

Anonymity in the Bitcoin Peer-to-Peer Network

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“Untraceable Bitcoin”

Teenagers using untraceable currency Bitcoin to buy dangerous drugs online

Fears have been raised as children as young as 14 are getting parcels of legal highs delivered to their home

Mirror



This is false.

Bitcoin Primer

Transaction

k_A sends k_{coin} to k_B

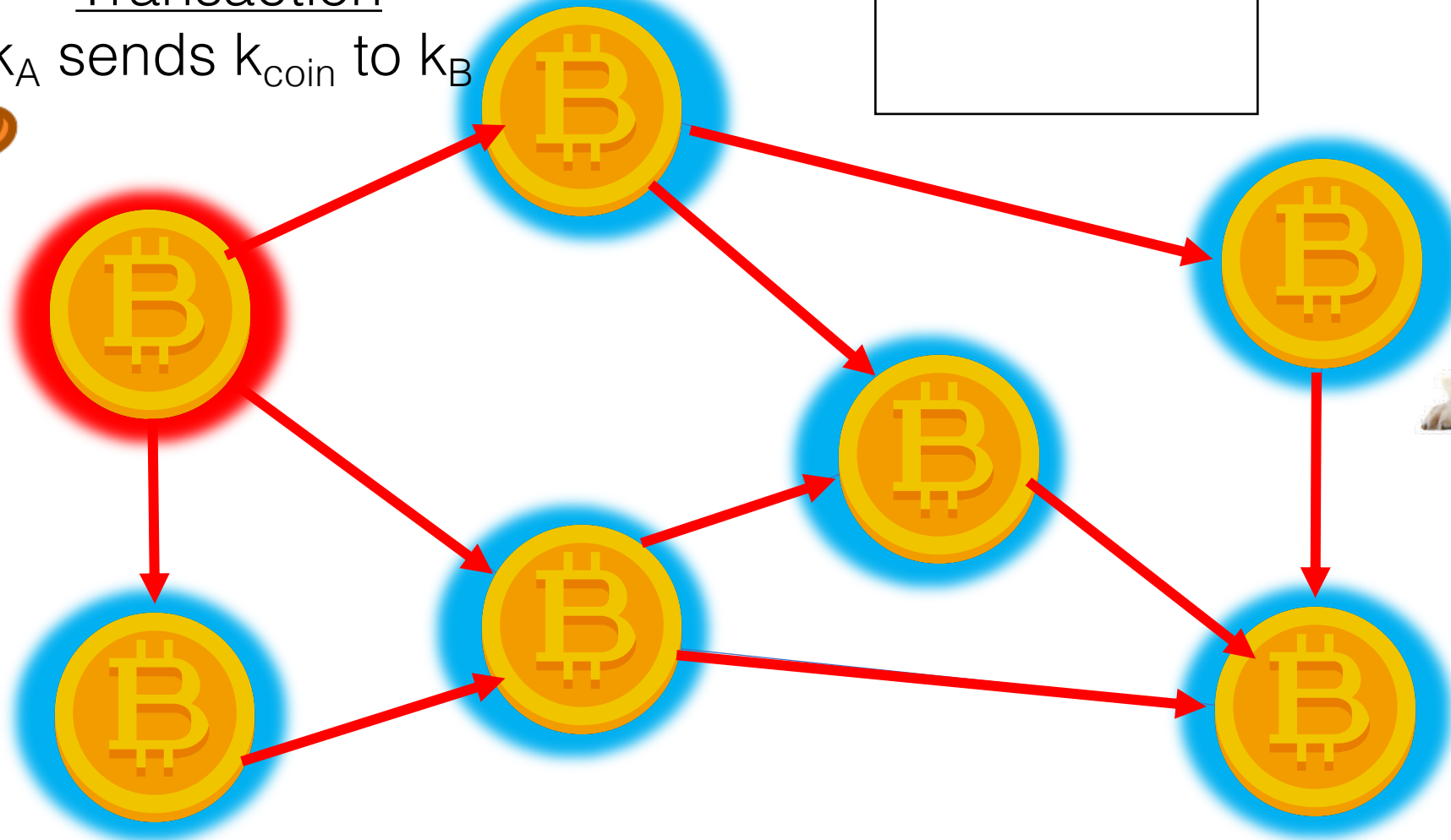
Blockchain
sd93fjj2
pckrn29
...
our transaction



Alice
 k_A

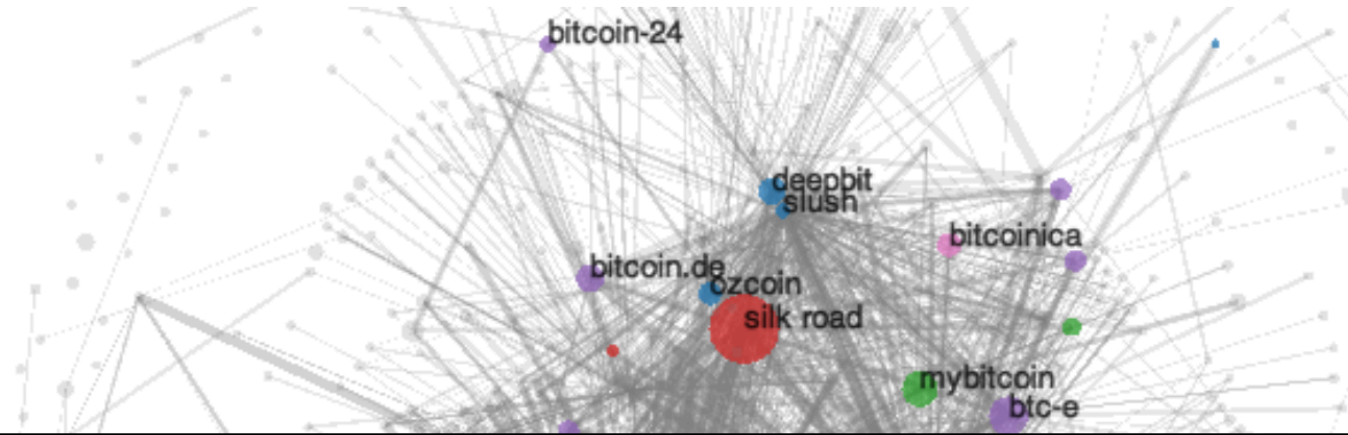


k_{coin}



Bob
 k_B

How can users be deanonymized?



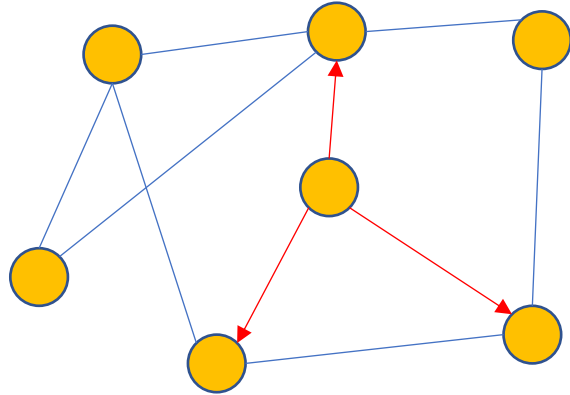
Entire transaction histories
can be compromised.

What about the **peer-to-peer**
network?

Public Key  IP Address

Our Work

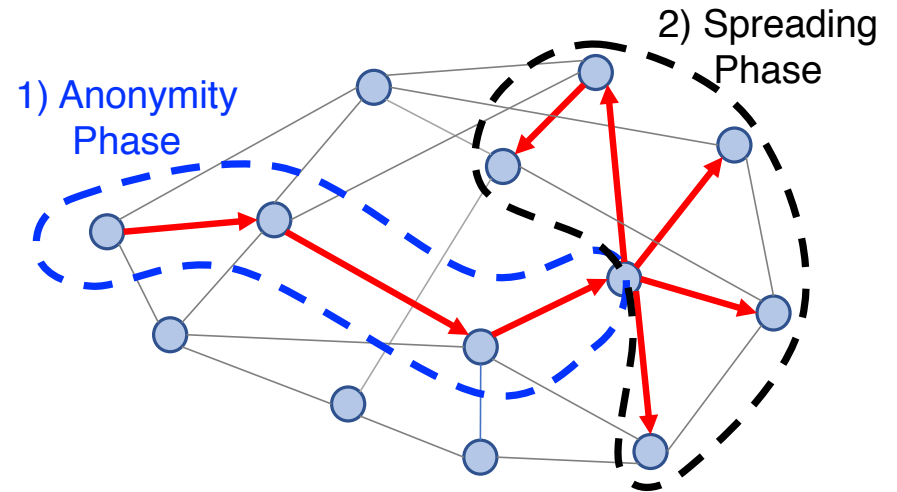
Analysis



Pr(detection)

