze on withdrawals led to a shutdown of trading and uncertainty over the whereabouts of the company's chief executive, Mark Karpeles.

But on Friday evening Mr Karpeles surfaced to announce that Mt Gox would seek a court-led restructuring, with debts of Y6.5bn (\$64m) and assets of Y3.9bn. About 750,000 Bitcoins belonging to customers and 100,000 belonging to the company had been lost, he said, in a theft detected on February 24.

Some virtual currency enthusiasts say that the example set by Mt Gox should encourage authorities to tighten their surveillance of this essentially unregulated landscape.

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BUSINESS DAY

Apparent Theft at Mt. Gox Shakes Bitcoin World

By **NATHANIEL POPPER** and **RACHEL ABRAMS** FEB. 25, 2014

The most prominent Bitcoin exchange appeared to be on the verge of collapse late Monday, raising questions about the future of a volatile marketplace.

On Monday night, a number of leading Bitcoin companies jointly announced that Mt. Gox, the largest exchange for most of Bitcoin's existence, was planning to file for bankruptcy after months of technological problems and what appeared to have been a major theft. A document circulating widely in the Bitcoin world said the company had lost 744,000 Bitcoins in a theft that had gone unnoticed for years. That would be about 6 percent of the 12.4 million Bitcoins in circulation.

Theft Unnoticed for Years

The New York Times | <http://nyti.ms/1fo7M0A>

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Bitcoin Savings & Trust (1834303 \$)
MyBitcoin Theft (1110544 \$)
Allinvain Theft (502750.20 \$)
July 2012 Bitcoinica Theft (305200 \$)
Bitfloor Theft (248088 \$)
Linode Hacks (230468 \$)
Bitomat.pl Loss (236000 \$)
Tony Silk Road Scam (150000 \$)
Stefan Thomas Loss (128000 \$)
Just-Dice.com Incident (121000 \$)

Cdecker Theft (113894 \$)
May 2012 Bitcoinica Hack (91306.46 \$)
XBTGuild Incident (58737 \$)
Bit LC Theft (51000 \$)
Bitcoin7 Hack (50000 \$)
June 2011 Mt. Gox Incident (46970.91 \$)
BTC-E Hack (42000 \$)
2012 Trojan (38000 \$)
Mooncoin Theft (24000 \$)
Betcoin Theft (15509 \$)

