

# An Empirical Analysis of Privacy in the Lightning Network

**George Kappos** <sup>1</sup>   **Haaroon Yousaf** <sup>1</sup>   Ania M. Piotrowska <sup>1,2</sup>   Sanket Kanjalkar <sup>3</sup>

Sergi Delgado-Segura <sup>1,5</sup>   Andrew Miller <sup>3,6</sup>   Sarah Meiklejohn <sup>1</sup>

<sup>1</sup> University College London

<sup>2</sup> Nym Technologies

<sup>3</sup> University of Illinois Urbana-Champaign

<sup>5</sup> PISA Research

<sup>6</sup> IC3

## Evaluating User Privacy in Bitcoin

Elli Androulaki<sup>1</sup>, Ghassan O. Karame<sup>2</sup>, Marc Roeschlin<sup>1</sup>,  
Tobias Scherer<sup>1</sup>, and Srdjan Capkun<sup>1</sup>

## A Fistful of Bitcoins: Characterizing Payments Among Men with No Names

Sarah Meiklejohn Marjori Pomarole Grant Jordan  
Kirill Levchenko Damon McCoy<sup>†</sup> Geoffrey M. Voelker Stefan Savage  
University of California, San Diego George Mason University<sup>†</sup>

## An Analysis of Anonymity in the Bitcoin System

Fergal Reid  
Clique Research Cluster  
University College Dublin, Ireland  
fergal.reid@gmail.com

Martin Harrigan  
Clique Research Cluster  
University College Dublin, Ireland  
martin.harrigan@ucd.ie

## Quantitative Analysis of the Full Bitcoin Transaction Graph

Dorit Ron and Adi Shamir

## A Traceability Analysis of Monero's Blockchain

April 17, 2017

Amrit Kumar  
National University of Singapore  
amrit@comp.nus.edu.sg

Shruti Tople  
National University of Singapore  
shruti90@comp.nus.edu.sg

Clément Fischer  
National University of Singapore  
cfischer@comp.nus.edu.sg

Prateek Saxena  
National University of Singapore  
prateeks@comp.nus.edu.sg

## An Empirical Analysis of Anonymity in Zcash

*George Kappos, Haaron Yousaf, Mary Maller, and Sarah Meiklejohn*  
University College London  
{georgios.kappos.16,h.yousaf,mary.maller.15,s.meiklejohn}@ucl.ac.uk

## Tracing Transactions Across Cryptocurrency Ledgers

*Haaron Yousaf, George Kappos, and Sarah Meiklejohn*  
University College London  
{h.yousaf,g.kappos,s.meiklejohn}@ucl.ac.uk

## On Scaling Decentralized Blockchains (A Position Paper)

Kyle Croman<sup>0,1</sup>, Christian Decker<sup>4</sup>, Ittay Eyal<sup>0,1</sup>, Adem Efe Gencer<sup>0,1</sup>, Ari Juels<sup>0,2</sup>,  
Ahmed Kosba<sup>0,3</sup>, Andrew Miller<sup>0,3</sup>, Prateek Saxena<sup>6</sup>, Elaine Shi<sup>0,1</sup>, Emin Gün  
Sirer<sup>0,1</sup>, Dawn Song<sup>0,5</sup>, and Roger Wattenhofer<sup>4</sup>

<sup>0</sup> Initiative for CryptoCurrencies and Contracts (IC3)

<sup>1</sup> Cornell   <sup>2</sup> Jacobs, Cornell Tech   <sup>3</sup> UMD   <sup>4</sup> ETH   <sup>5</sup> Berkeley   <sup>6</sup> NUS