NIPS 2017

Redesign

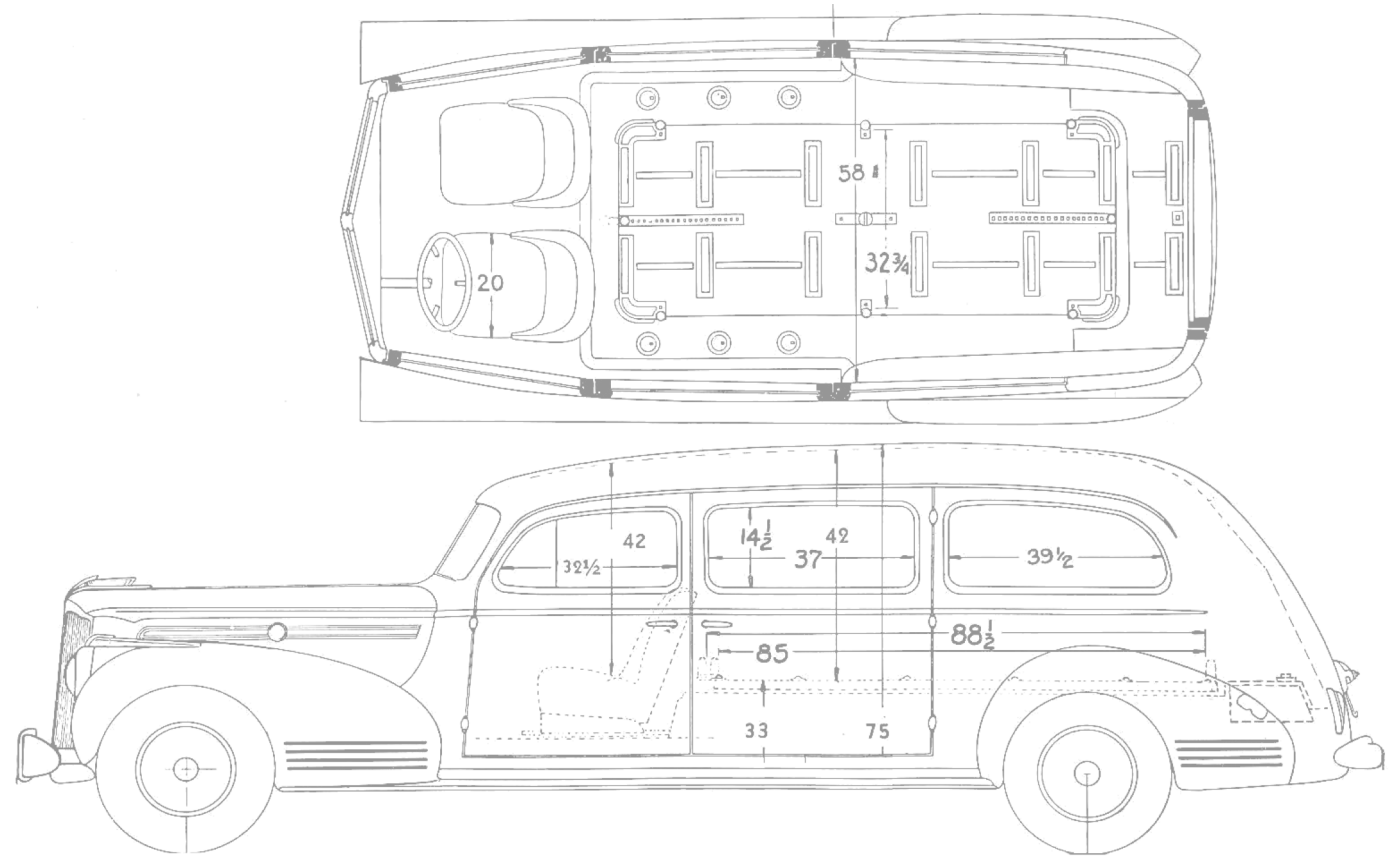


Dandelion

*ACM Sigmetrics 2017,
ACM Sigmetrics 2018*

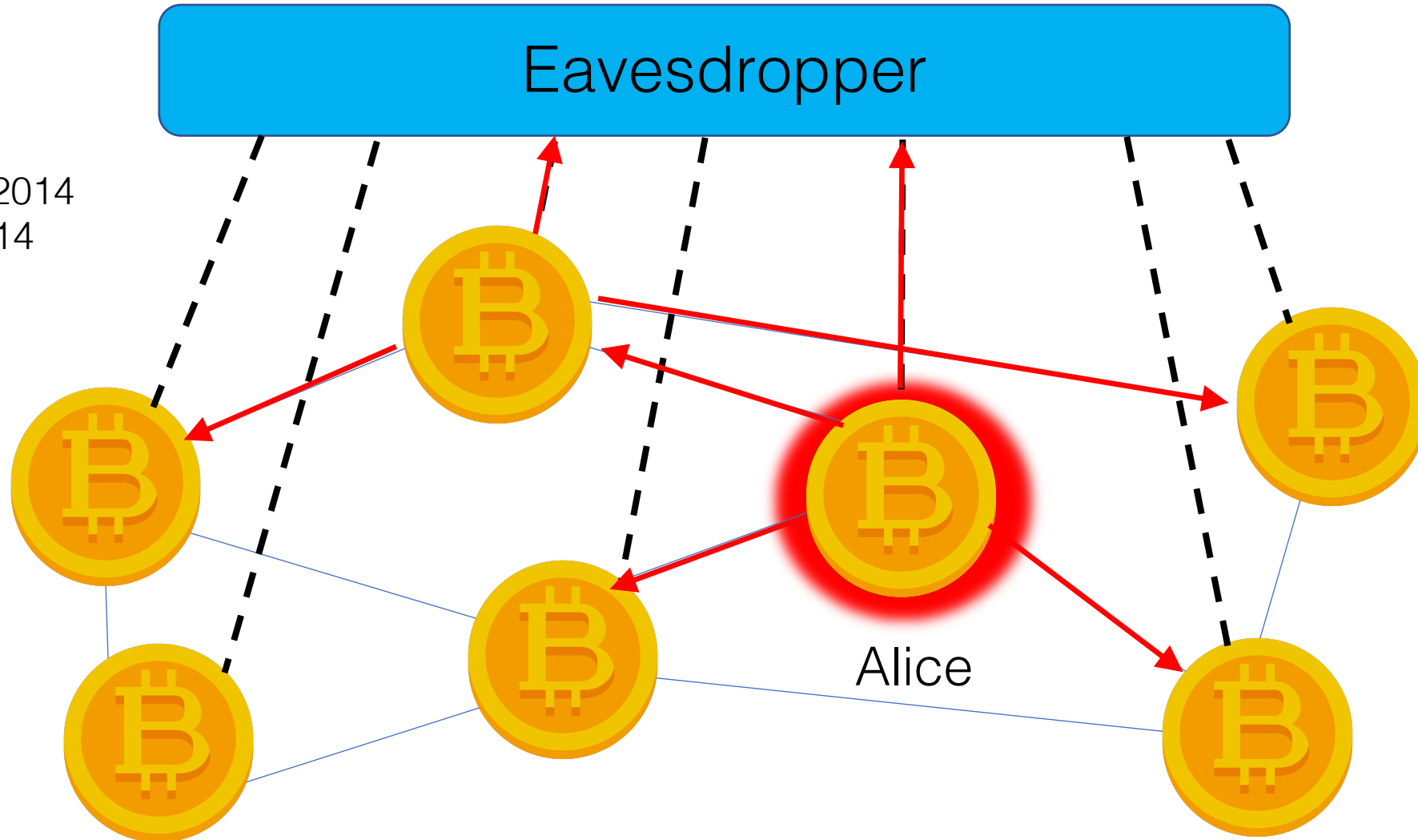
Model

Assumptions and Notation

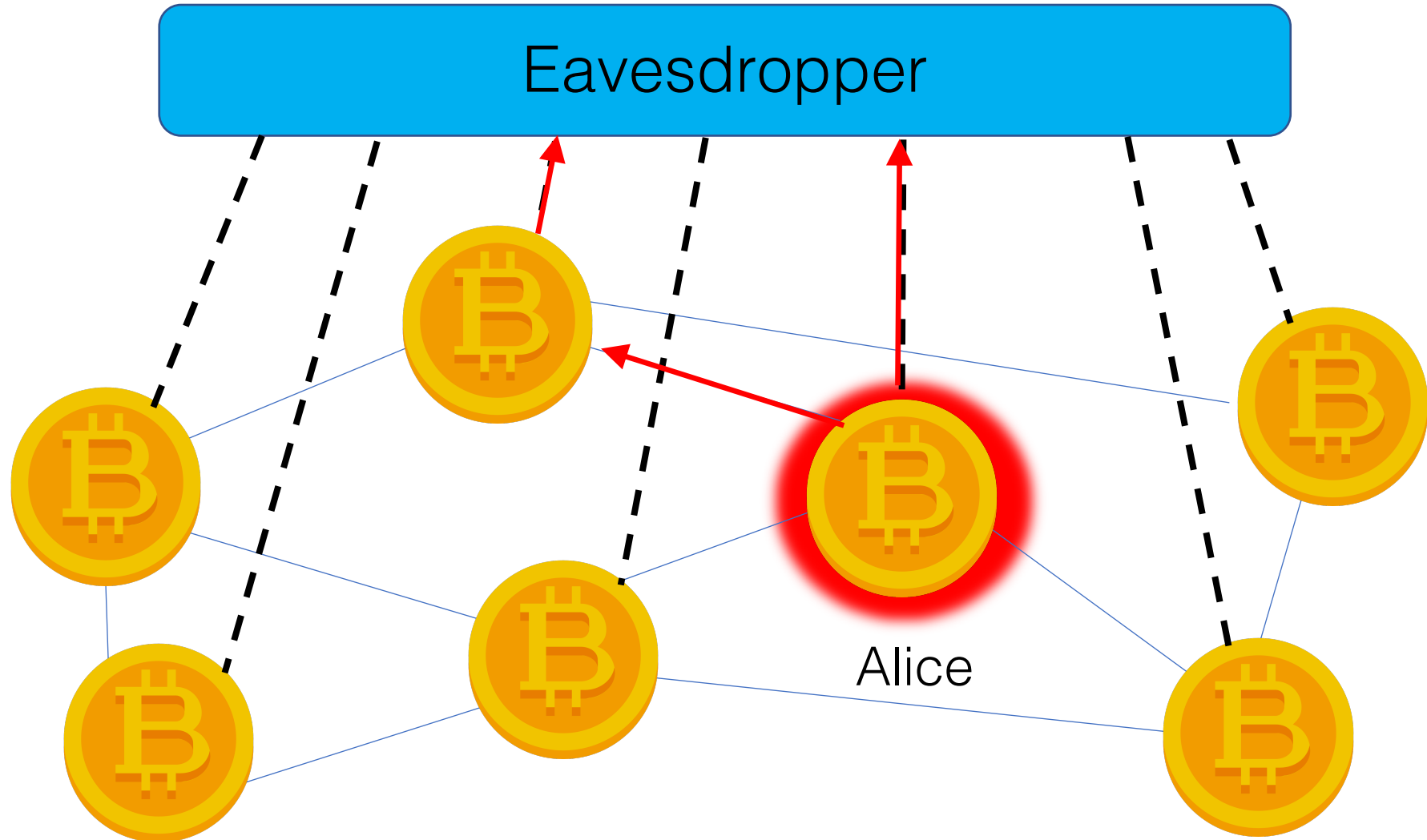


Attacks on the Network Layer

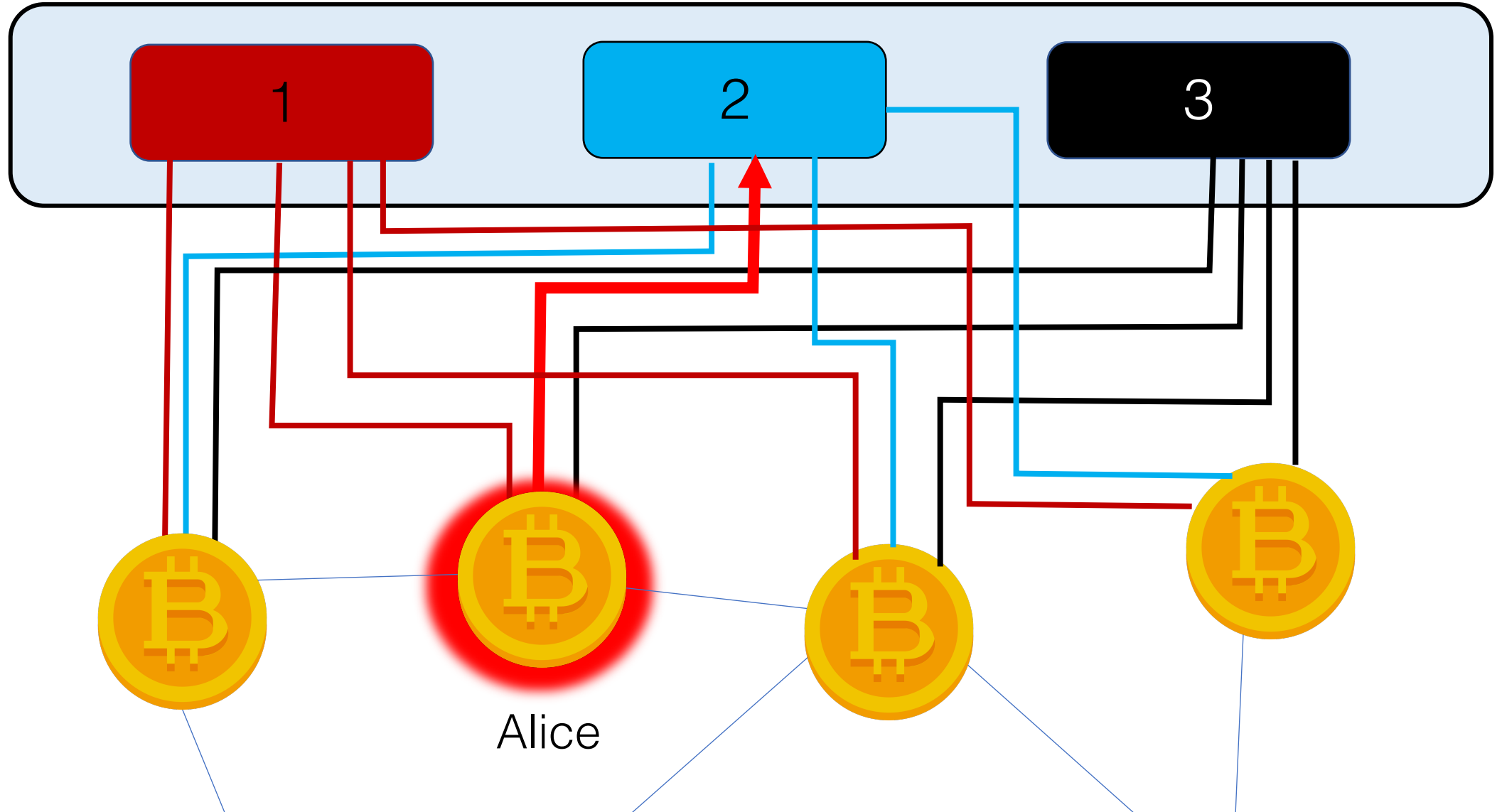
Biryukov et al., 2014
Koshy et al., 2014



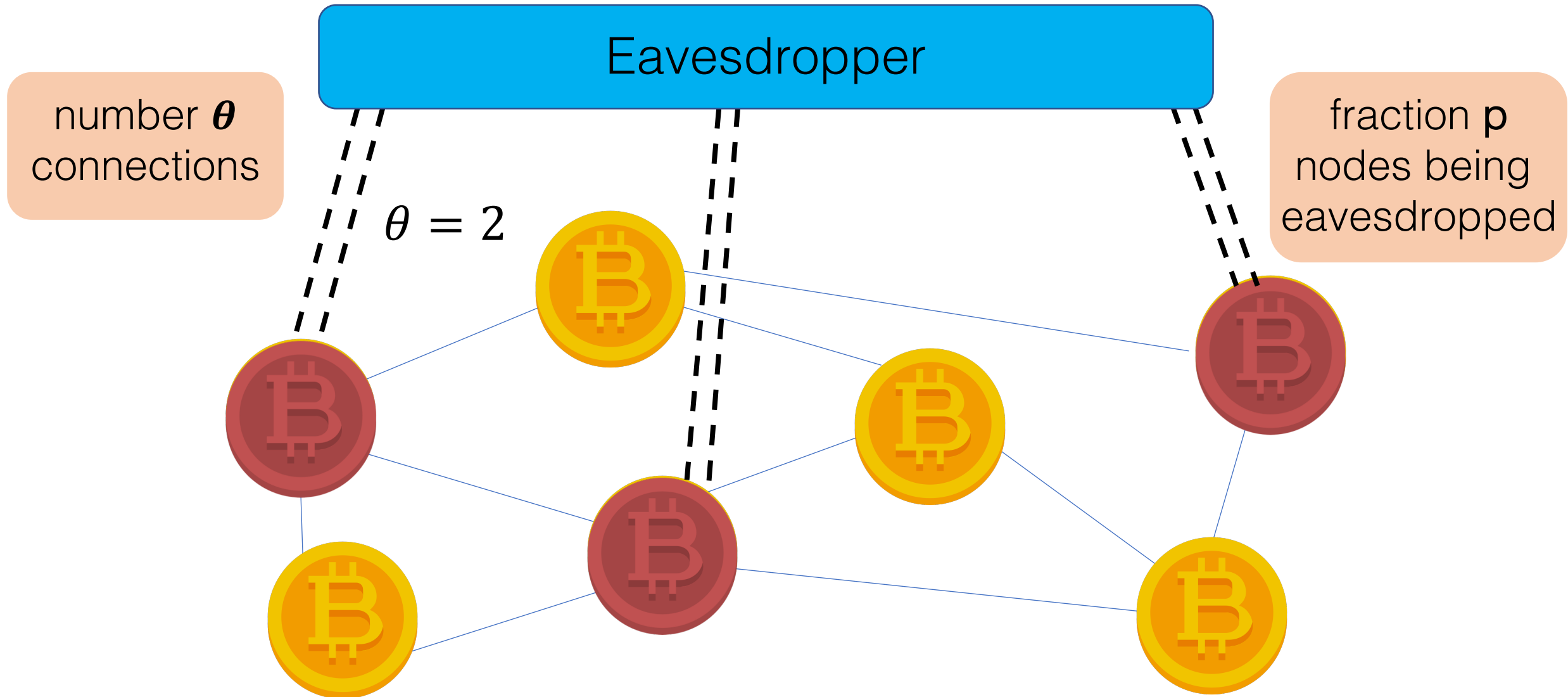
What can go wrong?



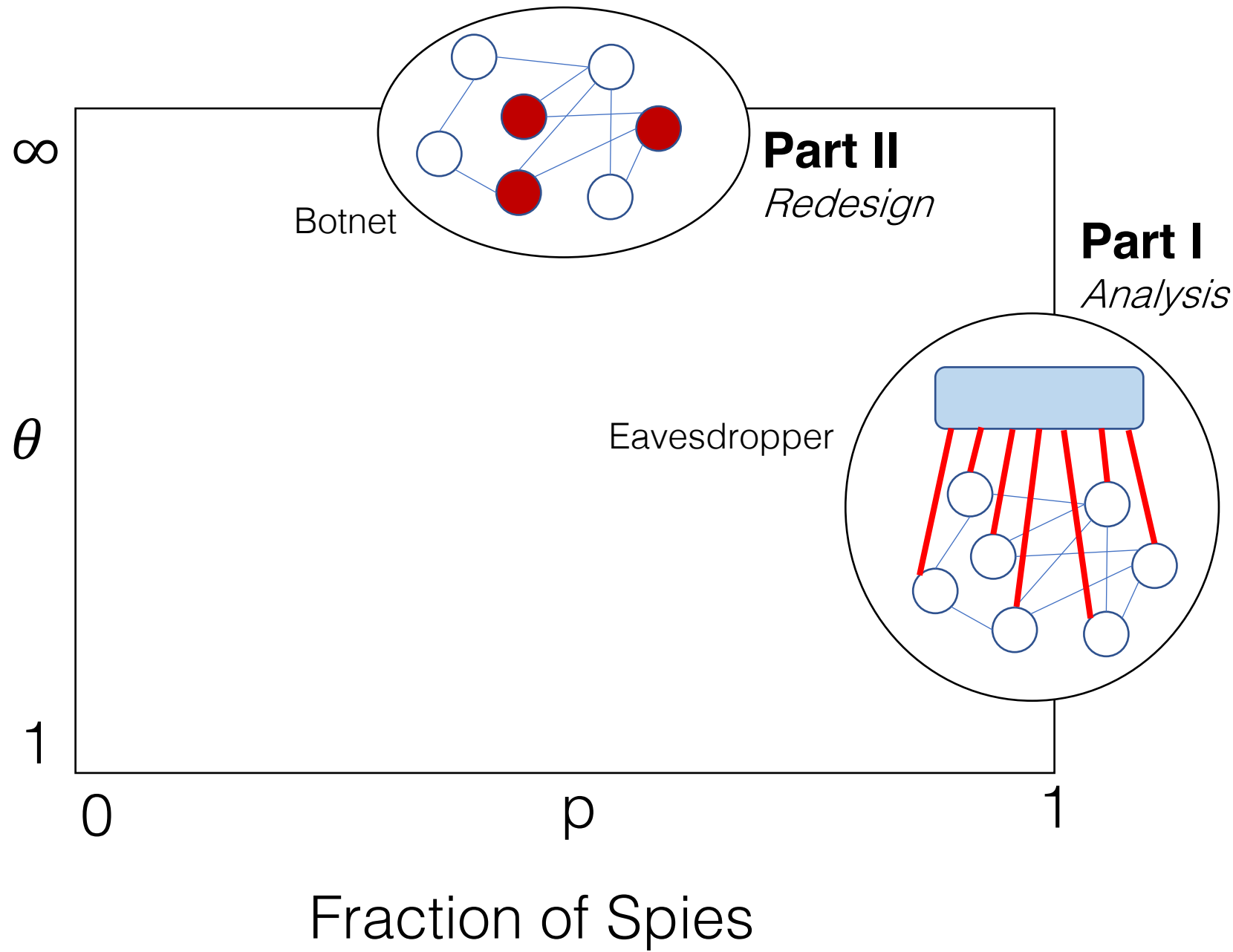
What the eavesdropper can do about it



Summary of adversarial model



Connections
to adversary



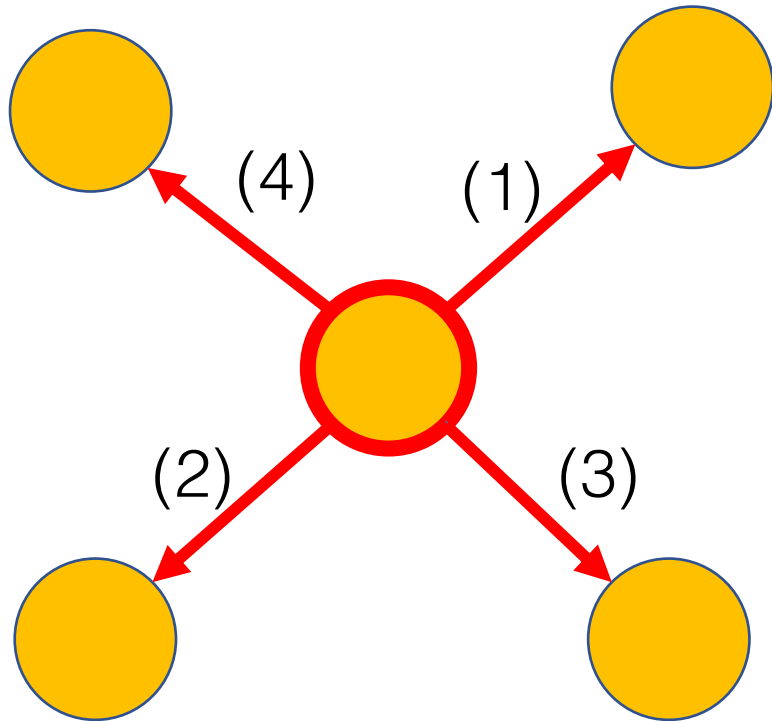
Analysis

How bad is the problem?