Proof of Solvency

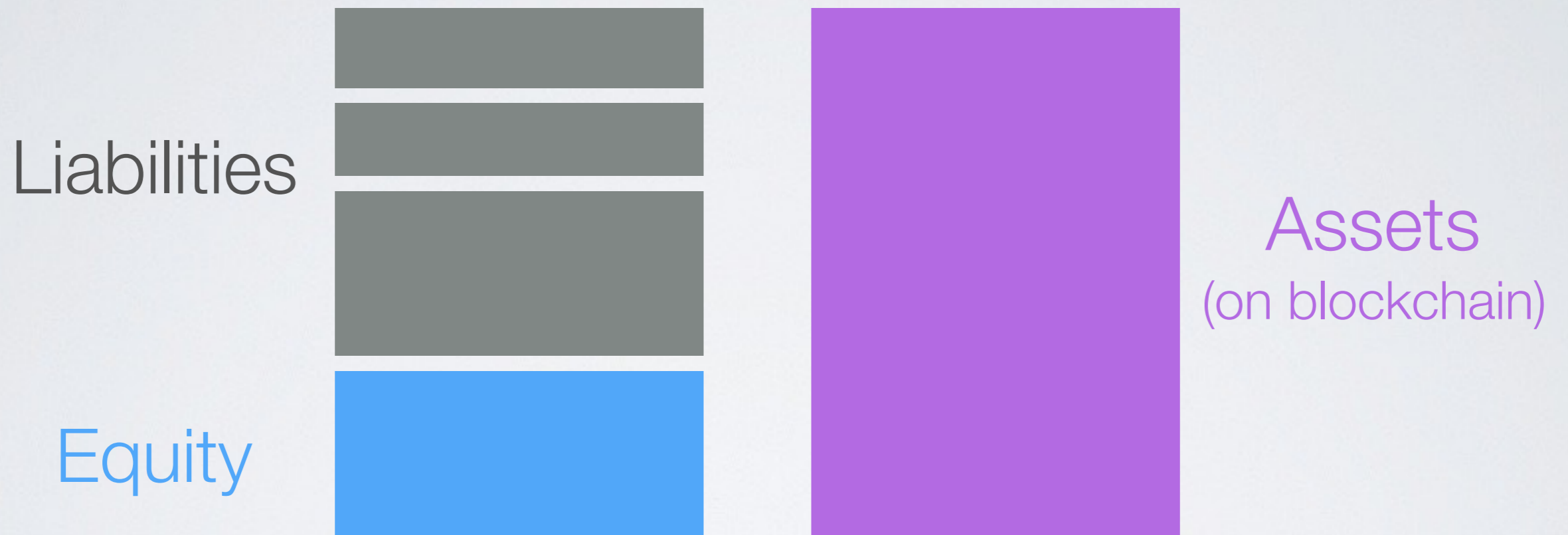
We cannot stop thefts

We can require exchanges' solvency to be proven

With some crypto, we can even prove solvency without revealing:

- Customer information
- Exchanges' total holdings
- Exchanges' addresses

Balance Sheet



Balance Sheet



Solvent? Proof for private corporations directly to the customers with no auditors (P2P auditing)

Primitives

Special “encryption”:

- Given $[[x]]$, $[[y]]$: compute $[[x + y]]$

Zero knowledge proofs:

- Given $[[x]]$, prove it decrypts to x
- Given $[[x]]$, prove x is a positive number
- Given $[[x]]$, where x is a public key, prove knowledge of the signing private key

Precisely: Pedersen commitments w/ basic non-interactive sigma protocols

Sketch

[[Assets]]

Sketch

[[Assets]] [[Liabilities]]

Sketch

[[Assets]] - [[Liabilities]]

[[Assets - Liabilities]]

Sketch

[[Assets]] - [[Liabilities]]

[[Assets - Liabilities]]

[[0]]

Sketch

[[Assets]] - [[Liabilities]]

[[Assets - Liabilities]]

[[0]]



[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	

Public

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	
	[[Liabil]]	Total

Public

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	
	[[Liabil]]	Total

Public

Bob only:

rand[[Bob]]	rand[[100]]
-------------	-------------

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	

Public

Bob only:

rand _{[[Bob]]}	rand _{[[100]]}
-------------------------	-------------------------

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[0]]	
[[Carol]]	[[25]]	

Public

Bob only:

rand _{[[Bob]]}	rand _{[[100]]}
-------------------------	-------------------------

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	
[[Eve]]	[[100]]	

Public

Bob only:

rand _{[[Bob]]}	rand _{[[100]]}
-------------------------	-------------------------

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	
[[Bob]]	[[100]]	
[[Carol]]	[[25]]	
[[Eve]]	[[-100]]	

Public

Bob only:

rand _{[[Bob]]}	rand _{[[100]]}
-------------------------	-------------------------

[[Liabilities]]

Alice	50
Bob	100
Carol	25

Private

[[Alice]]	[[50]]	ZKP ₊
[[Bob]]	[[100]]	ZKP ₊
[[Carol]]	[[25]]	ZKP ₊
[[Eve]]	[[100]]	

Public

Bob only:

rand _{[[Bob]]}	rand _{[[100]]}
-------------------------	-------------------------

[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₃]]	[[25]]
[[PK ₄]]	[[100]]
[[PK ₁]]	[[50]]

Public

[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₃]]	[[25]]
[[PK ₄]]	[[100]]
[[PK ₁]]	[[50]]