## On the Security and Performance of Proof of Work Blockchains

Arthur Gervais  
ETH Zurich, Switzerland  
arthur.gervais@inf.ethz.ch

Vasileios Glykantzis  
ETH Zurich, Switzerland  
glykantv@student.ethz.ch

Ghassan O. Karame  
NEC Laboratories, Europe  
ghassan.karame@neclab.eu

Hubert Ritzdorf  
ETH Zurich, Switzerland  
hubert.ritzdorf@inf.ethz.ch

Karl Wüst  
ETH Zurich, Switzerland  
kwuest@student.ethz.ch

Srdjan Čapkun  
ETH Zurich, Switzerland  
srdjan.capkun@inf.ethz.ch

# The Bitcoin Lightning Network: Scalable Off-Chain Instant Payments

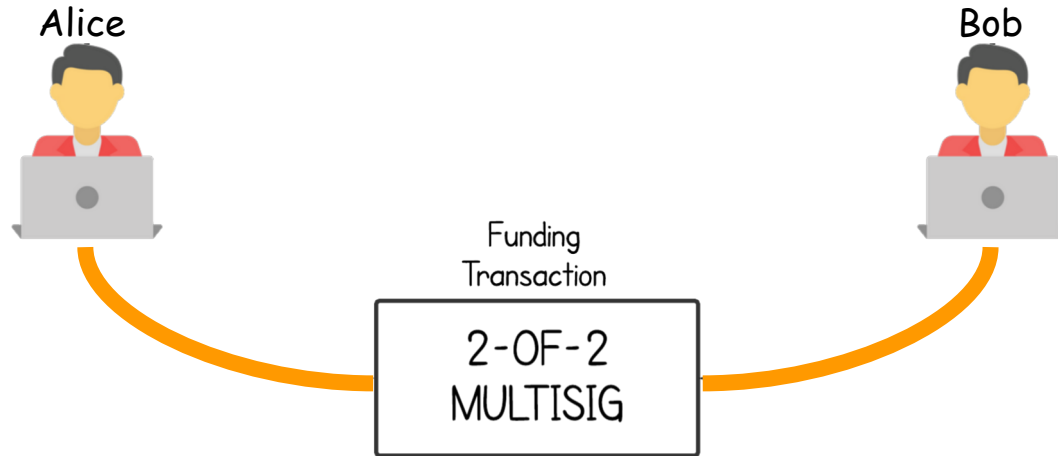
Joseph Poon

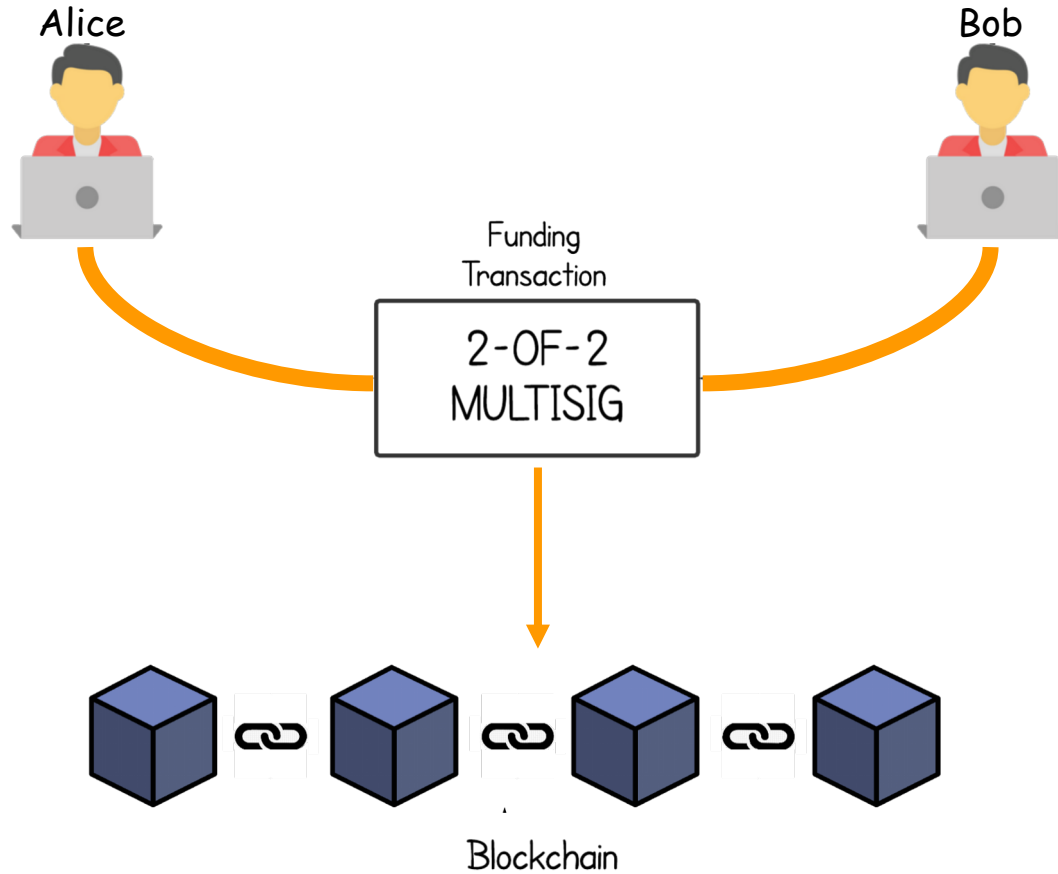
[joseph@lightning.network](mailto:joseph@lightning.network)

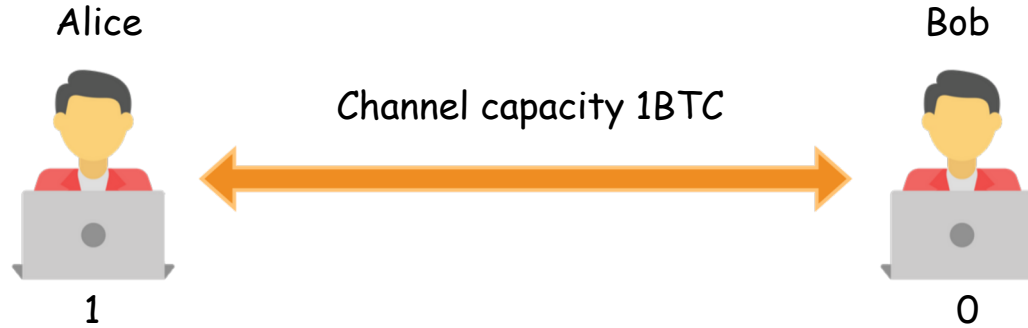
Thaddeus Dryja

[rx@awsomnet.org](mailto:rx@awsomnet.org)