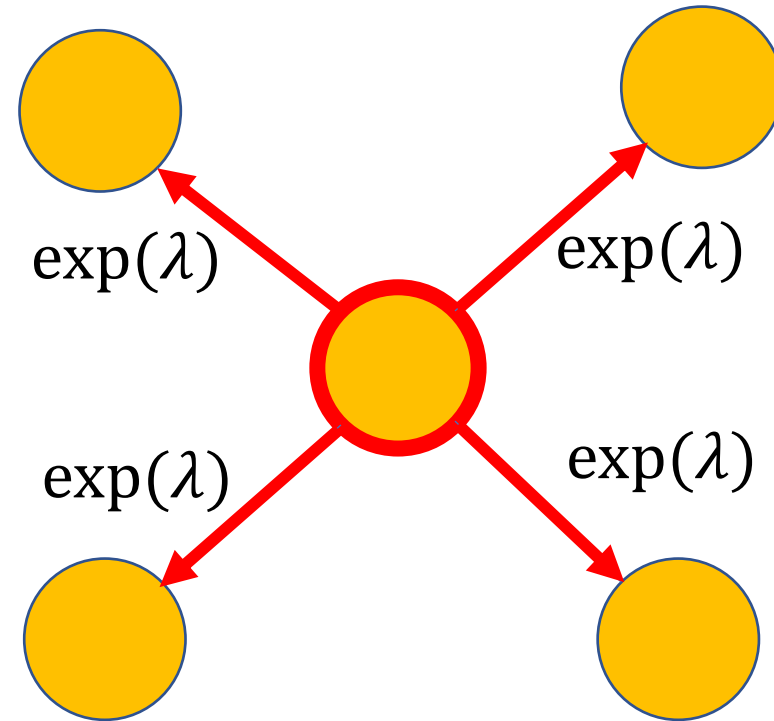


Flooding Protocols

Trickle (pre-2015)



Diffusion (post-2015)



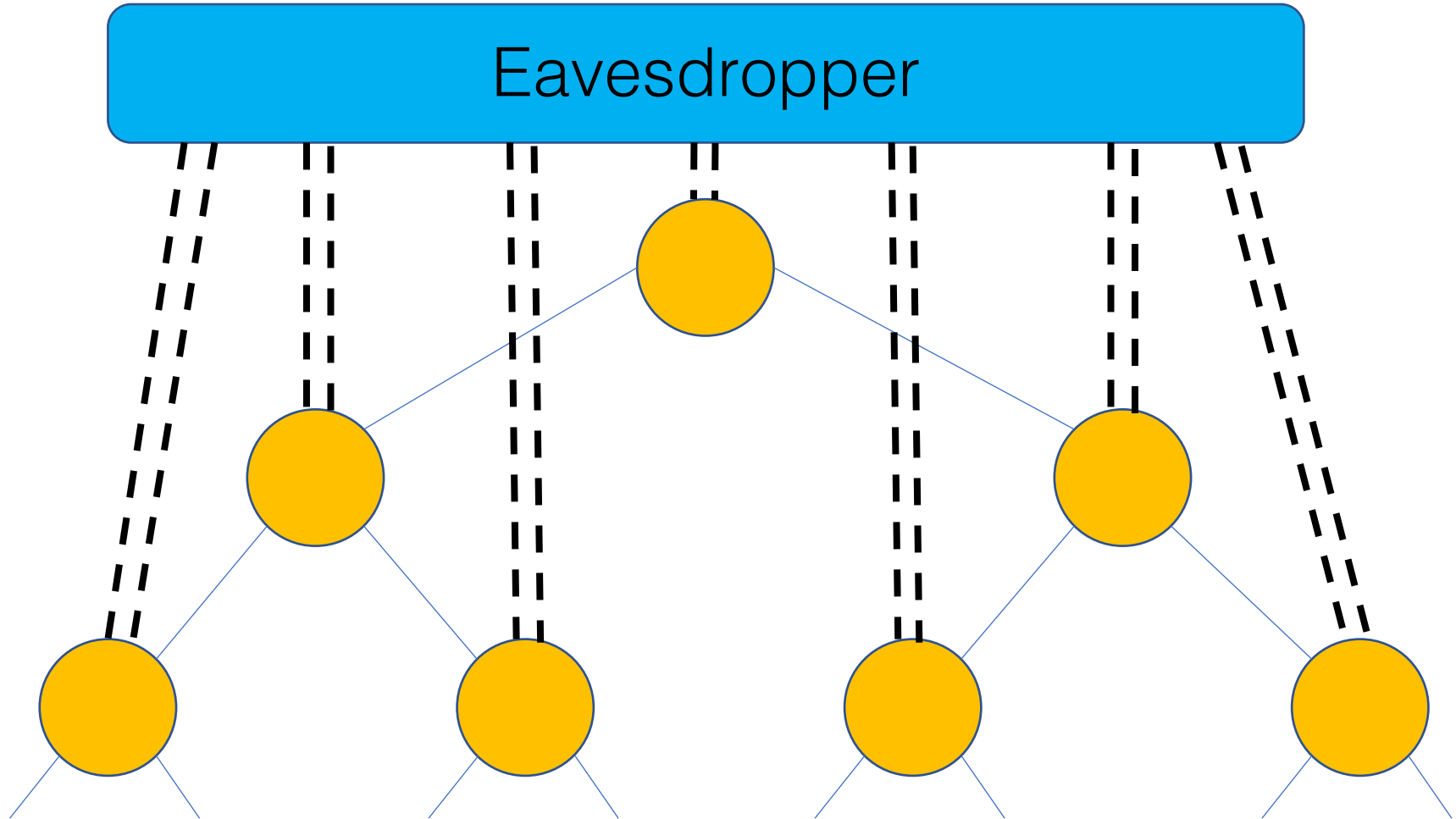
Does diffusion provide stronger anonymity than trickle spreading?

d-regular trees

Eavesdropper

Fraction of spies $p = 1$

Arbitrary number of connections θ



Anonymity Metric

$$P(\text{detection} | \boldsymbol{\tau}, G)$$

timestamps

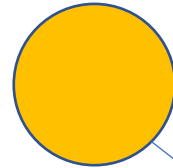


graph

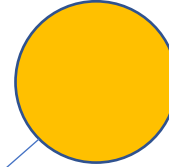


$$\boldsymbol{\tau} = \begin{bmatrix} \tau_1 \\ \tau_2 \\ \dots \\ \tau_n \end{bmatrix}$$

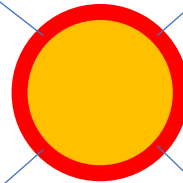
$$\tau_4 = 0.3$$



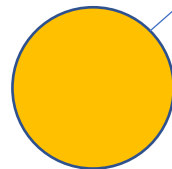
$$\tau_1 = 2.0$$



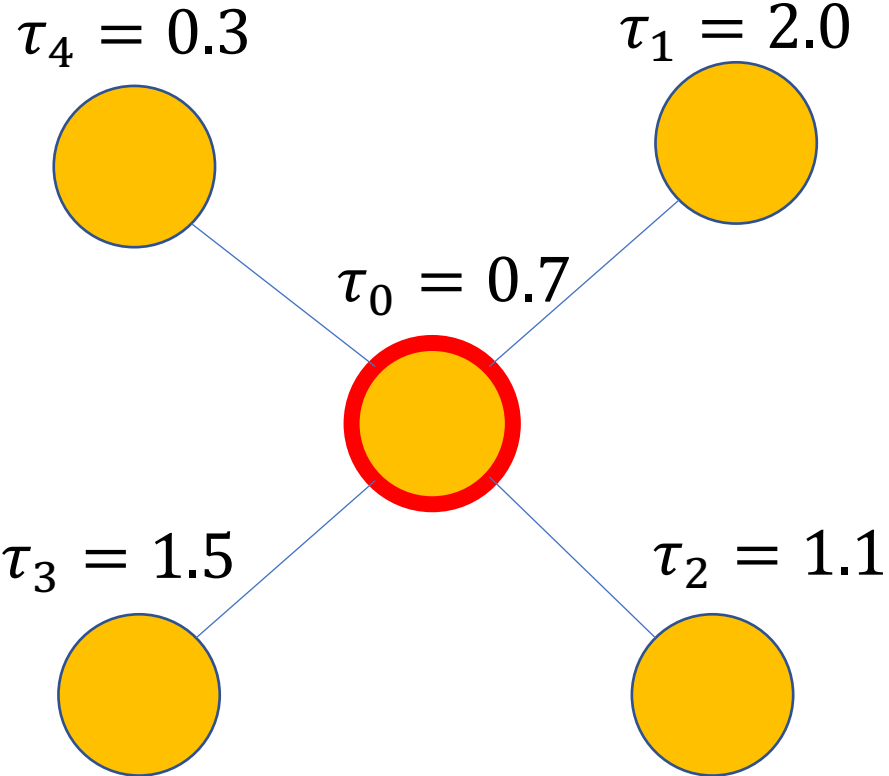
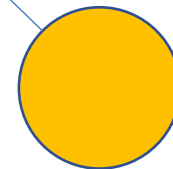
$$\tau_0 = 0.7$$



$$\tau_3 = 1.5$$



$$\tau_2 = 1.1$$

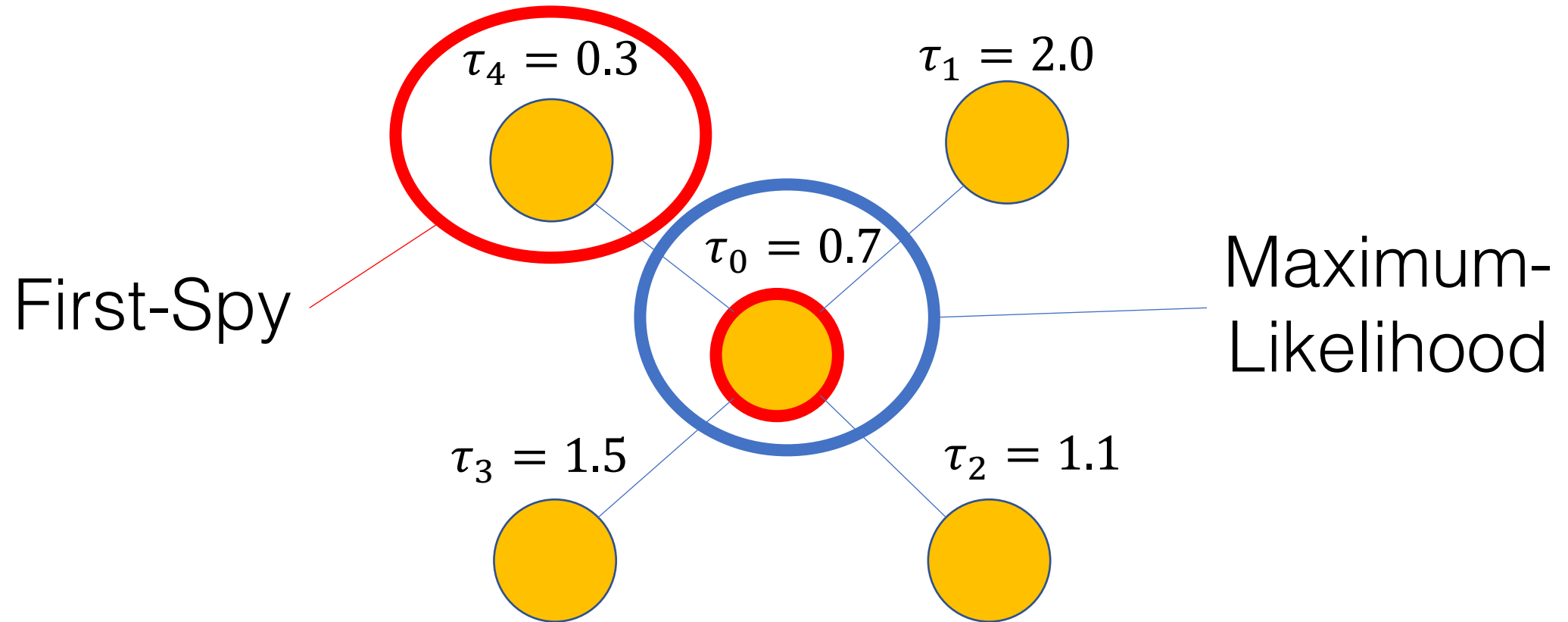


Estimators

$$P(\text{detection} | \boldsymbol{\tau}, G)$$

timestamps

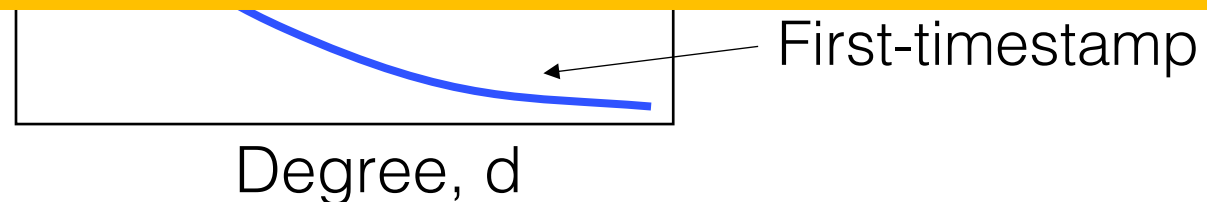
graph



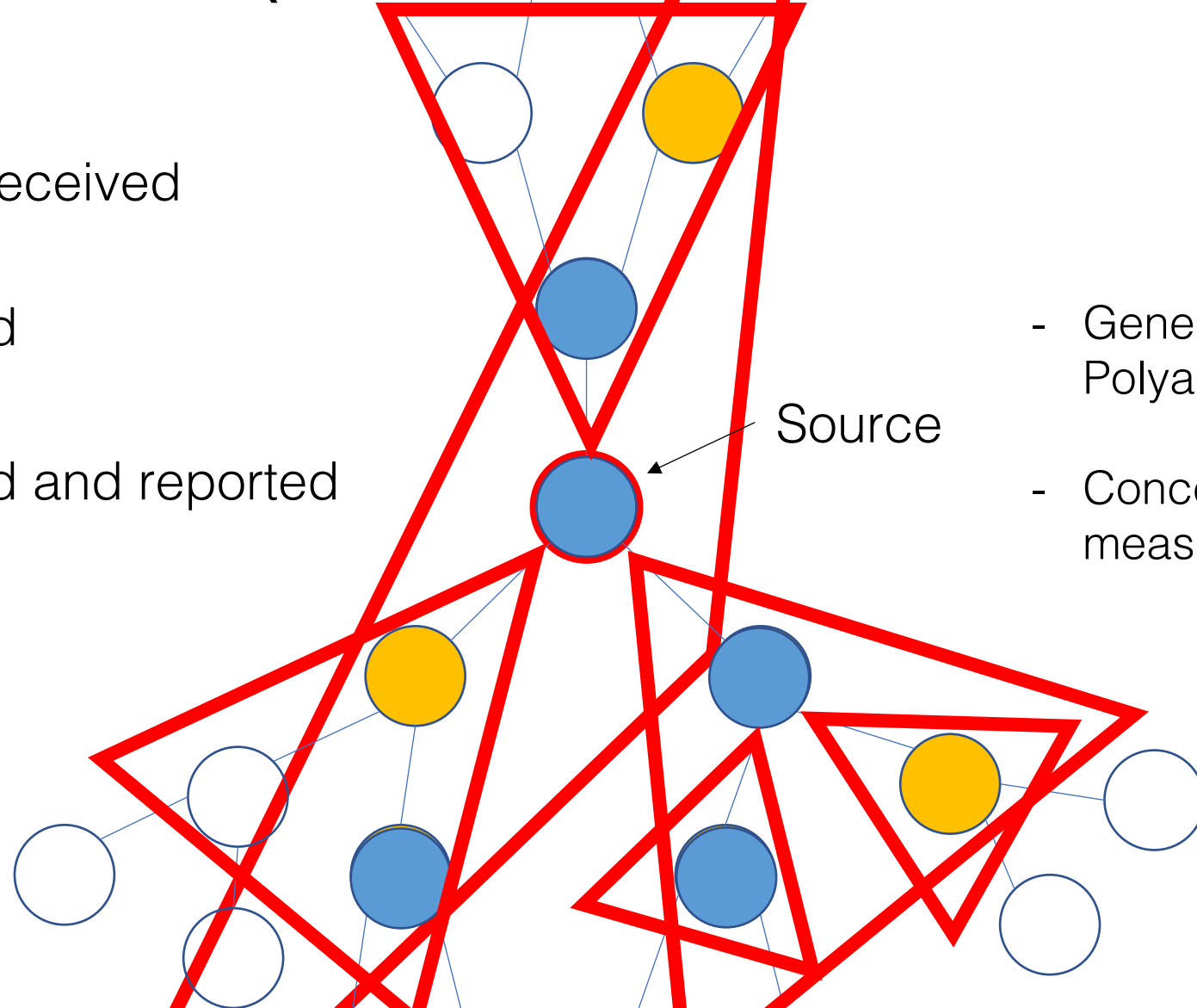
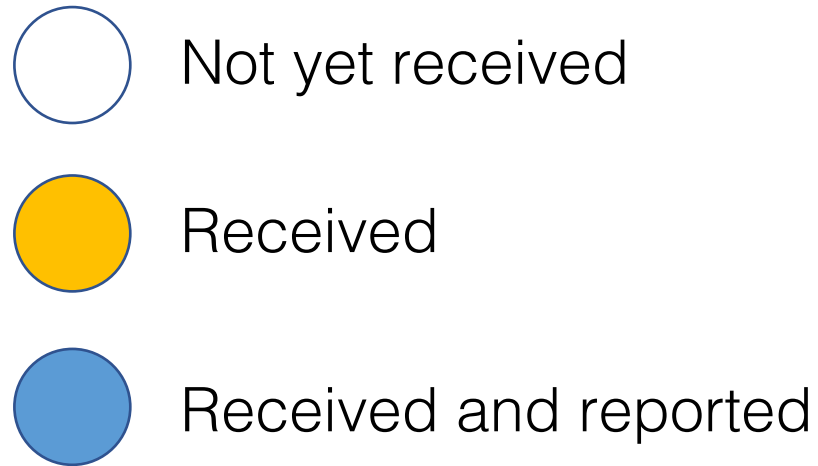
Results: d-Regular Trees

	Trickle	Diffusion
First-Timestamp	$o\left(\frac{\log d}{d}\right)$	$o\left(\frac{\log d}{d}\right)$
Maximum-Likelihood	$\Omega(1)$	$\Omega(1)$

Intuition: Symmetry outweighs local randomness!