Public



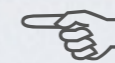
[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₃]]	[[25]]
[[PK ₄]]	[[100]]
[[PK ₁]]	[[50]]

Public



ZKP: know SK₂ that corresponds to PK₂ inside of [[PK₂]]



ZKP: know SK₄ that corresponds to PK₄ inside of [[PK₄]]

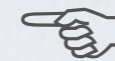
[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₃]]	[[25]]
[[PK ₄]]	[[100]]
[[PK ₁]]	[[50]]

Public



ZKP: know SK₂ that corresponds to PK₂ inside of [[PK₂]]



ZKP: know SK₄ that corresponds to PK₄ inside of [[PK₄]]

[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₃]]	[[25]]
[[PK ₄]]	[[100]]
[[PK ₁]]	[[50]]

Public

[[Assets]]

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[PK ₂]]	[[75]]
[[PK ₄]]	[[100]]

Public

$$\begin{aligned} & [[\text{Assets}]] \\ & = [[75]] + [[100]] \end{aligned}$$

[[Assets]] (Method 2)

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[Assets]] (Method 2)

PK ₁	50
PK ₂	75
PK ₃	25
PK ₄	100

Public
(Blockchain)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[0]]
[[1]]
[[0]]
[[1]]

Selection

[[0]]	[[0]]
[[SK ₂]]	[[75]]
[[0]]	[[0]]
[[SK ₄]]	[[100]]

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[0]]
[[1]]
[[0]]
[[1]]

Selection

[[0]]	[[0]]
[[SK ₂]]	[[75]]
[[0]]	[[0]]
[[SK ₄]]	[[100]]

ZKP: Each is 0 or 1

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[0]]
[[1]]
[[0]]
[[1]]

Selection

[[0]]	[[0]]
[[SK ₂]]	[[75]]
[[0]]	[[0]]
[[SK ₄]]	[[100]]

Commitment
Consistent

$$\text{ZKP: } [[X]], [[\text{bit}]] \rightarrow [[X]]^{\text{bit}} = [[X * \text{bit}]]$$

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[0]]
[[1]]
[[0]]
[[1]]

Selection

[[0]]	[[0]]
[[SK ₂]]	[[75]]
[[0]]	[[0]]
[[SK ₄]]	[[100]]

Proof of
Knowledge

ZKP: know SK_i for all [[SK_i]] and [[0]]

[[Assets]] (Method 2)

[[SK ₁]]	[[50]]
[[SK ₂]]	[[75]]
[[SK ₃]]	[[25]]
[[SK ₄]]	[[100]]

Public

[[0]]
[[1]]
[[0]]
[[1]]

Selection

[[0]]	[[0]]
[[SK ₂]]	[[75]]
[[0]]	[[0]]
[[SK ₄]]	[[100]]

[[Assets]]
= [[75]] + [[100]]

Recall

[[Assets]] - [[Liabilities]]

[[Assets - Liabilities]]

[[0]]



Recall

[[Assets]] - [[Liabilities]] - [[Equity]]

[[Assets - Liabilities - Equity]]

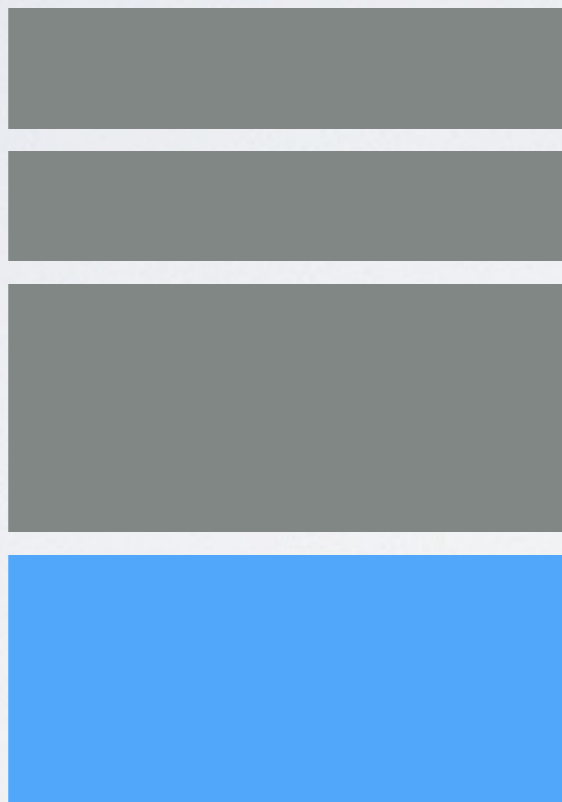
[[0]]