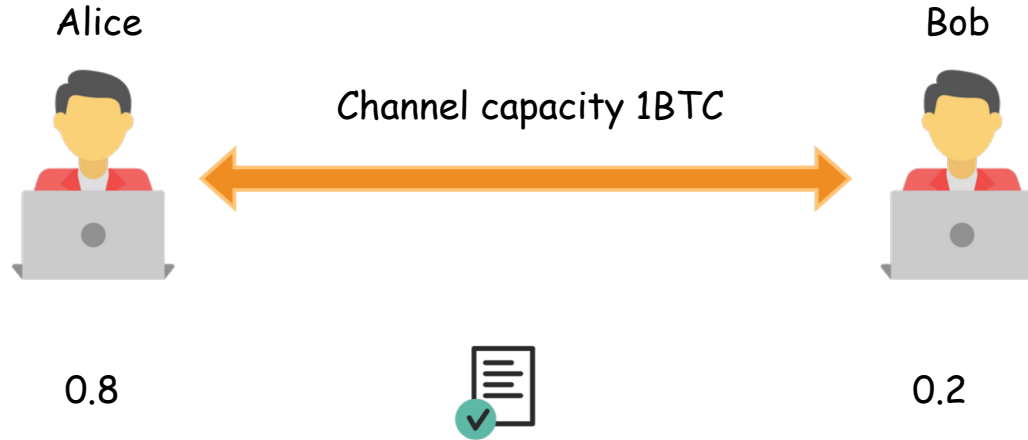






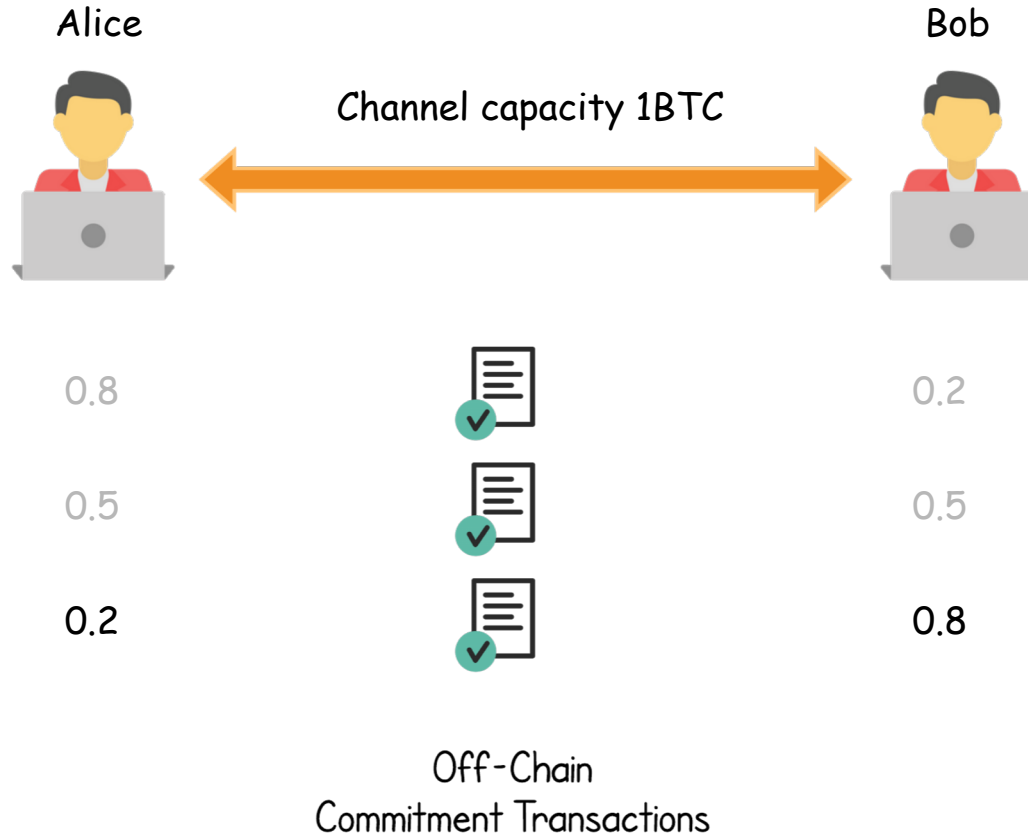




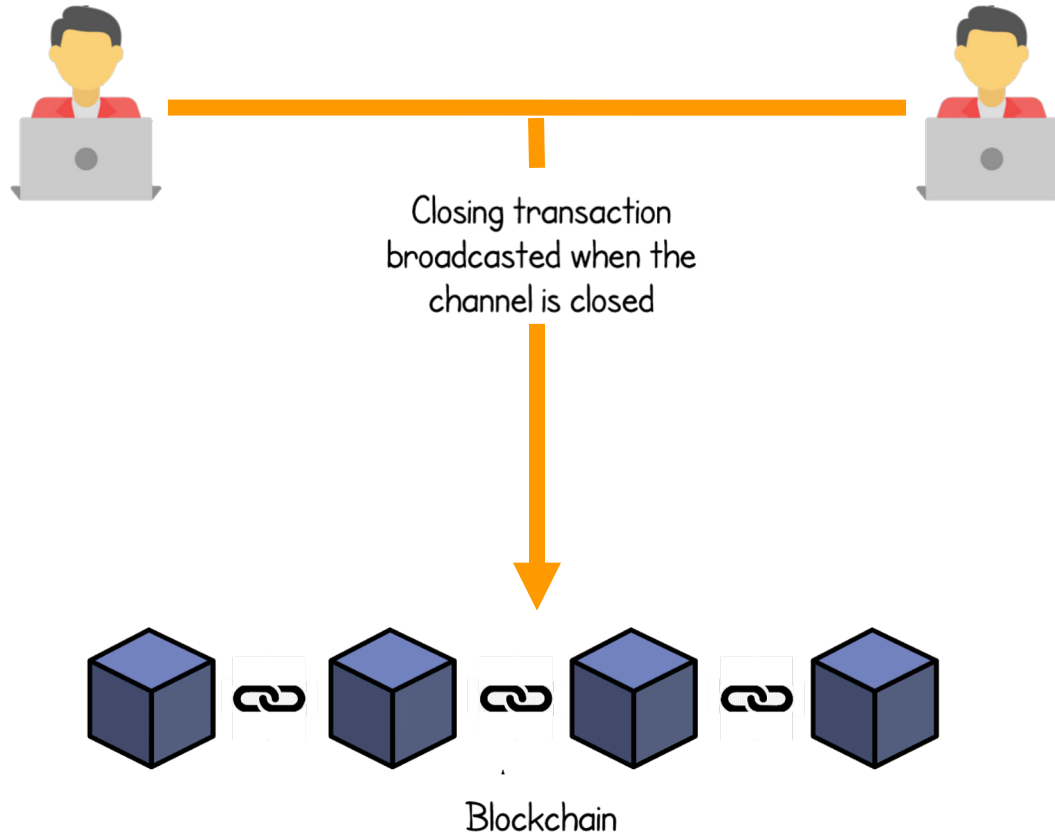


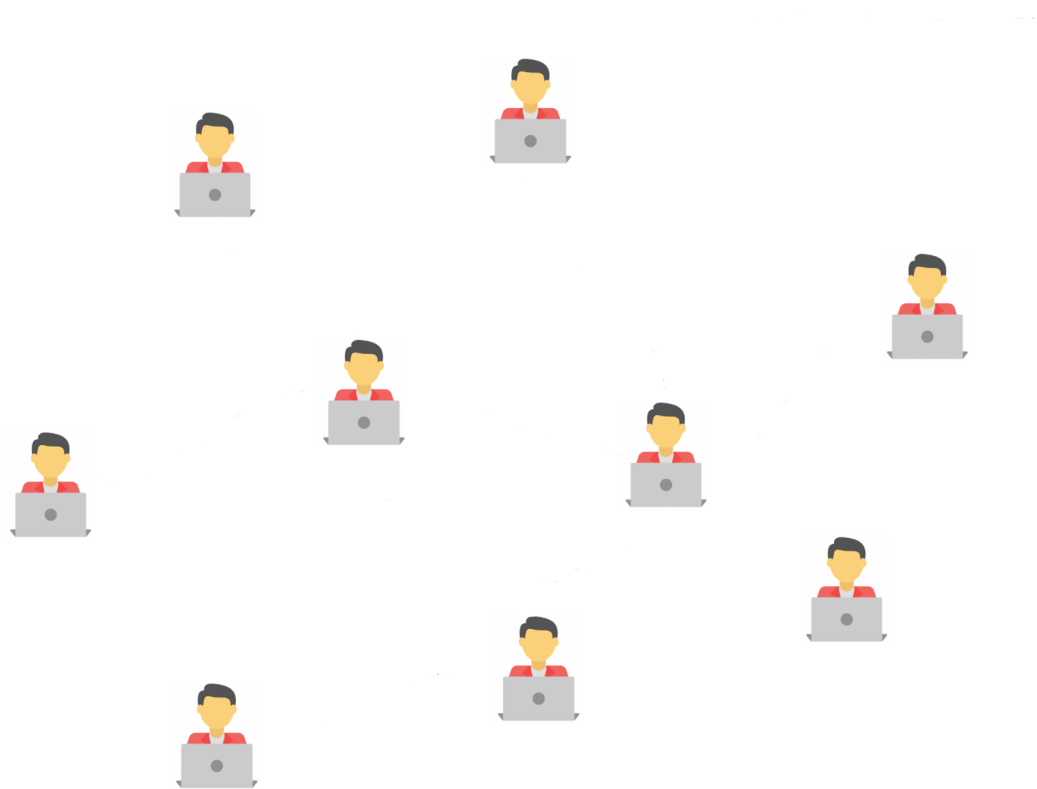