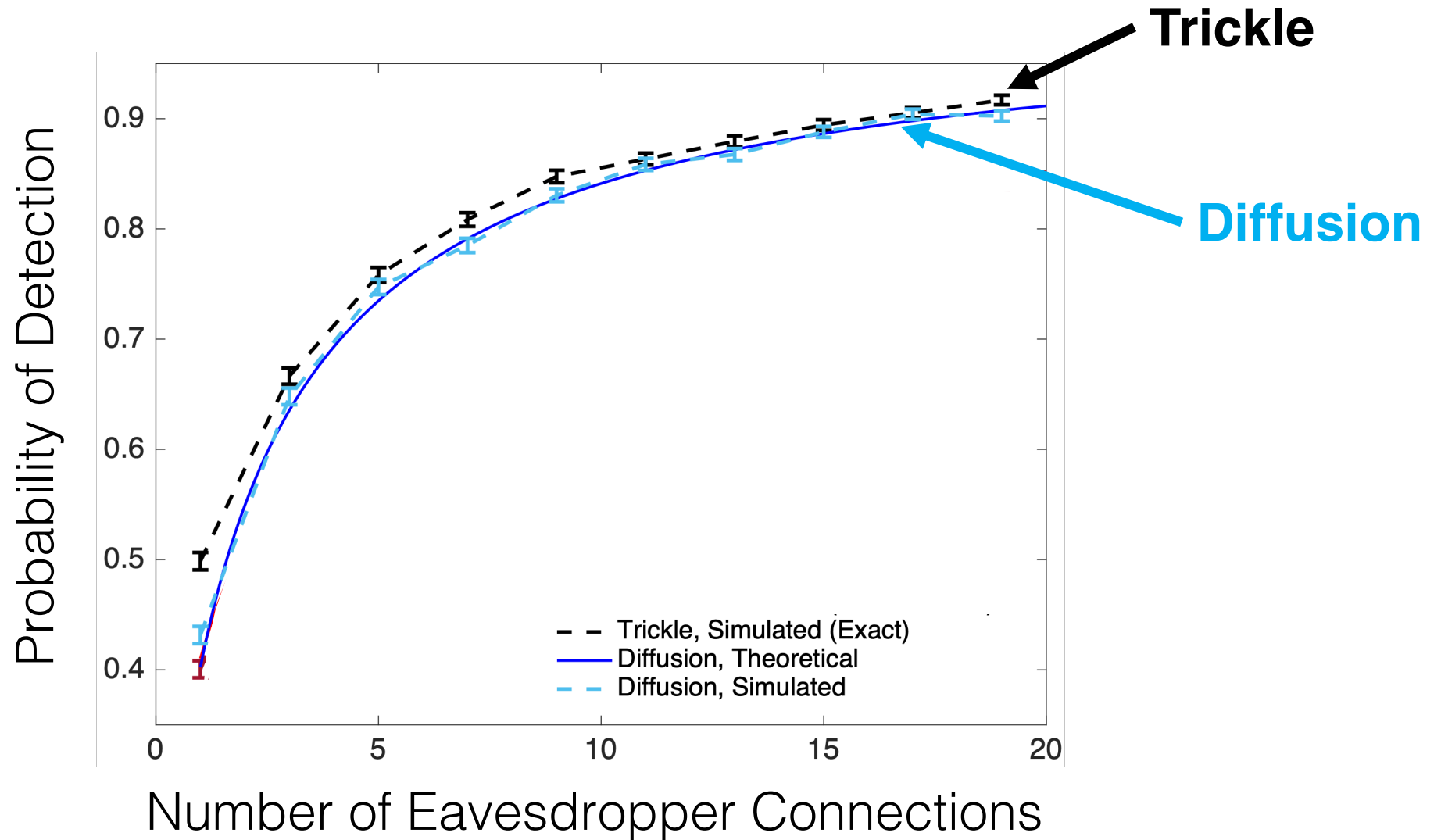


Proof sketch (diffusion, max likelihood)

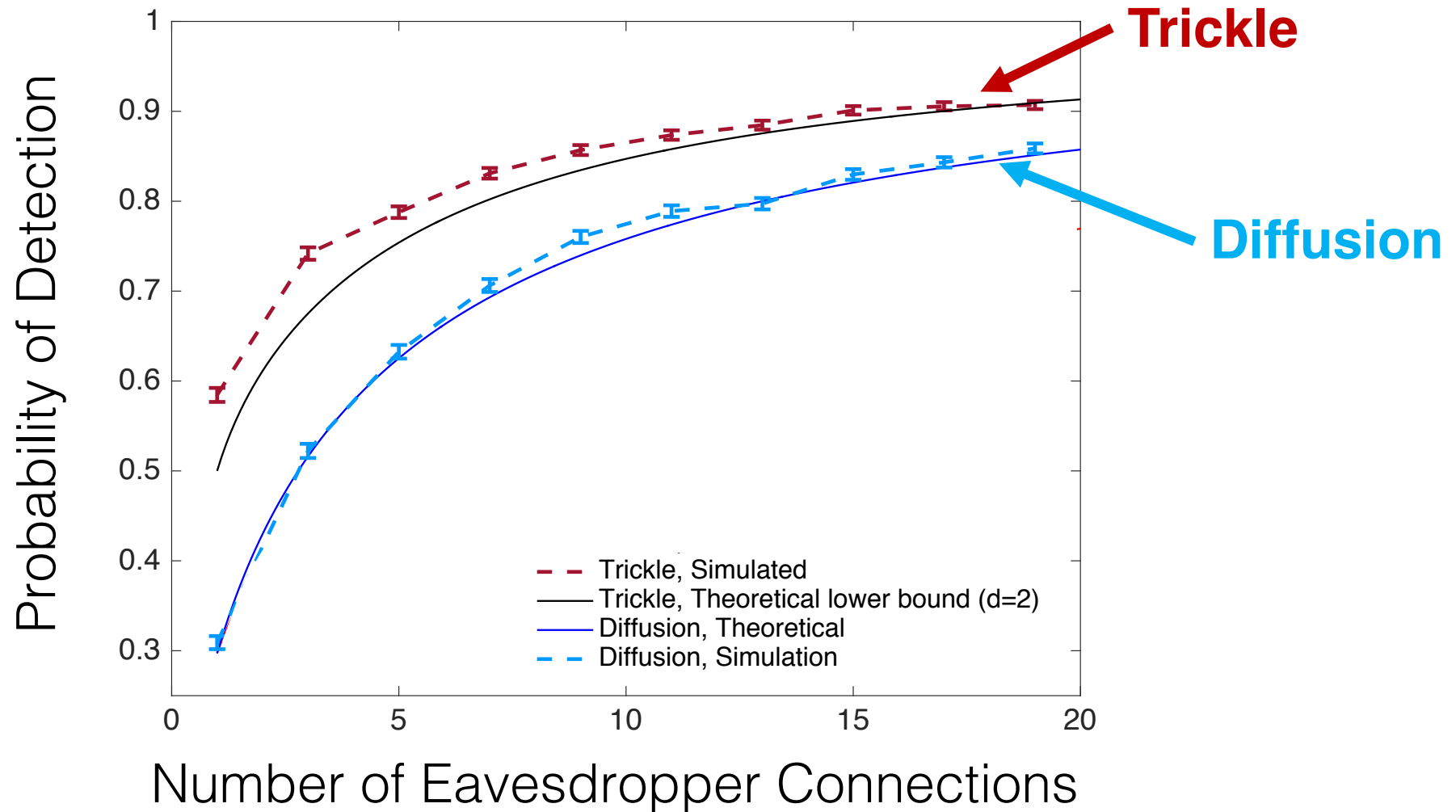


- Generalized Polya Urns
- Concentration of measure

Results: Trees



Results: Bitcoin Graph



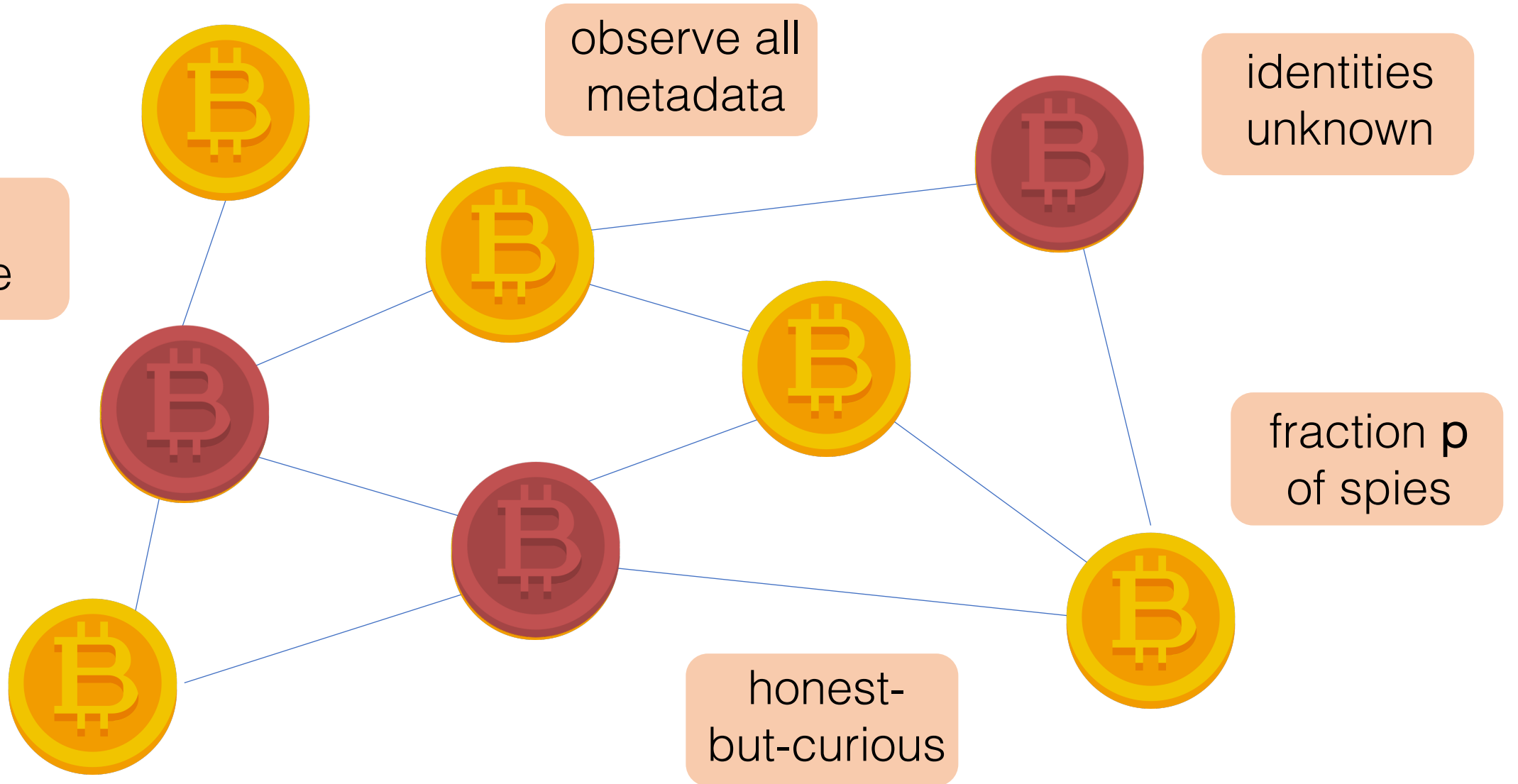
Diffusion does not have
(significantly) better anonymity
properties than trickle.

Redesign

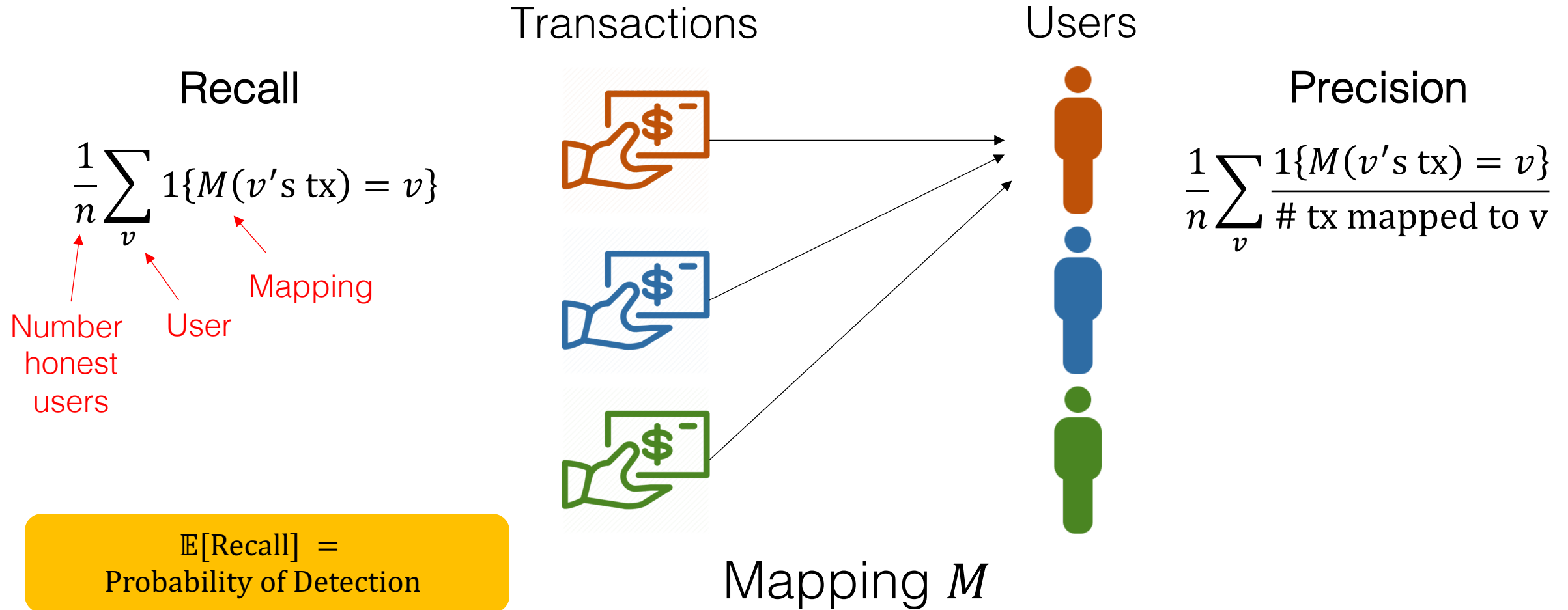
Can we design a better network?



Botnet adversarial model



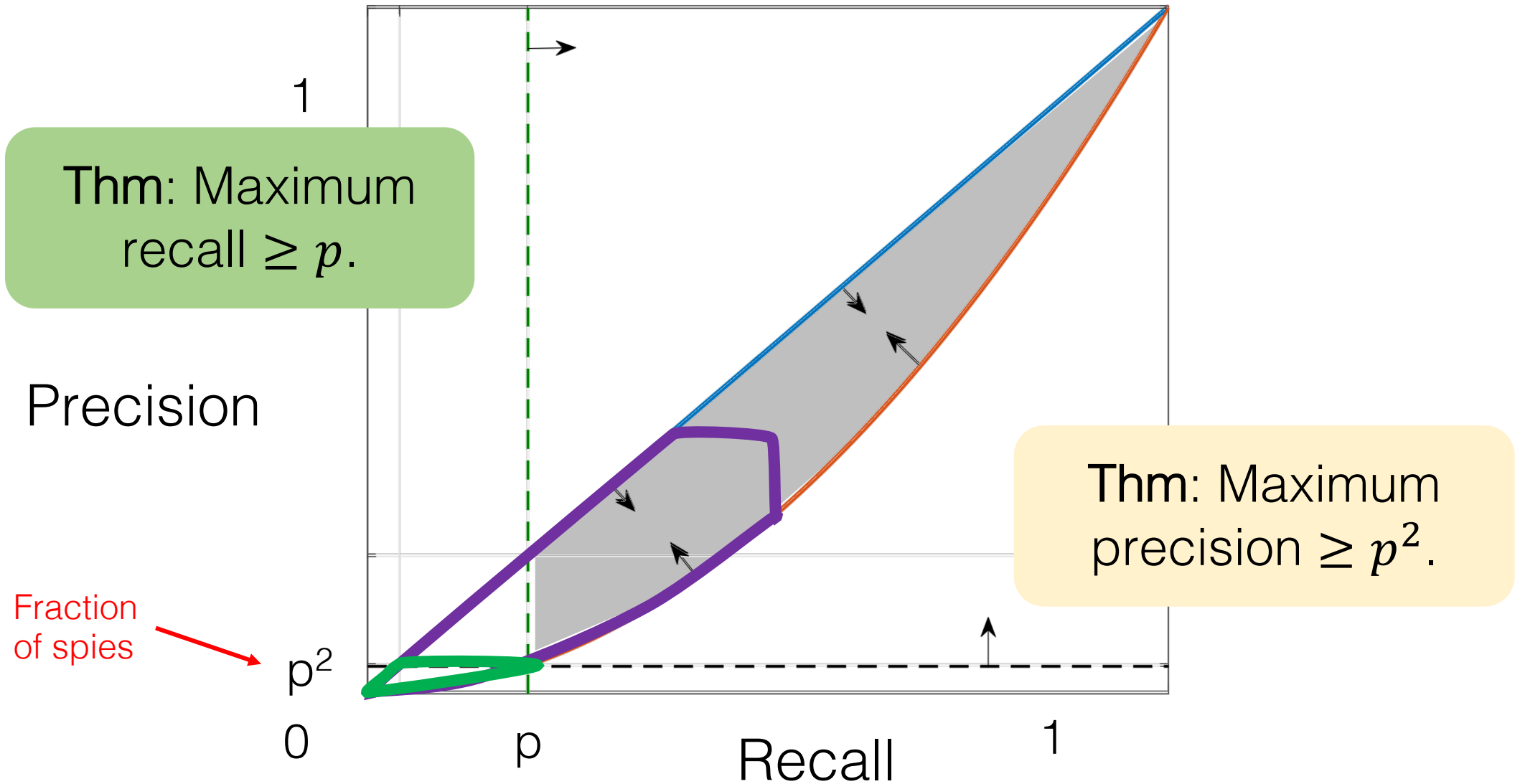
Metric for Anonymity



Goal:

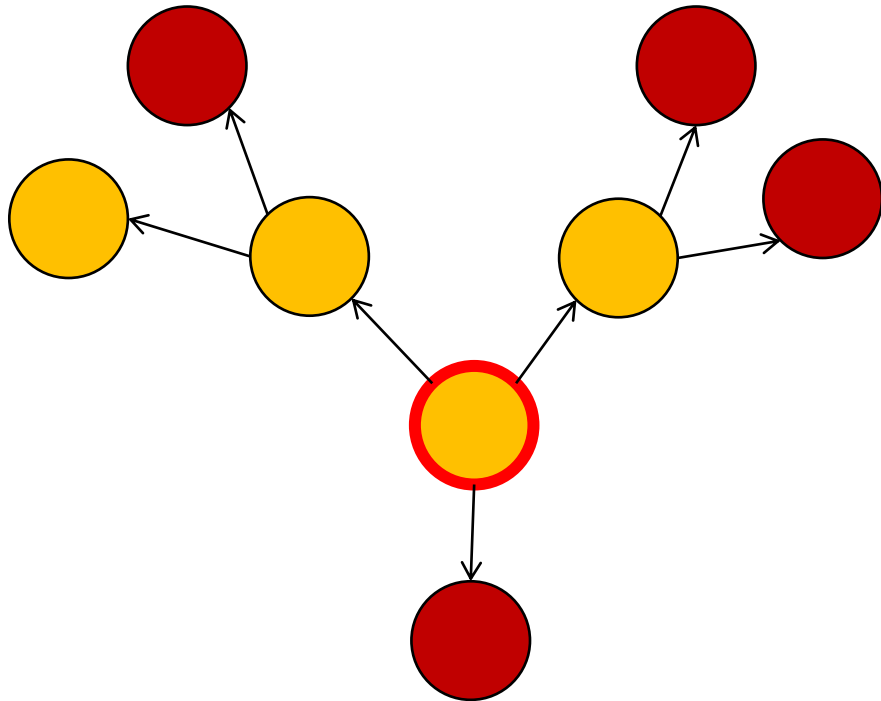
Design a distributed flooding protocol that minimizes the maximum **precision** and **recall** achievable by a computationally-unbounded adversary.