ZKP+

Verifiably decrypt

0

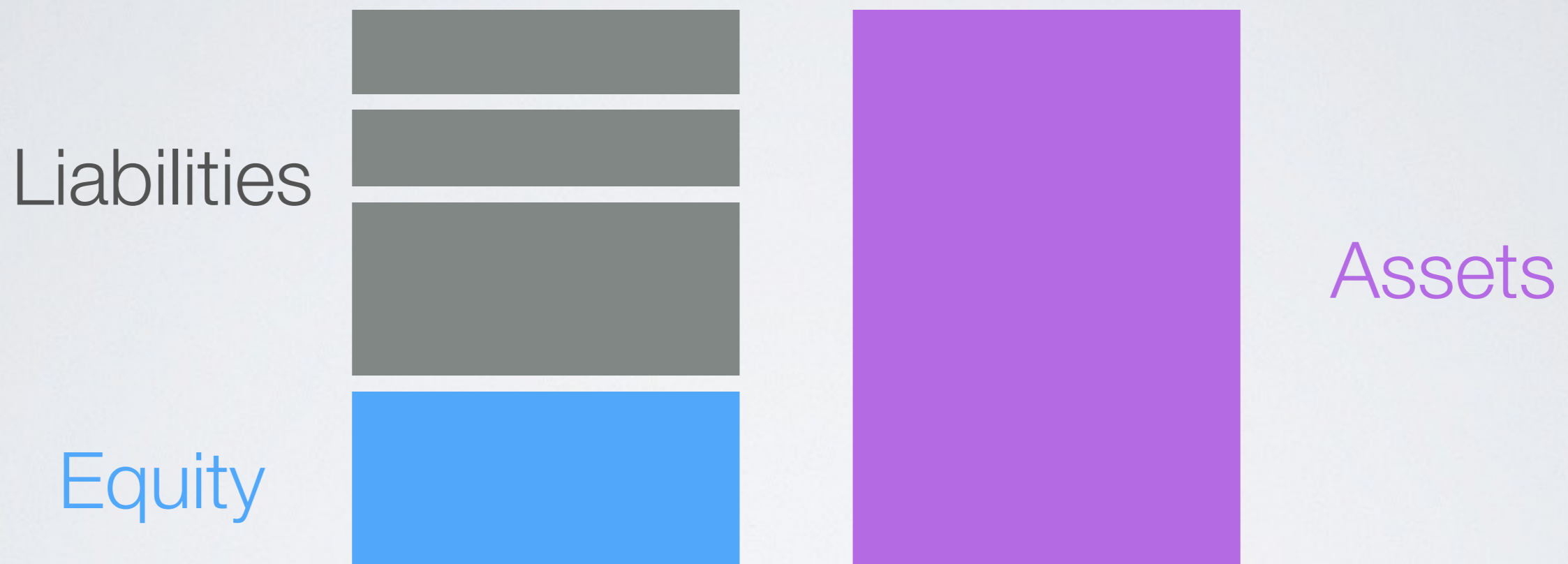
Liabilities



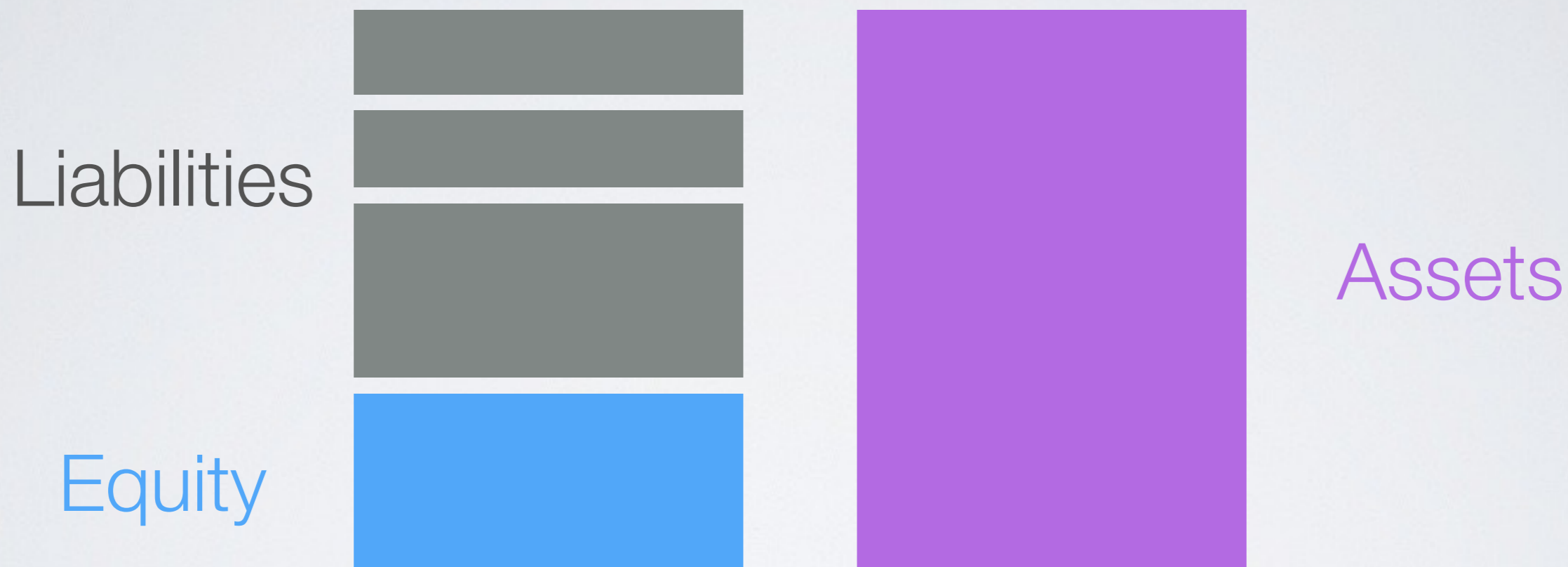
Equity



Assets



Liabilities: customers can check correct inclusion of their liabilities in a total “encrypted” amount



Liabilities: everyone can check that no listed encrypted liability is a negative number