Off-Chain  
Commitment Transactions

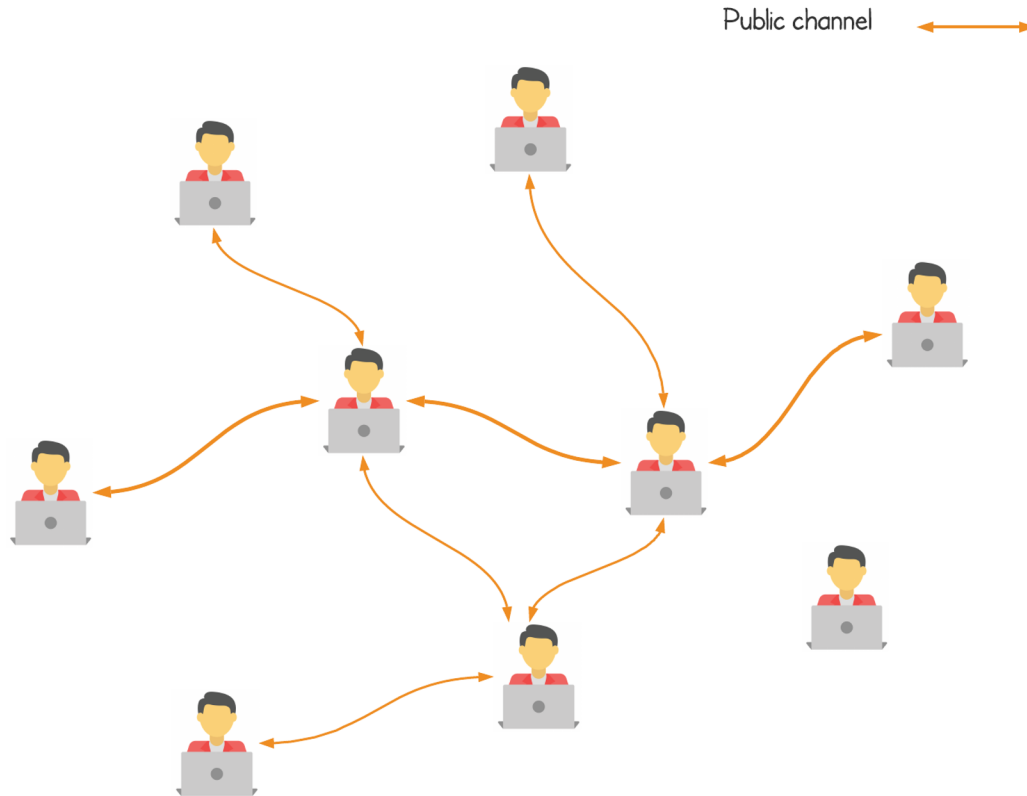
# Lightning Network Background



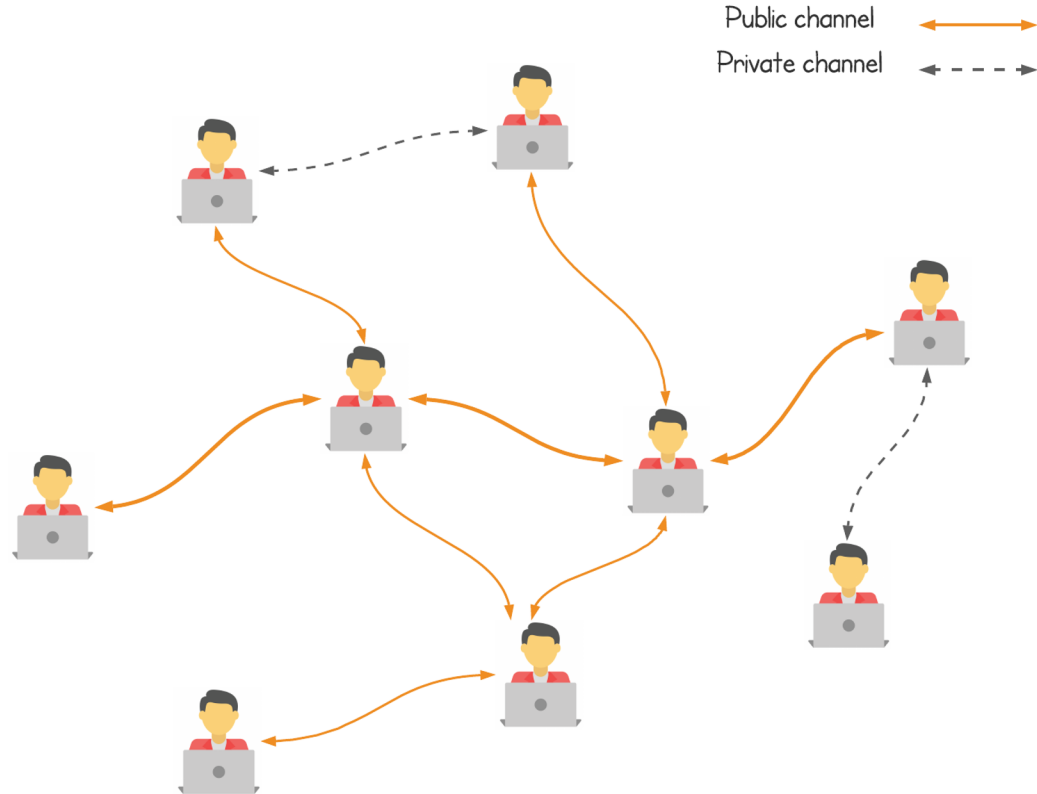