Fundamental Limits

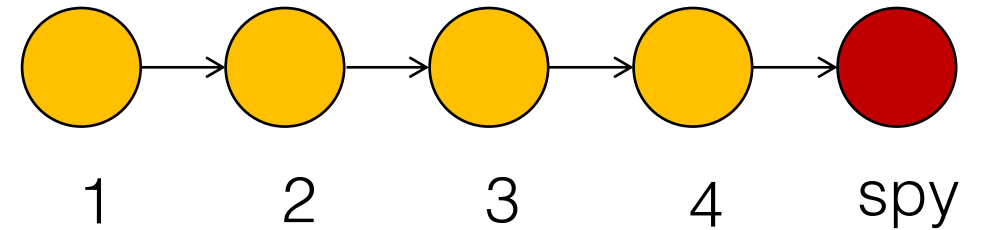


What are we looking for?

Asymmetry

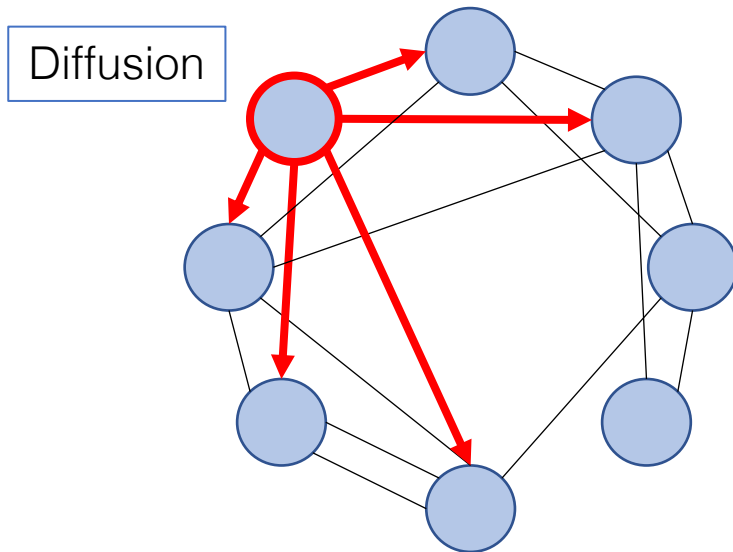


Mixing



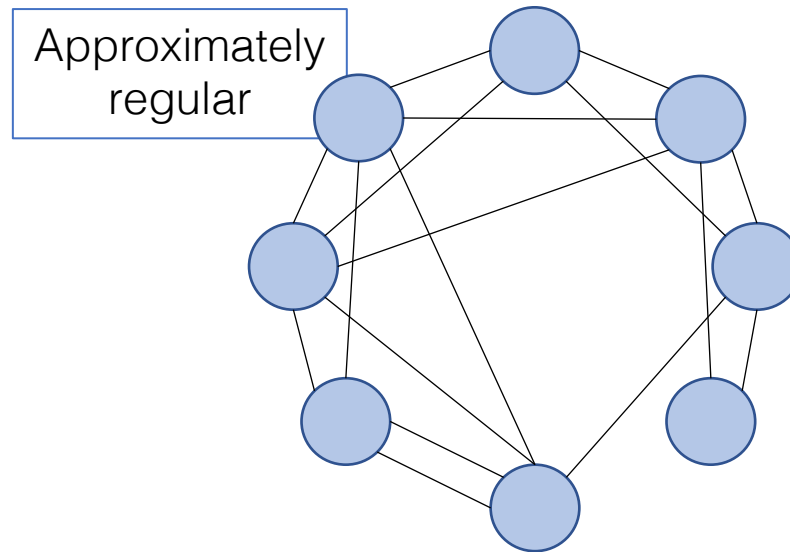
What can we control?

Spreading Protocol



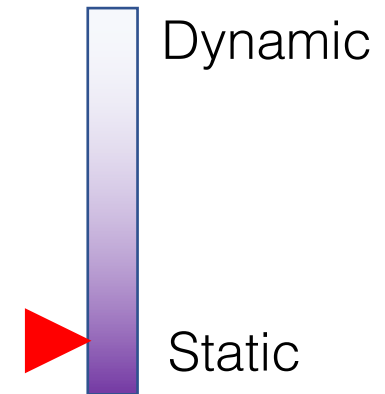
Given a graph, how do we spread content?

Topology



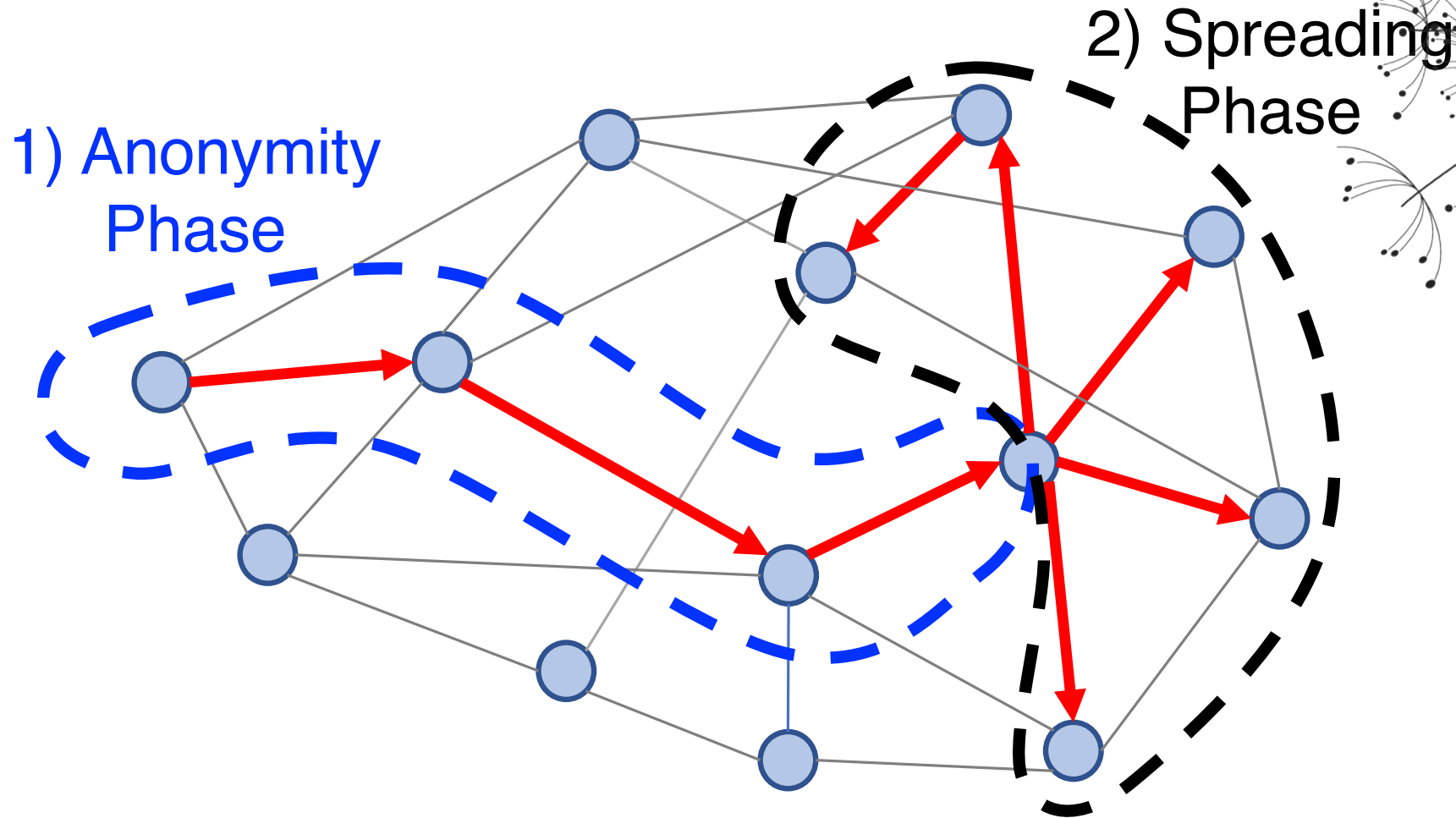
What is the underlying graph topology?

Dynamicity



How often does the graph change?

Spreading Protocol: Dandelion



Why Dandelion spreading?

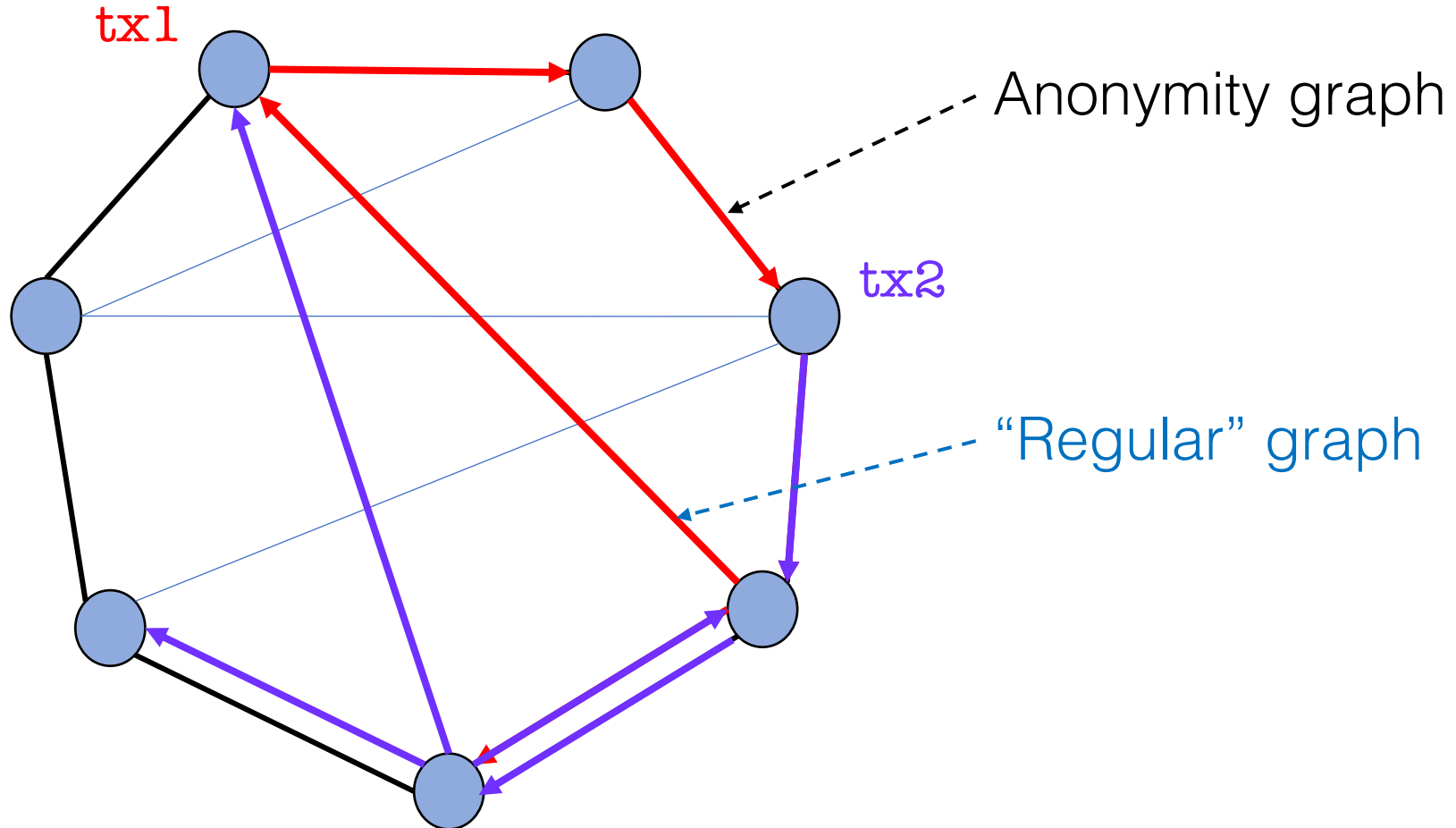
Theorem: Dandelion spreading has an **optimally low** maximum recall of $p + O\left(\frac{1}{n}\right)$.

Theorem: Fundamental lower bound = p

fraction
of spies

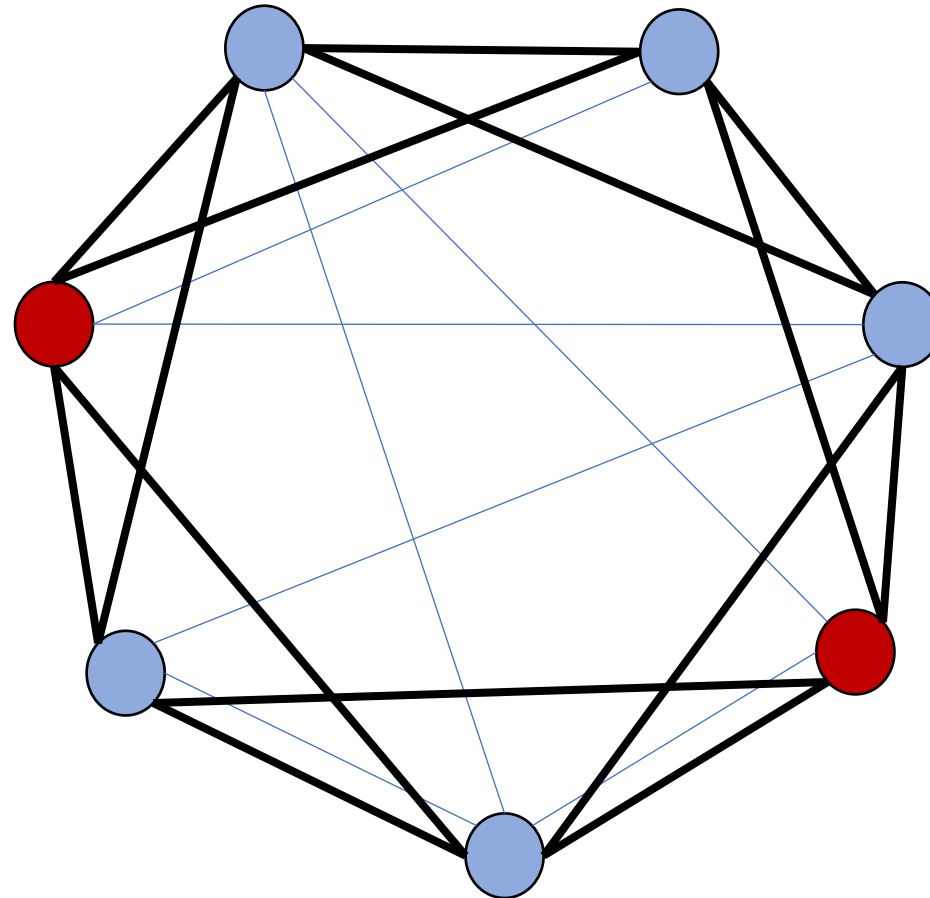
number of
nodes

Graph Topology: Line



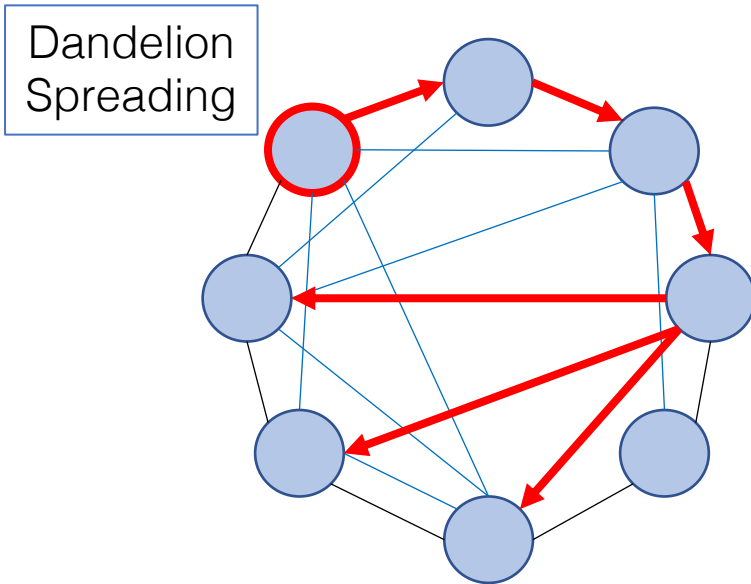
Dynamicity: High

Change the anonymity graph frequently.