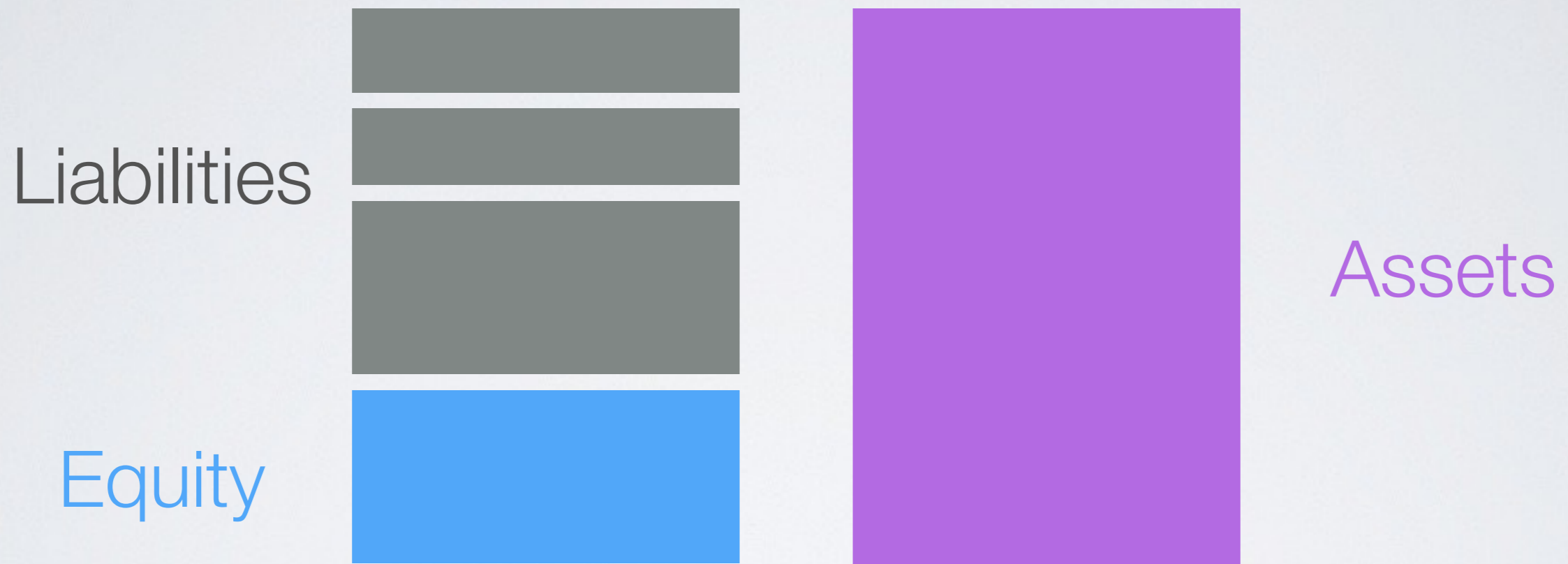
Assets

Equity: encrypted amount that is zero or positive number

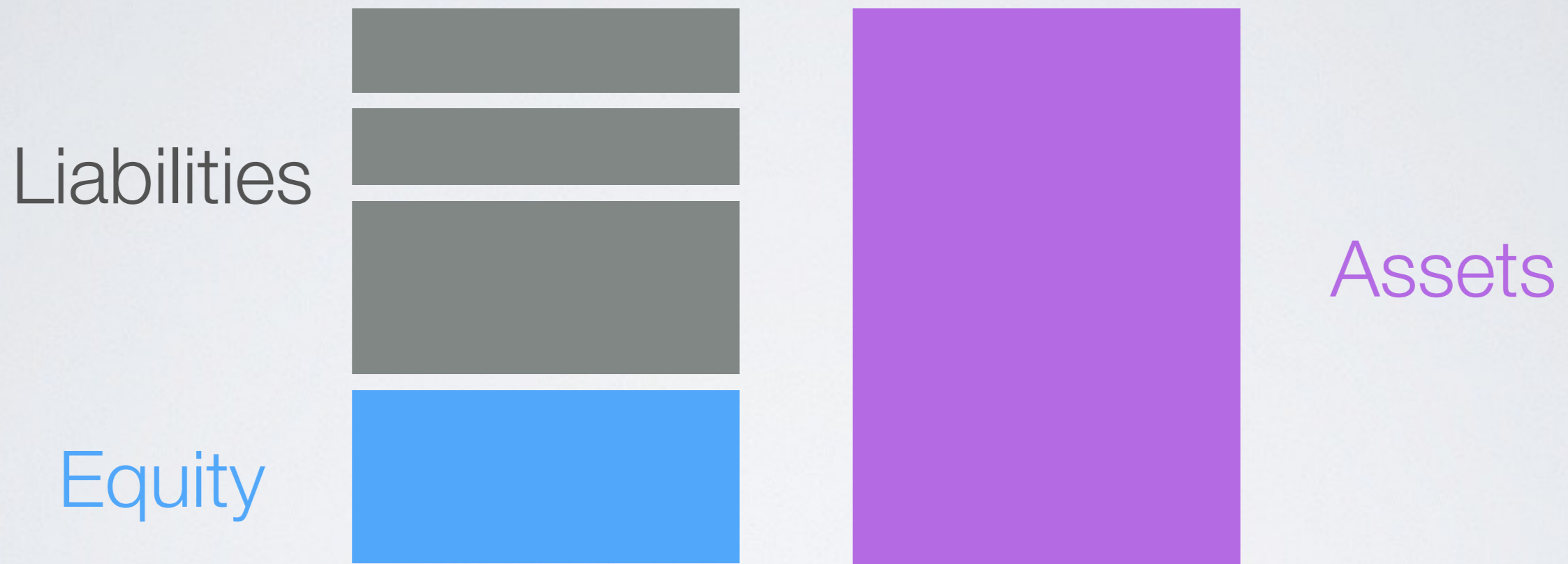


Assets

Assert an encrypted amount of total assets owned on a blockchain



Prove ownership of assets totalling this amount (by knowledge of signing key) without specifying the set



Show: $[[\text{Assets}]] - [[\text{Liabilities}]] - [[\text{Equity}]] = 0$

Remarks

Proof of liability is a bit more complicated to hide the number addresses held by the exchange:

1. Exchange commits to bit vector of owned addresses
2. ZKP it is a bit vector
3. Multiplies it in to vector of public keys and proves knowledge of each