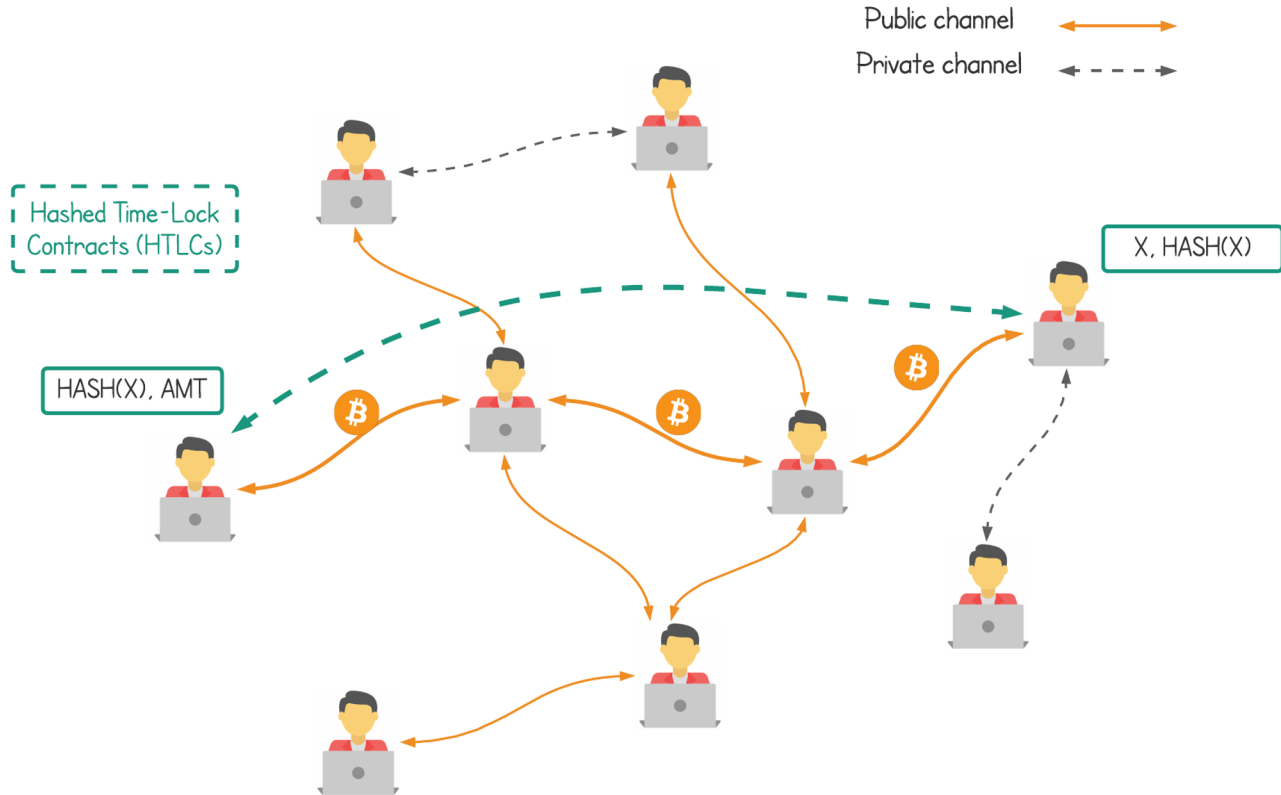




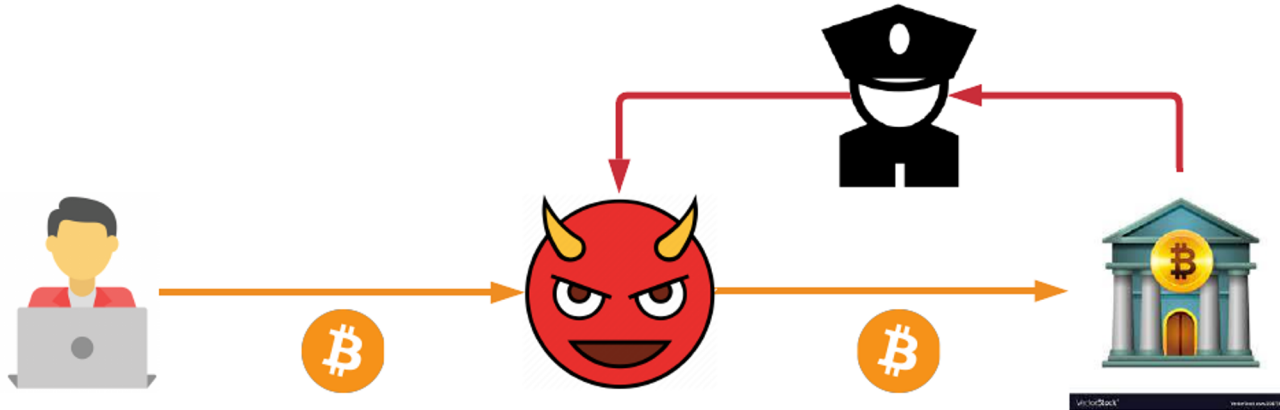
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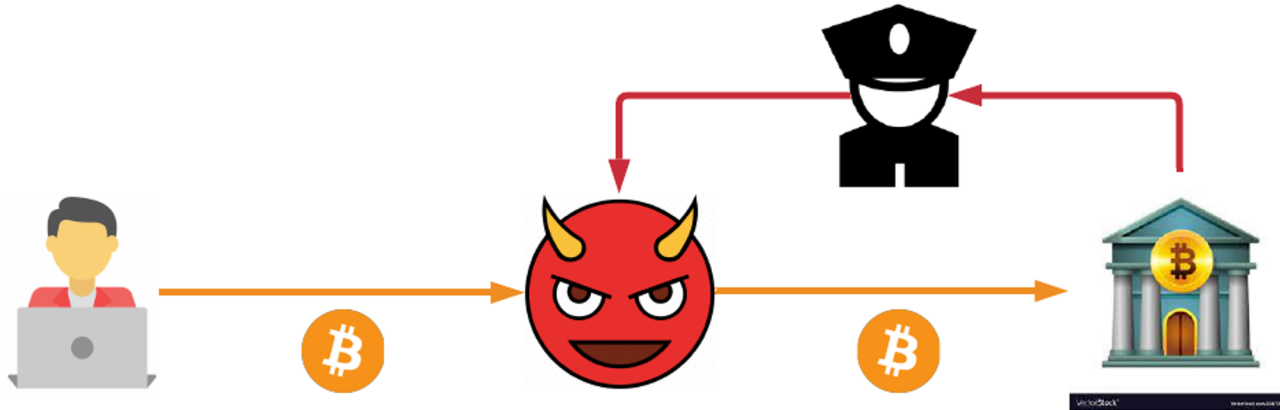