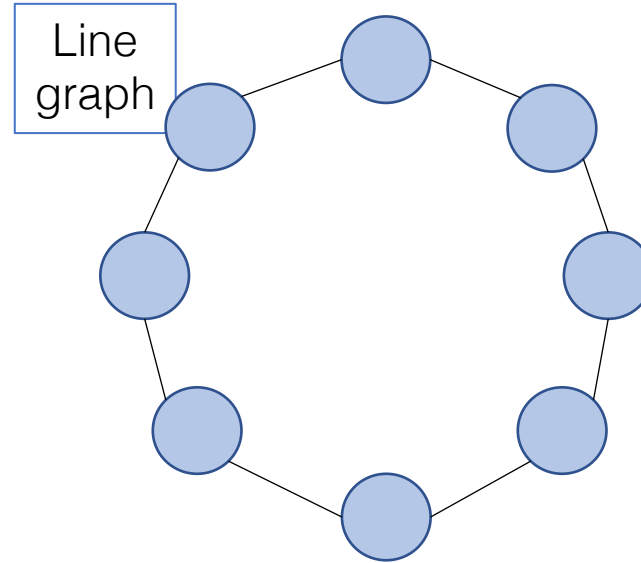
DANDELION Network Policy

Spreading Protocol



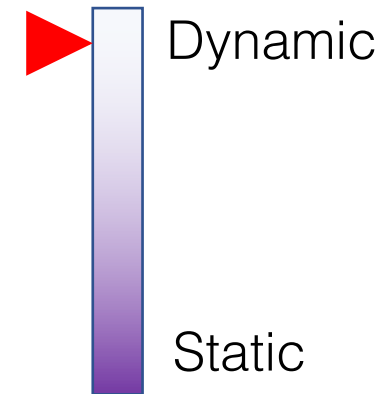
Given a graph, how do we spread content?

Topology



What is the anonymity graph topology?

Dynamicity



How often does the graph change?

Theorem: Fundamental lower bound = p^2

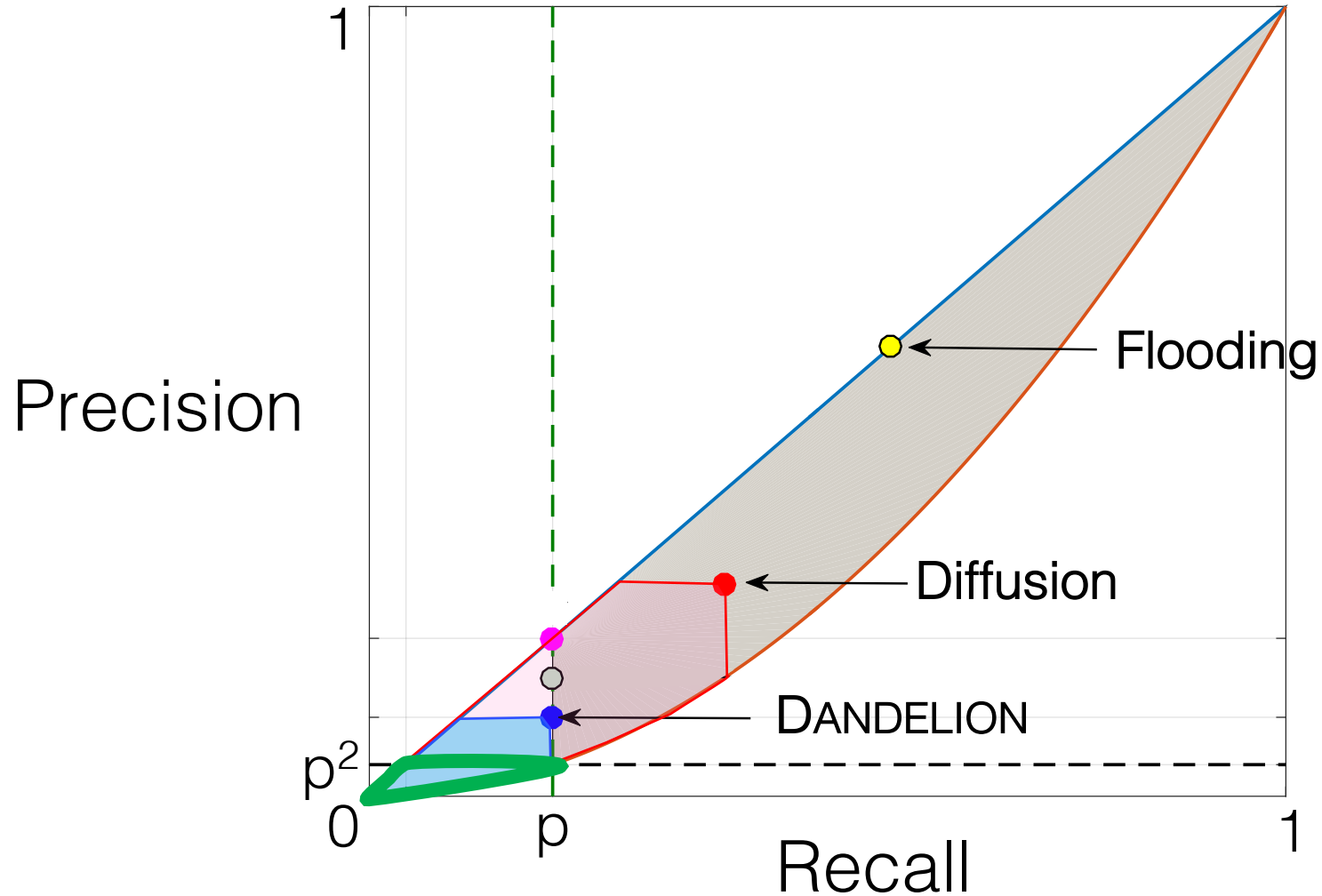
Theorem: DANDELION has a **nearly-optimal** maximum precision of $\frac{2p^2}{1-p} \log \binom{2}{p} + O\left(\frac{1}{n}\right)$.*

fraction
of spies

number of
nodes

*For $p < \frac{1}{3}$

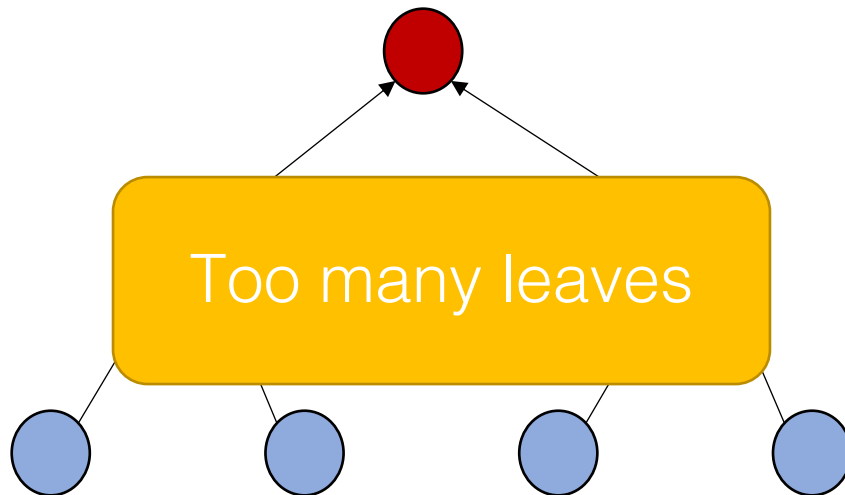
Performance: Achievable Region



Why is DANDELION good?

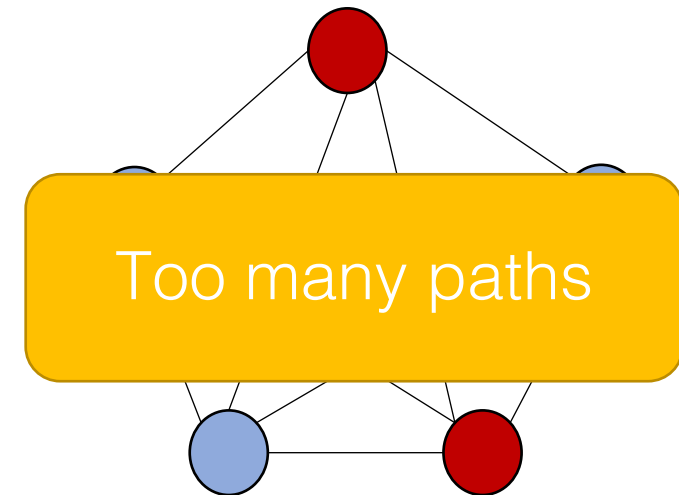
Strong mixing properties.

Tree



Precision: $O(p)$

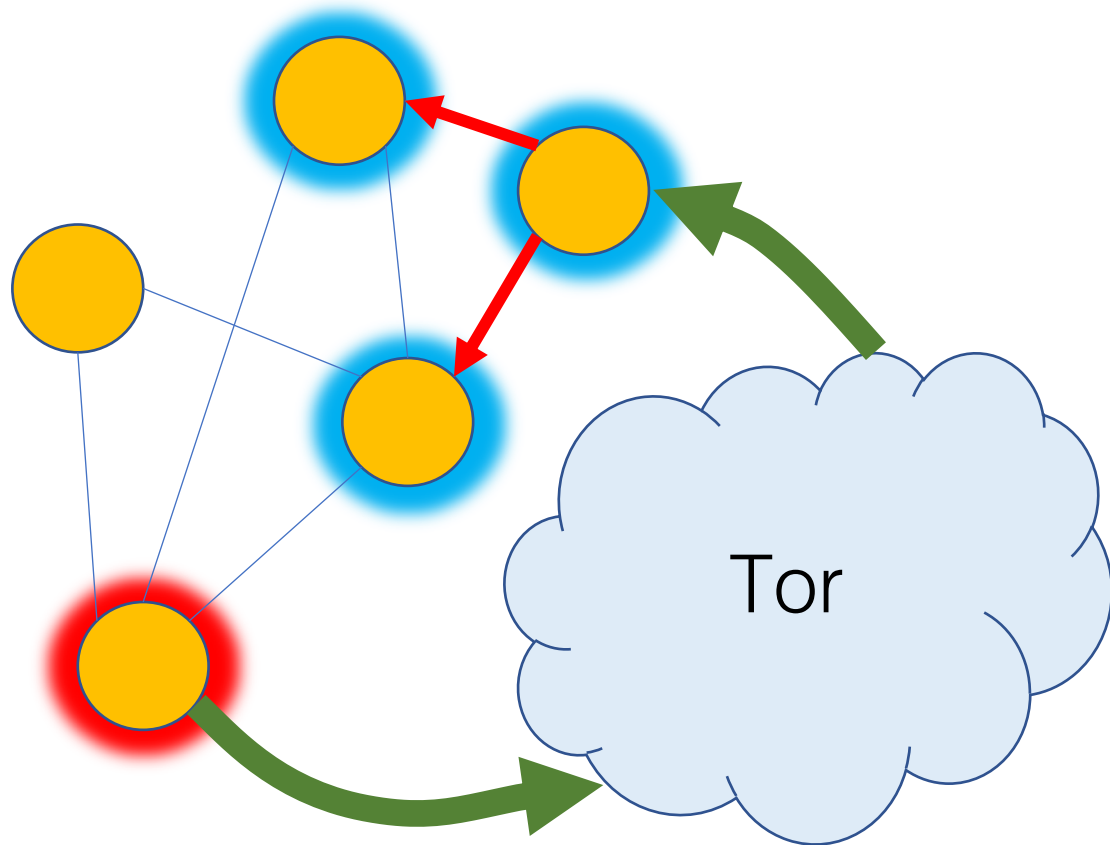
Complete graph



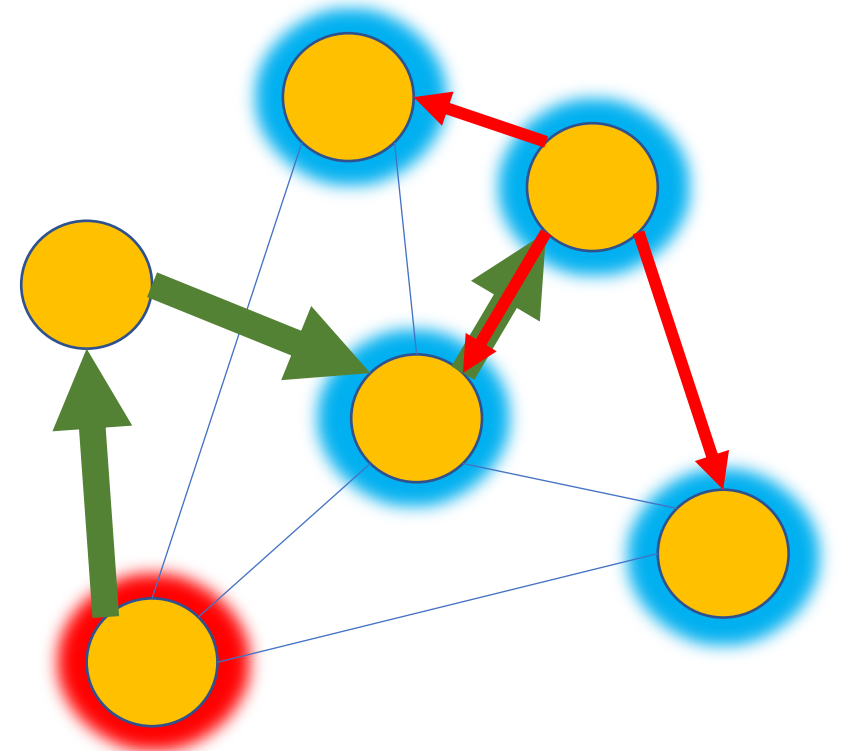
Precision: $\frac{p}{1-p} (1 - e^{p-1})$

Why not alternative solutions?

Connect through Tor

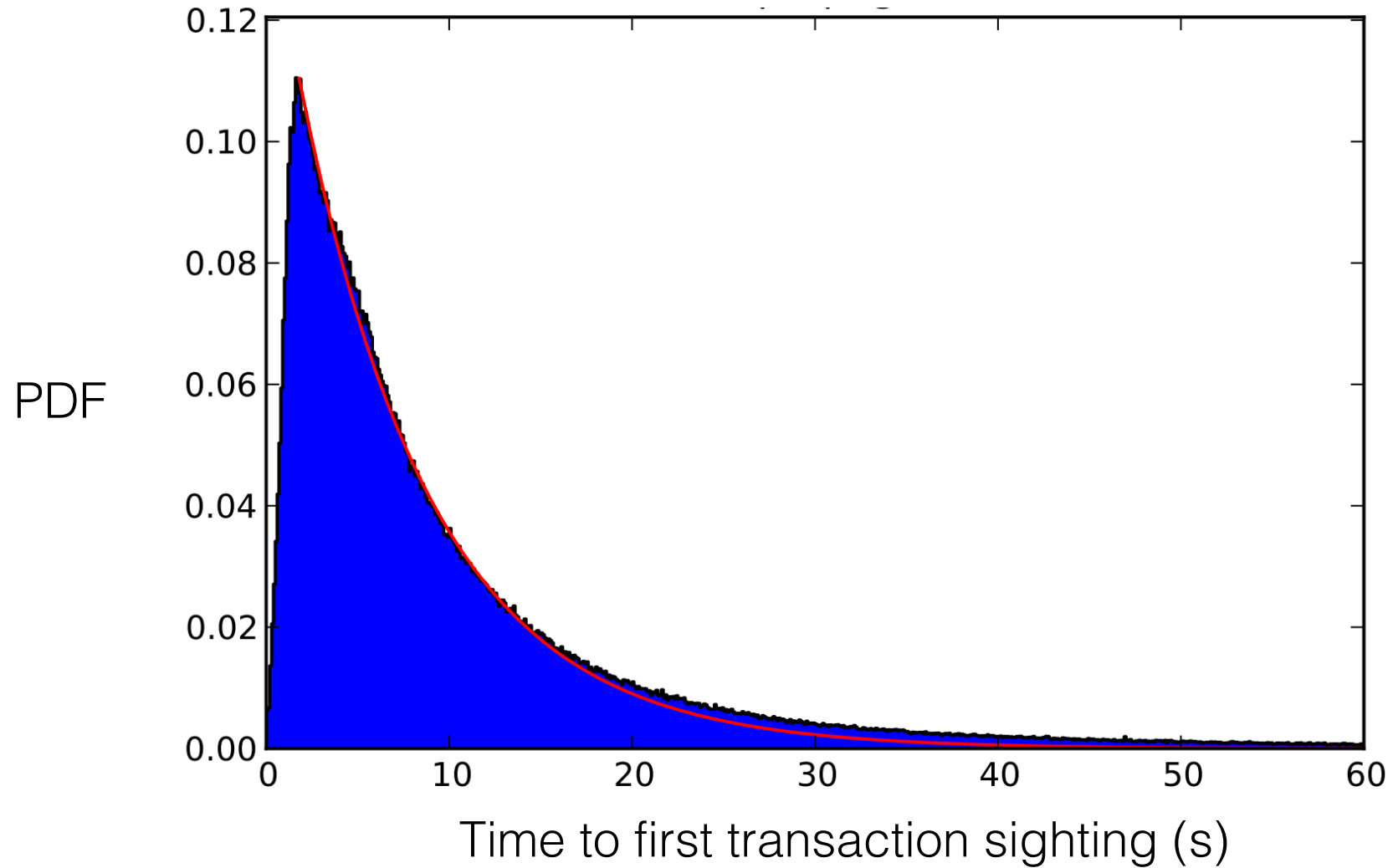


I2P Integration (e.g. Monero)