4. Multiplies *the same* vector into a vector of balances, adds them

Implementation

- I take zero credit for this :)
- Proof of Assets: Anonymity set of 500K
 - 10s of minutes to construct proof
 - 1 hour to verify
 - 1 GB proof size
- Proof of Liabilities: 1M users
 - 2 hours to construct
 - 5 GB

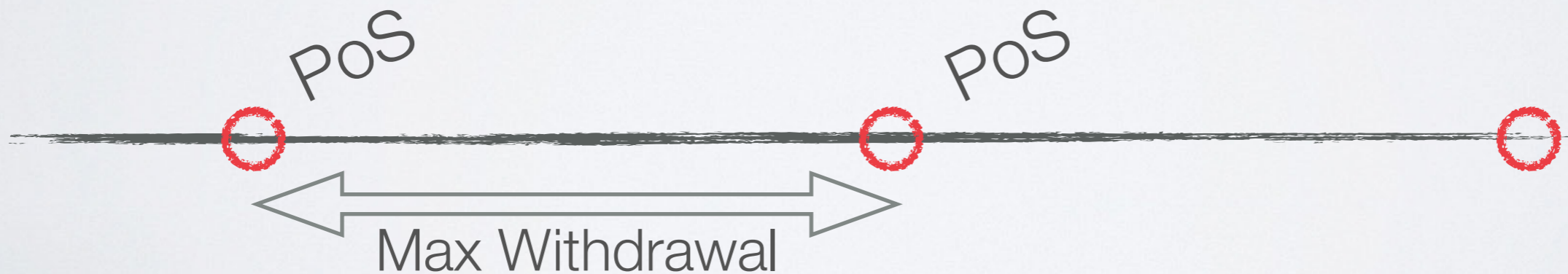
Limitations

- Proof of solvency is “detection” not “prevention”
- Multiple insolvent exchanges might collude to pool their resources together -> see paper
- Proof of Assets can only include transactions that are redeemable by a known public key

Idea: Limited Liability

1) Proof of Solvencies — snapshot in time

2) Bitcoin covenants — slow theft down





Questions?

@PulpSpy