# Lightning Network Background

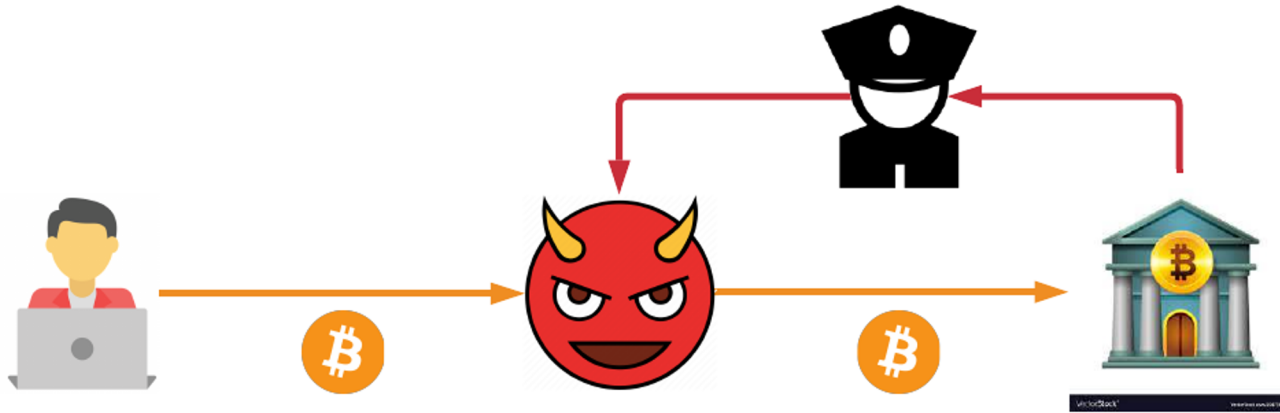






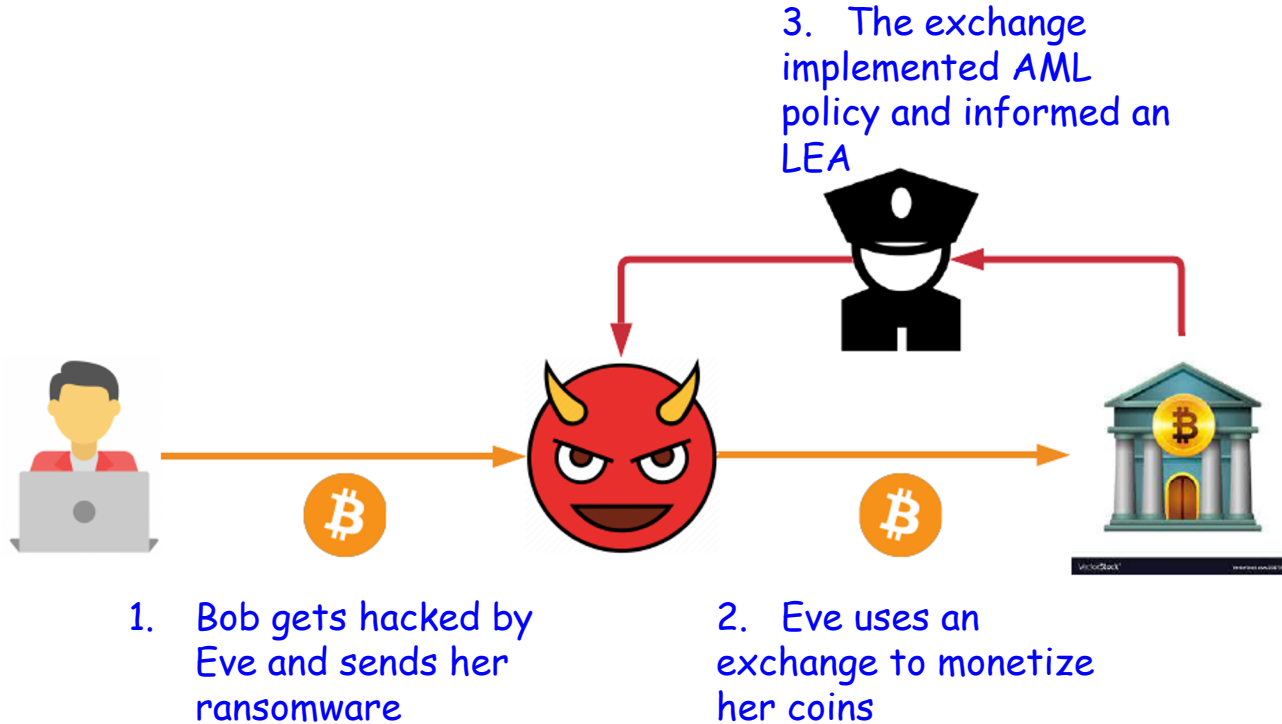


1. Bob gets hacked by Eve and sends her ransomware



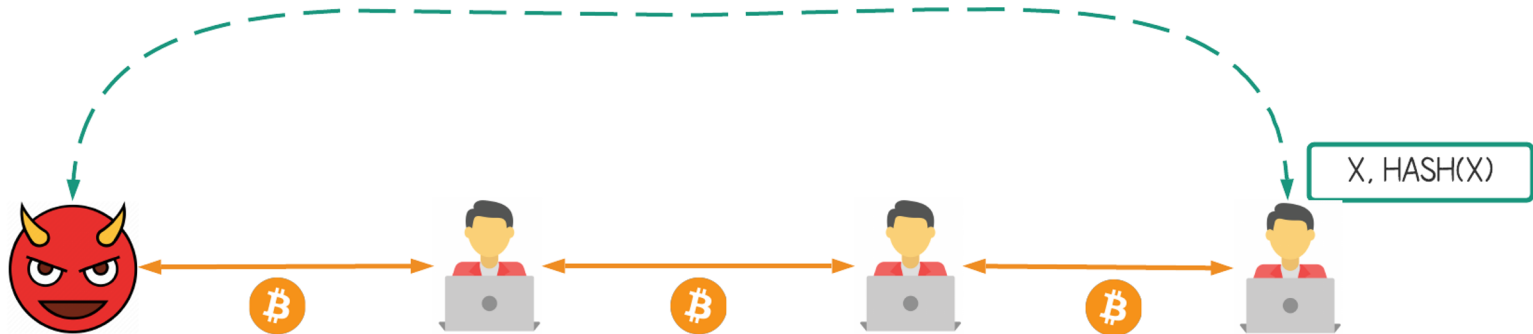
1. Bob gets hacked by Eve and sends her ransomware