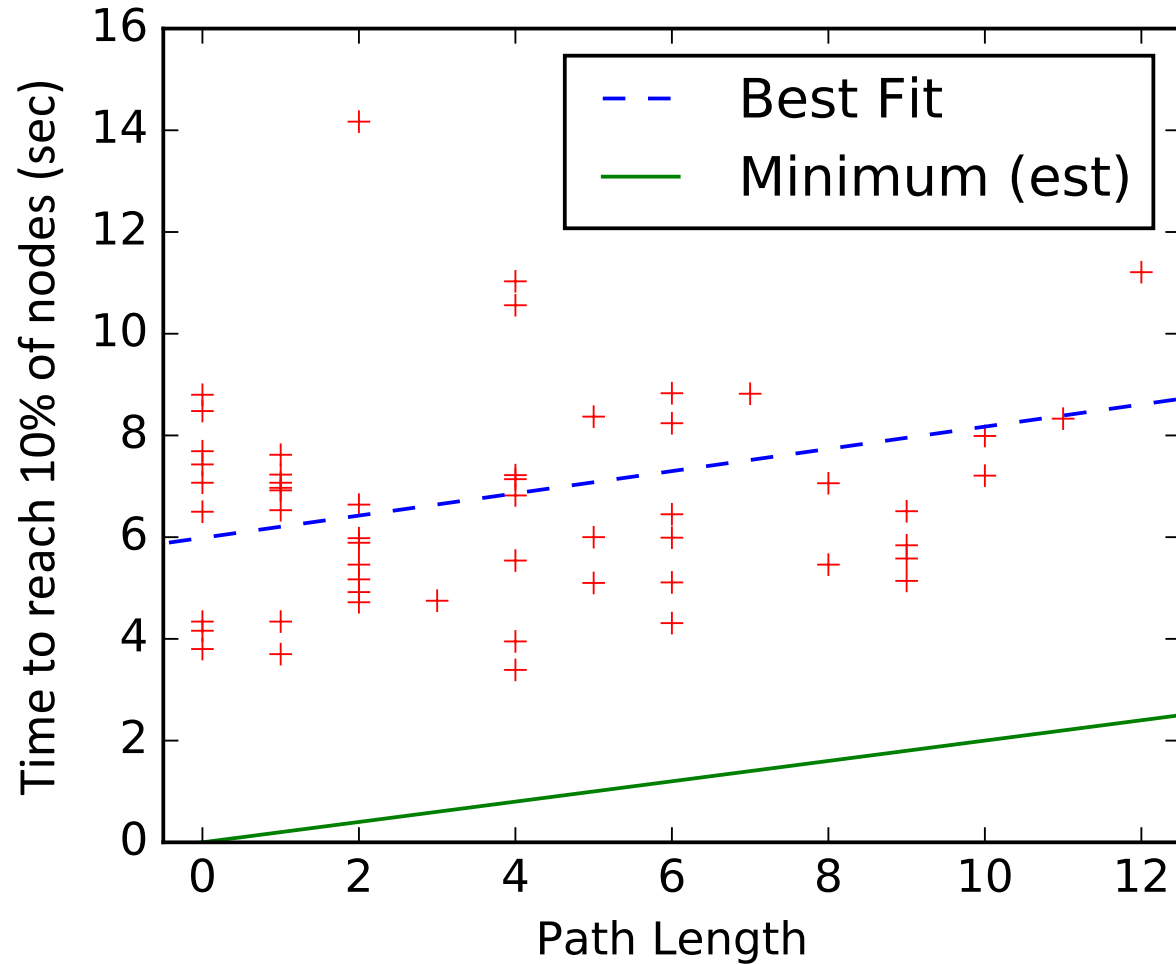


How practical is this?

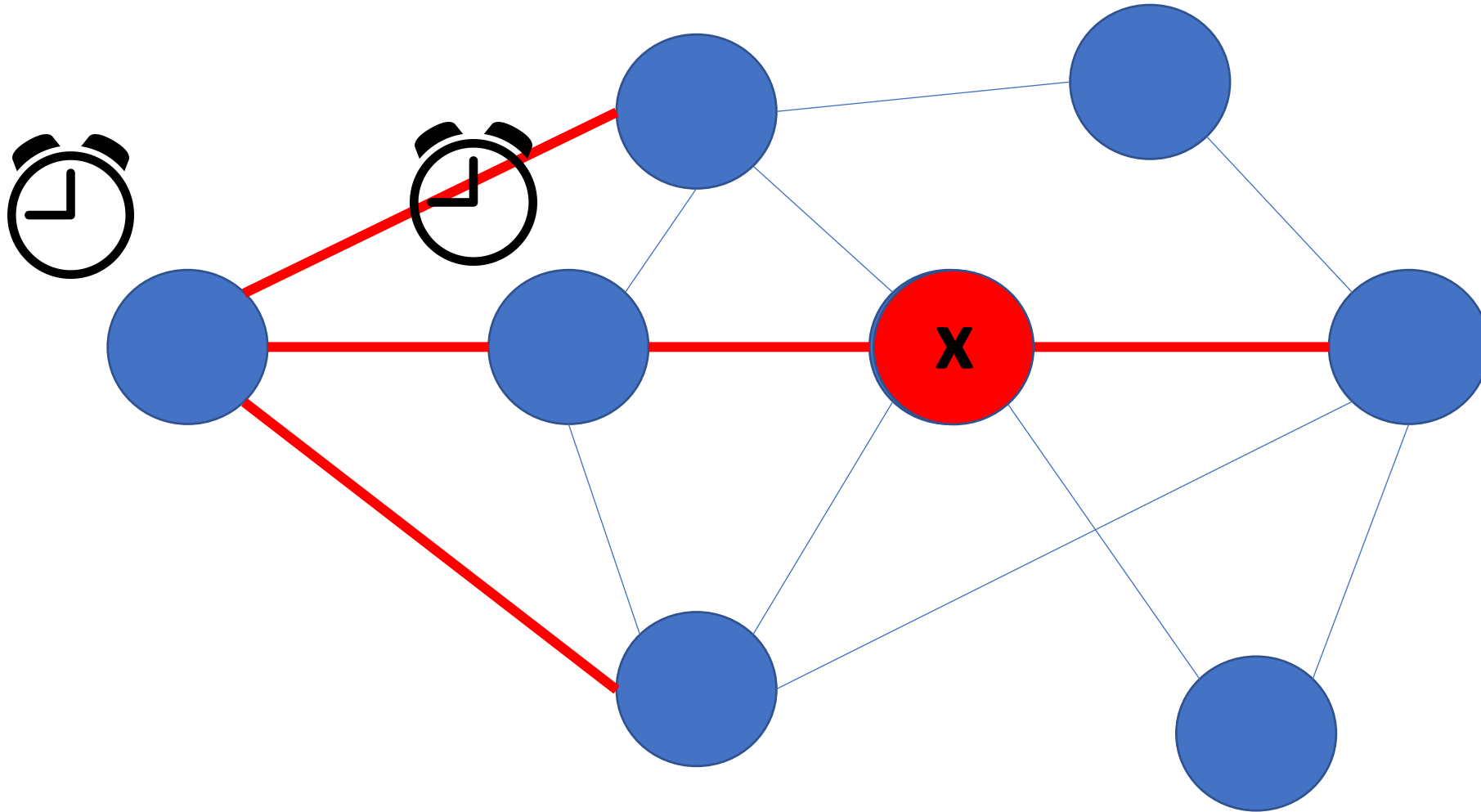
Latency Overhead: Estimate



Empirical Delay Distribution



Practical challenge: Black hole attack

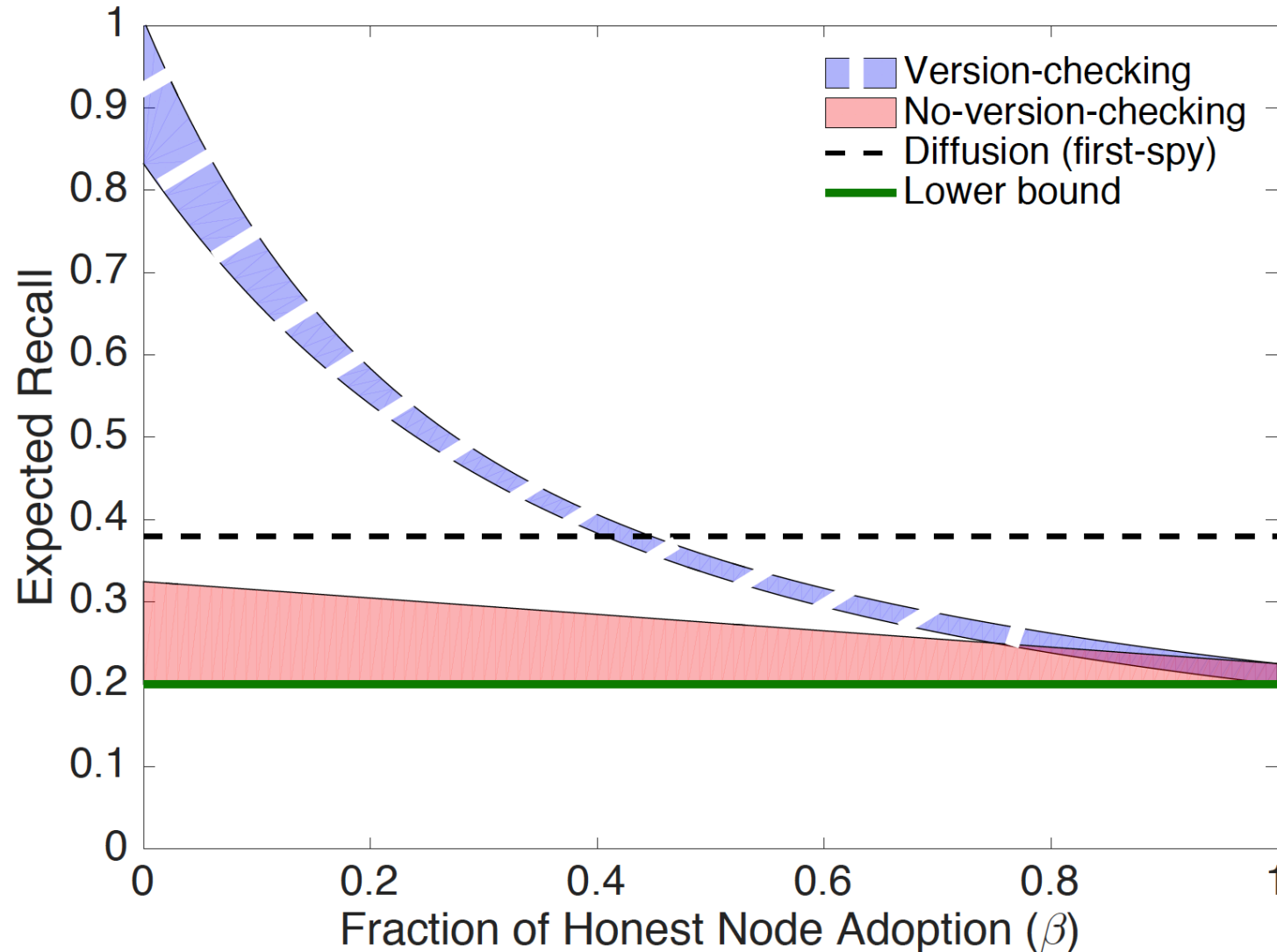


Practical Challenges: Black hole attack

When you switch a route, what happens to transactions you've already sent?

- A. Could resend sent transactions on the new route
- B. This makes RBF challenging

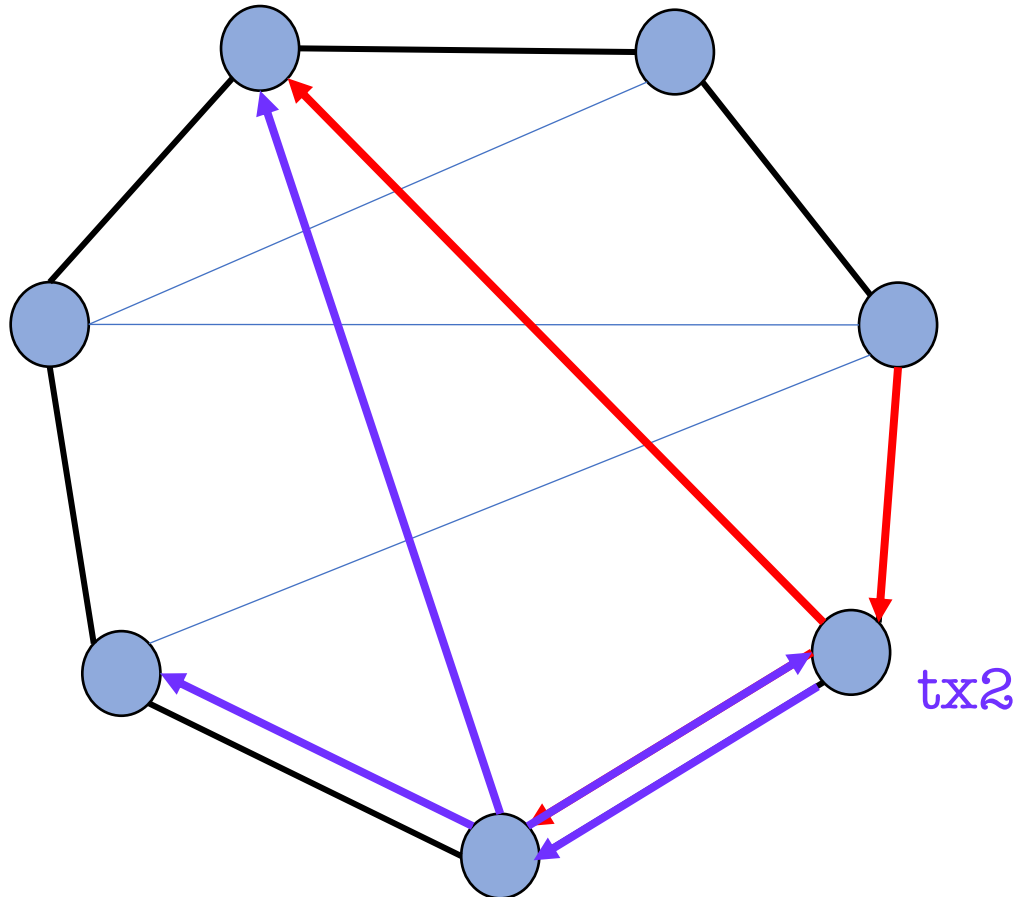
Practical Challenges: Partial deployment



End story

- Complexity/robustness seems to be a barrier

Dandelion-Lite



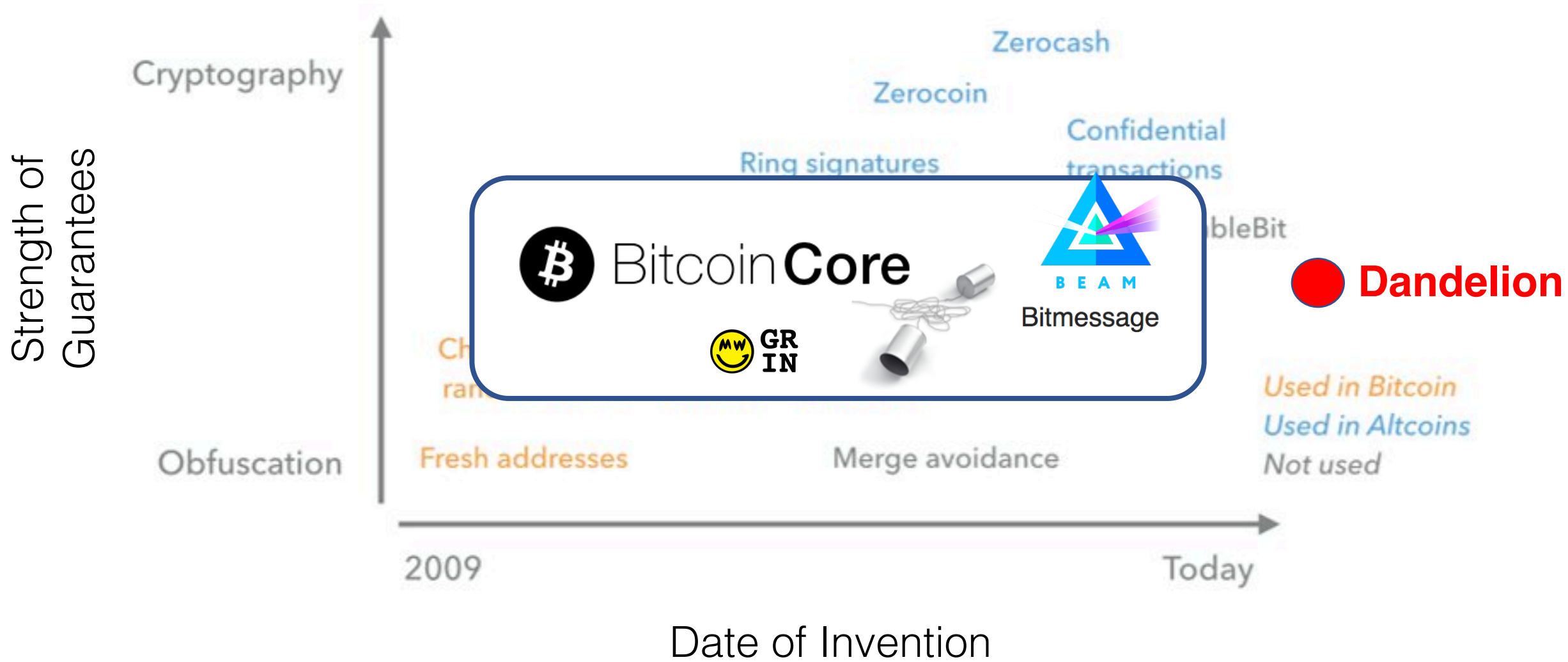
Only make 1 hop in the stem phase!

tx1

tx2

Dandelion-Lite: Privacy guarantees

- Similar guarantees to Dandelion when we assume that the adversary knows the graph
- Weaker guarantees when the adversary doesn't know the graph
- Still needed: simulations!!