2. Eve uses an exchange to monetize her coins

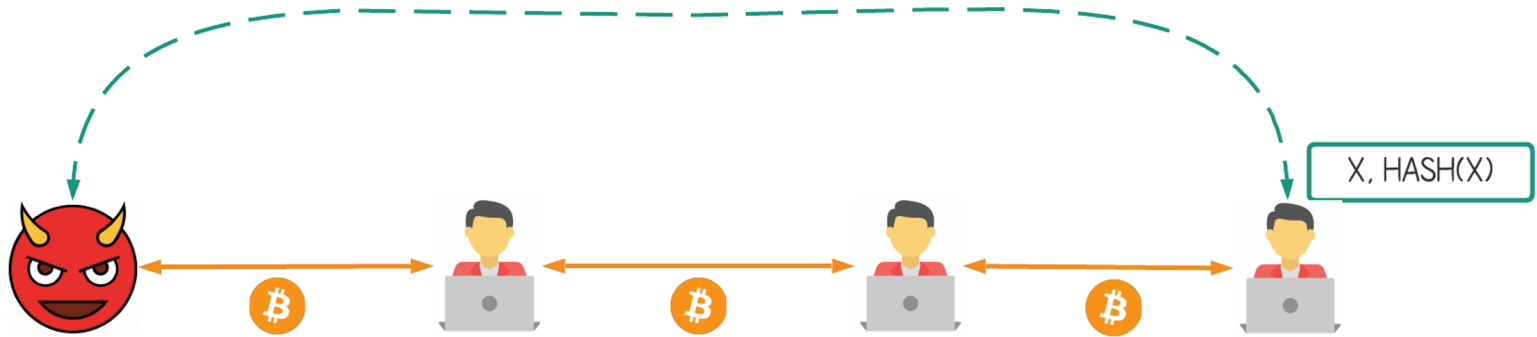


# Tracing illicit activities in the Lightning Network

Public channel   
Private channel 

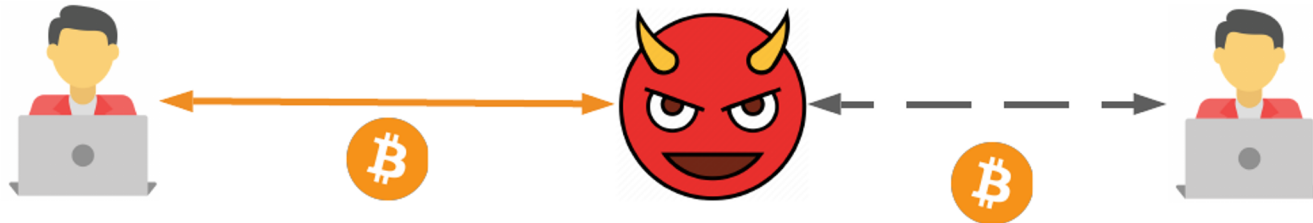


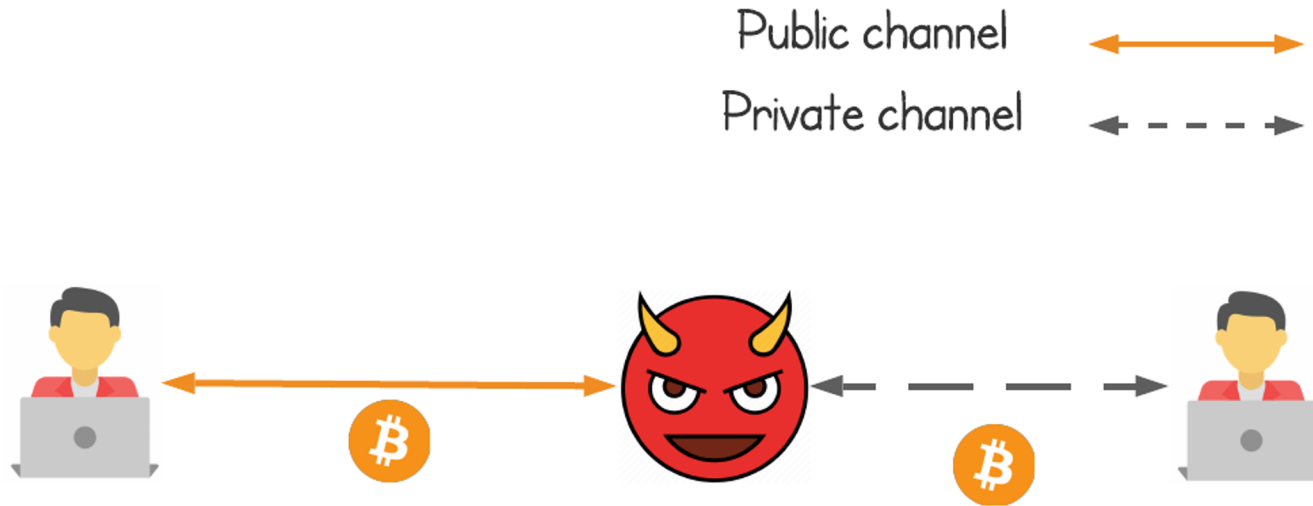
Public channel   
Private channel 



Who is the sender  
of this payment?

Public channel   
Private channel 





Who is interacting  
with Eve?



- Channels secrecy
- Third party balance secrecy
- Off-path payment privacy
- On-path relationship anonymity

# Channels secrecy

Public channel

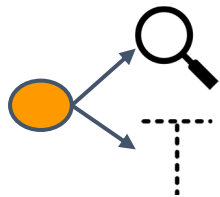


- Everyone knows
- Known capacity
- Anyone can use it for routing
- User who takes funds is anonymous

Private channel



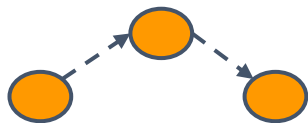
- Only participants know
- Hidden capacity
- Only participants/allowed third-parties can use
- User who takes funds is anonymous



Two heuristics  
(Property & Tracing)



Property  
77,245 closed private  
channels

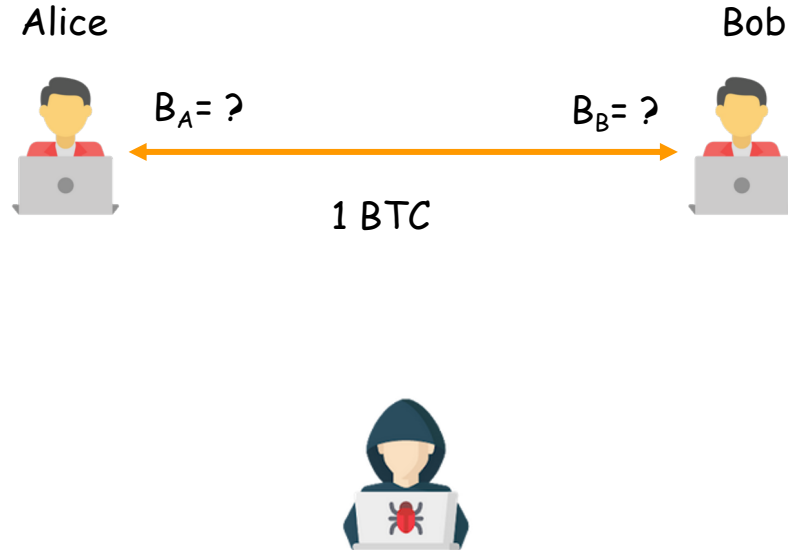


Tracing  
27,183 channels  
79.3% identified one  
participant

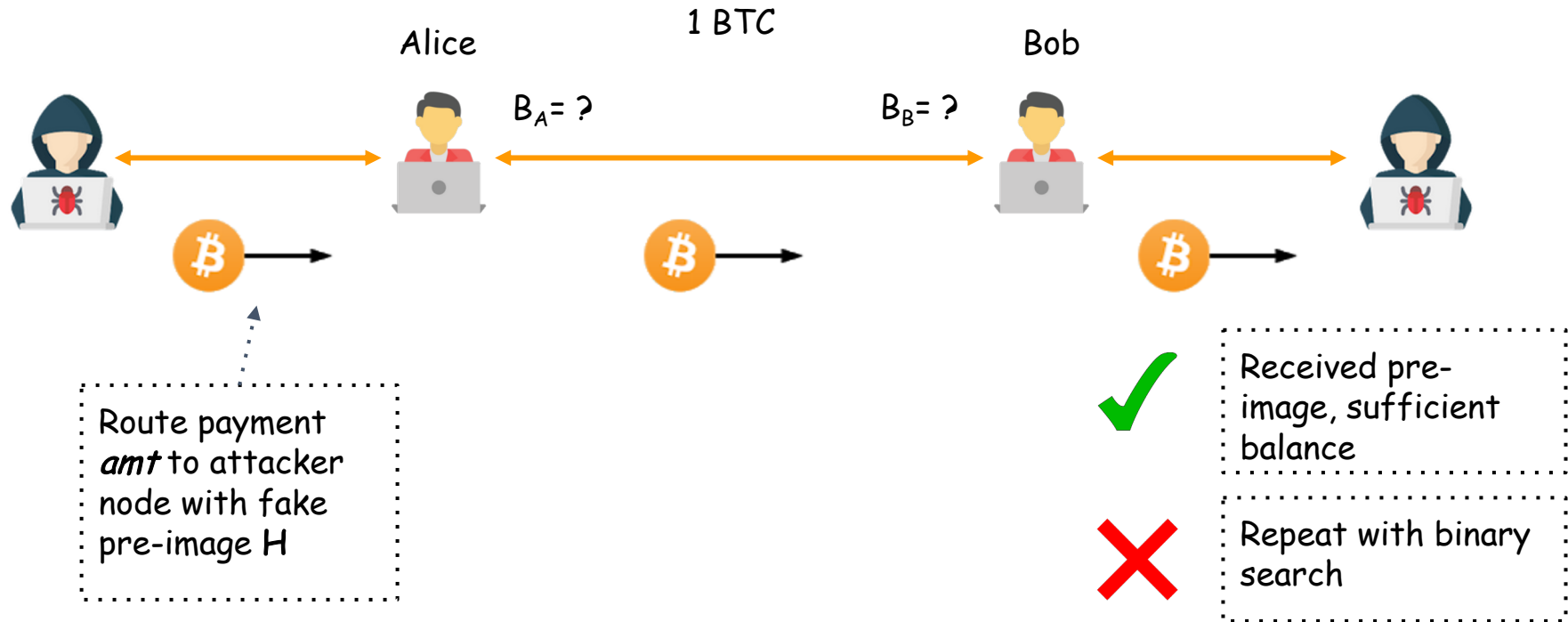


Public  
155k found opening node  
143k found who got  
closing funds

# Third party balance secrecy



## Generic balance inference attack



## Generic balance inference attack



Full *testnet* attack



103 nodes, 1,017 channels



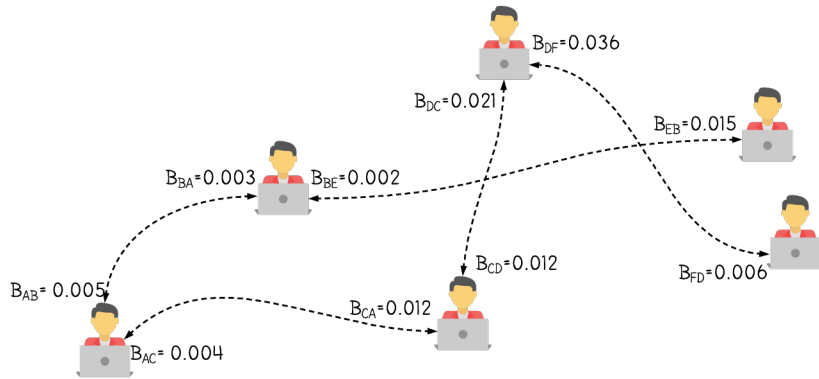
65% of the channels were one-sided



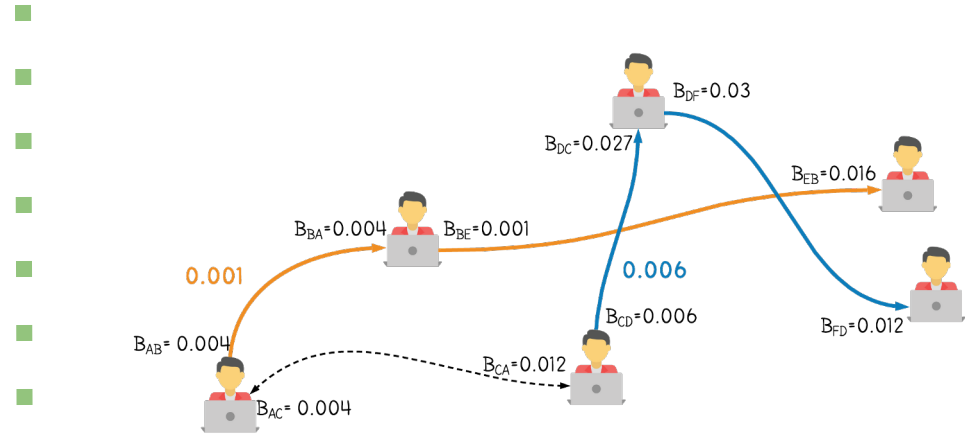
Attacker cost



# Off-path payment privacy



Snapshot 1  
12:00



Snapshot 2  
12:05

# On-path relationship anonymity

When does an intermediate node know who the Sender is



+

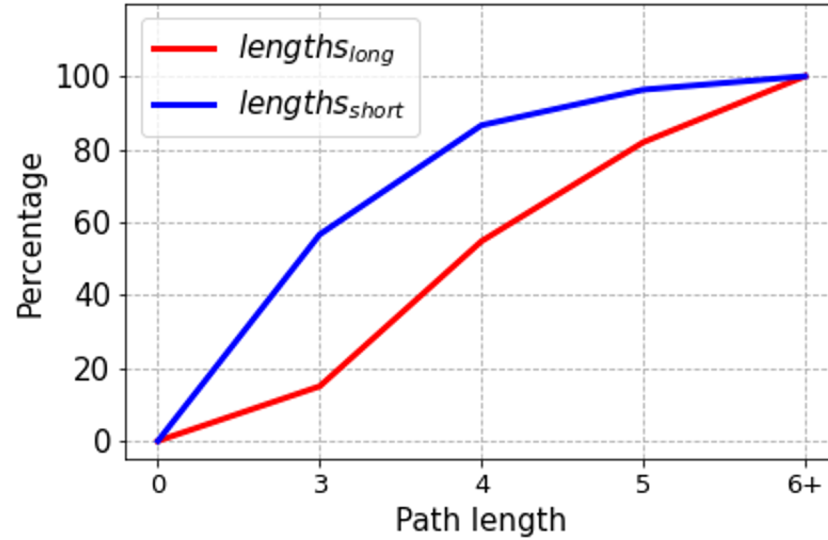


+



$$\sum_{\ell=3}^{20} \Pr[L = \ell | \text{success}] \cdot \Pr[H = 1 | L = \ell, \text{success}]$$

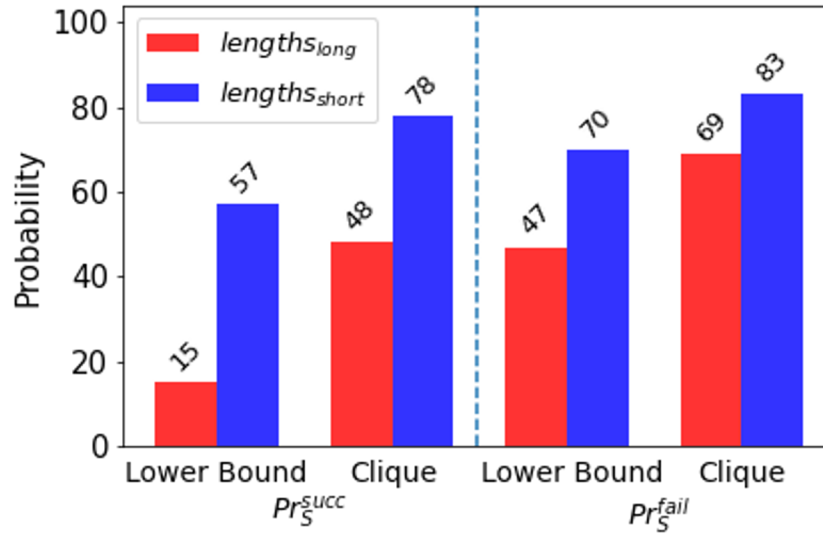
## Average Lengths - How long is each path?



**$lengths_{long}$**  : We maximize the lengths |  **$lengths_{short}$**  : We minimize the lengths

For  **$lengths_{long}$**  14.98% of paths consist of only one hop.

In  **$lengths_{short}$** , 56.65% of paths consisted of a single hop.



In the worse case scenario the intermediate now has a 14.98% probability of being right

In the best case scenario, where paths are short, failures happen oftenly and the nodes in a path form a clique the probability is 83% !

- Private channels → Property & Tracing Heuristics
- Third party balance secrecy → Balance inference attacks
- Off-path payment privacy → Payment detection attack
- On-path relationship anonymity → Path discovery attack

# THANK YOU

QUESTIONS?