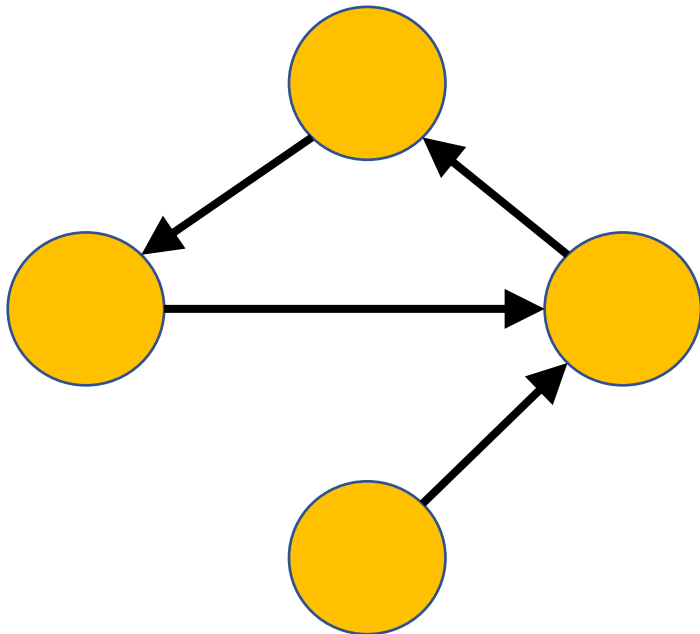
Take-Home Messages

- 1) Bitcoin's P2P network has poor anonymity.
- 2) Moving from trickle to diffusion did not help.
- 3) DANDELION may be a lightweight solution for certain classes of adversaries.

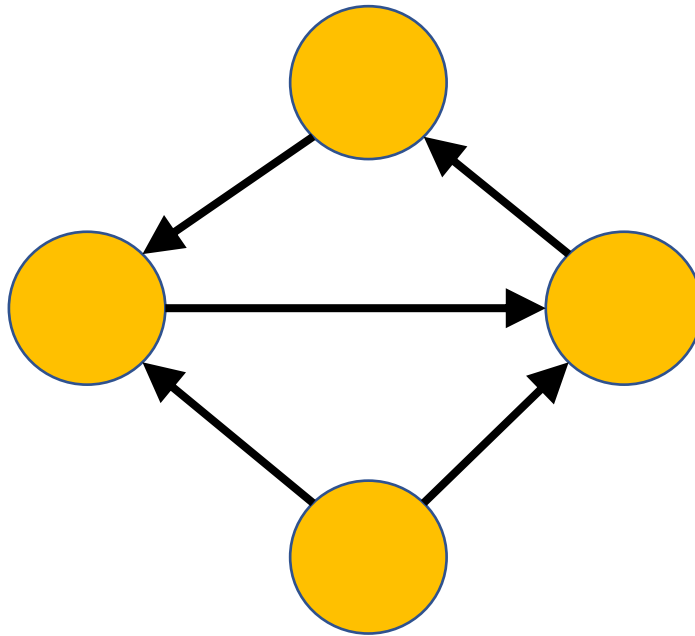
<https://github.com/dandelion-org/bitcoin>

BIP 156

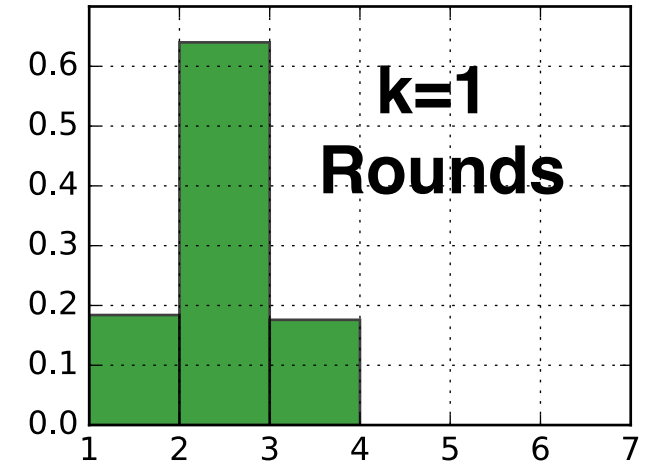
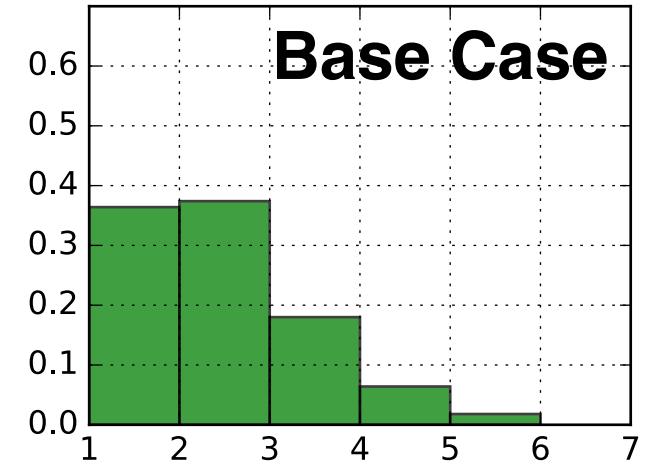
Anonymity graph construction



Base Case



**k=1 rounds of
Degree-Checking**



Degree

Dealing with stronger adversaries

Learn the graph



4-regular graphs

Misbehave during graph construction



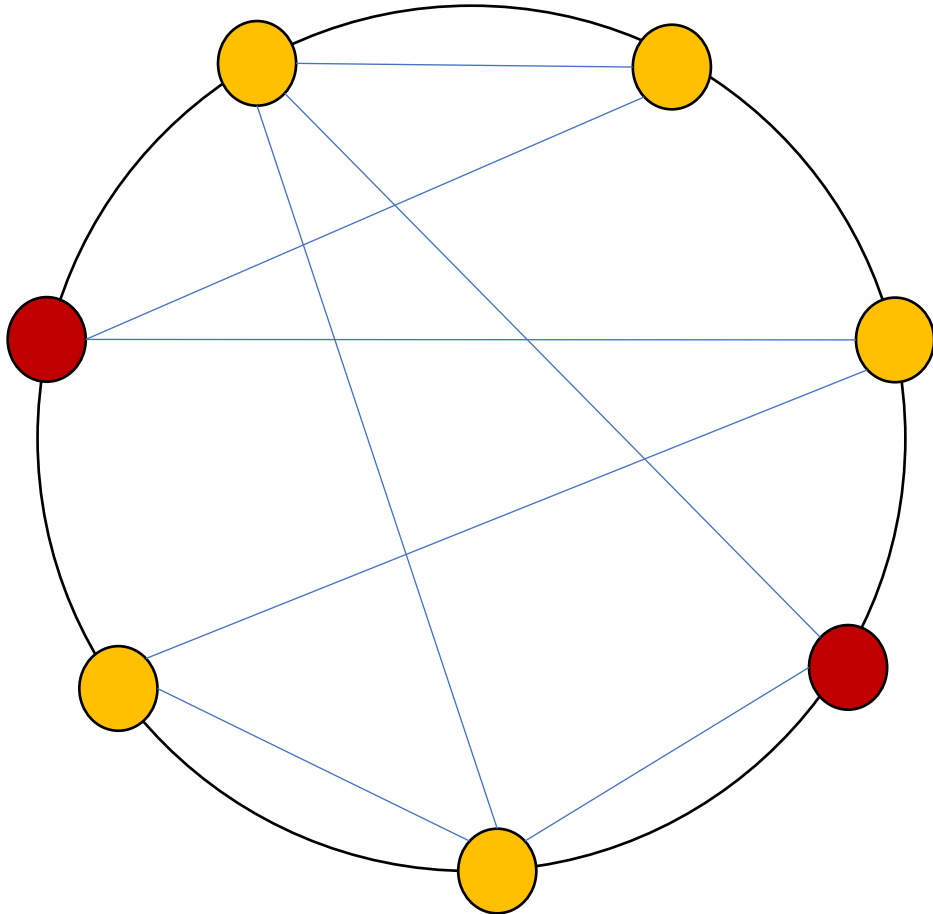
Get rid of degree-checking

Misbehave during propagation



Multiple nodes diffuse

DANDELION vs. Tor, Crowds, etc.

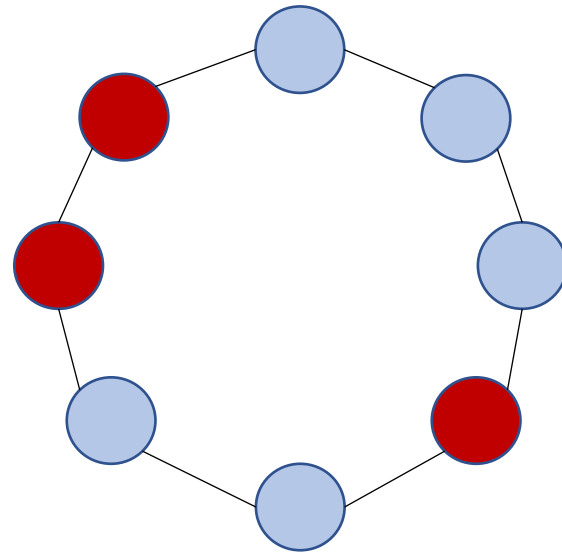


- 1) Messages propagate over the **same** cycle graph
- 2) Anonymity graph changes dynamically.
- 3) No encryption required.

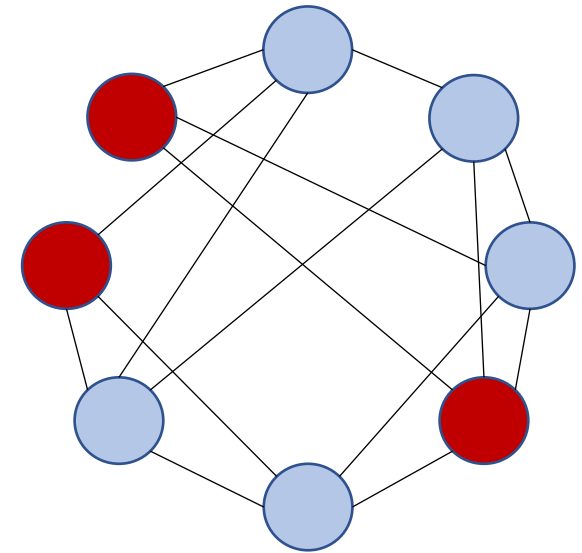
Learning the anonymity graph

Precision

Line



Random regular



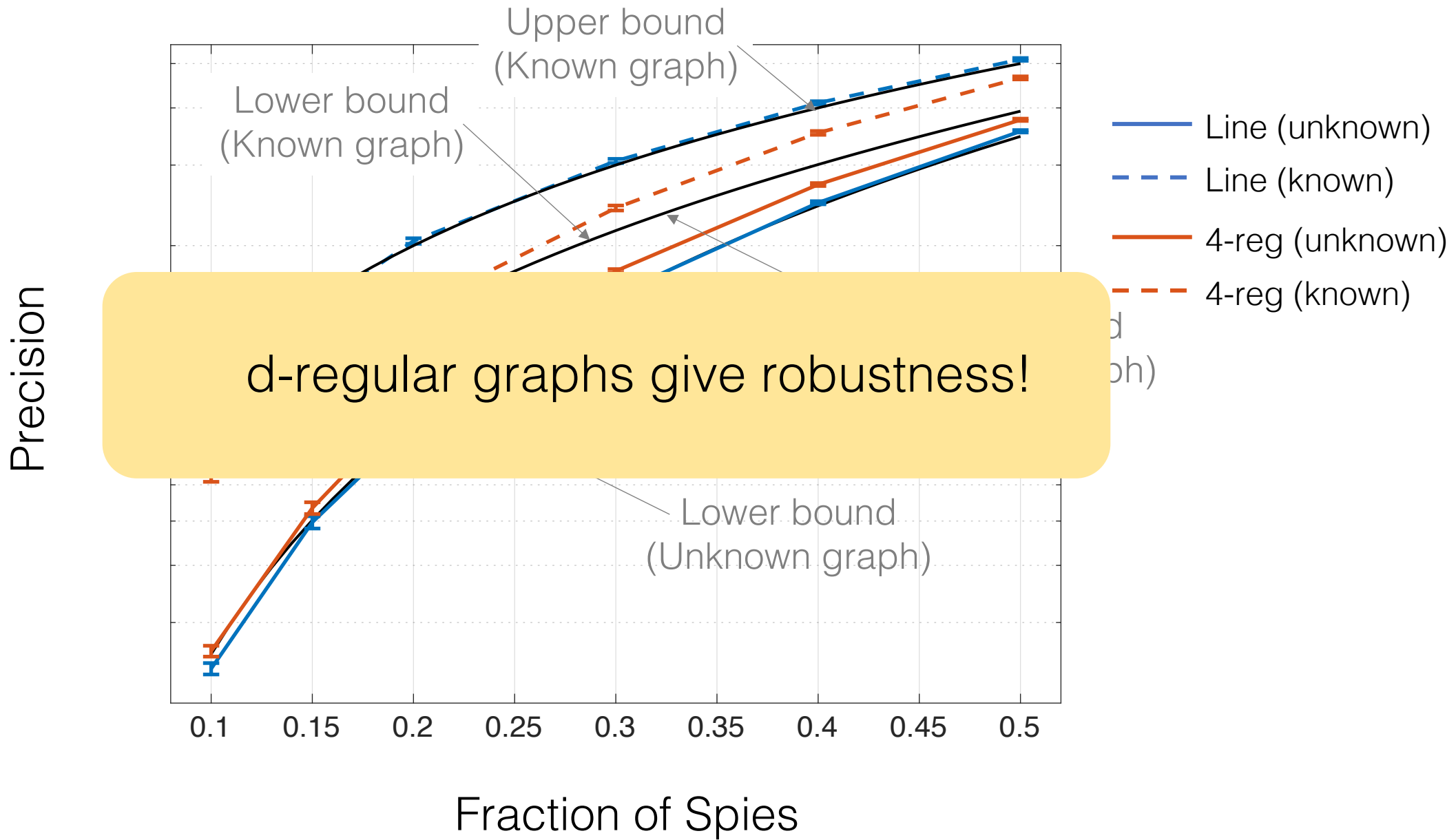
Graph unknown

$$O\left(p^2 \log\left(\frac{1}{p}\right)\right)$$

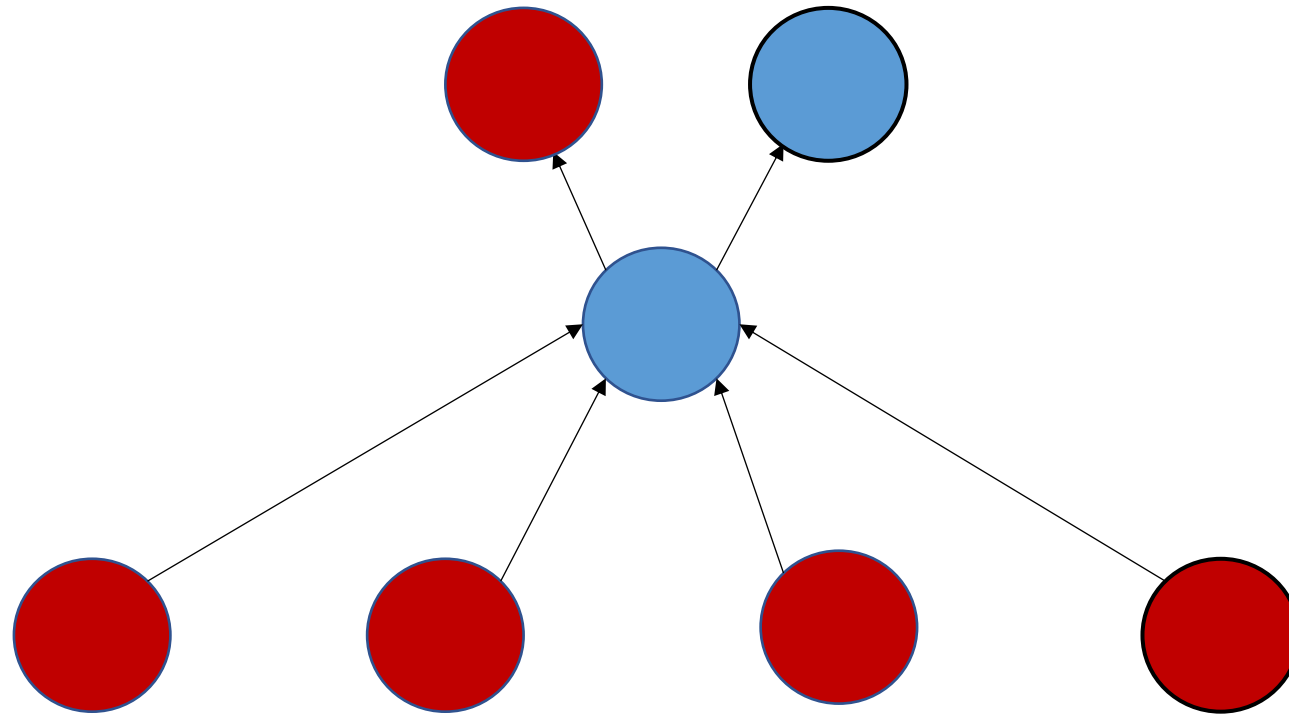
?

Graph known

$$\Omega(p)$$



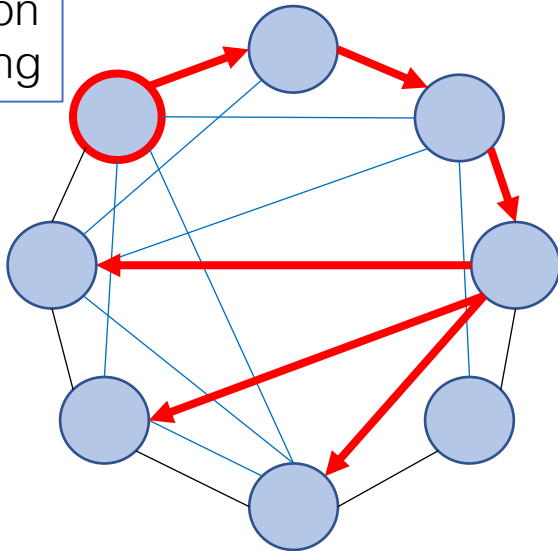
Manipulating the anonymity graph



DANDELION++ Network Policy

Spreading Protocol

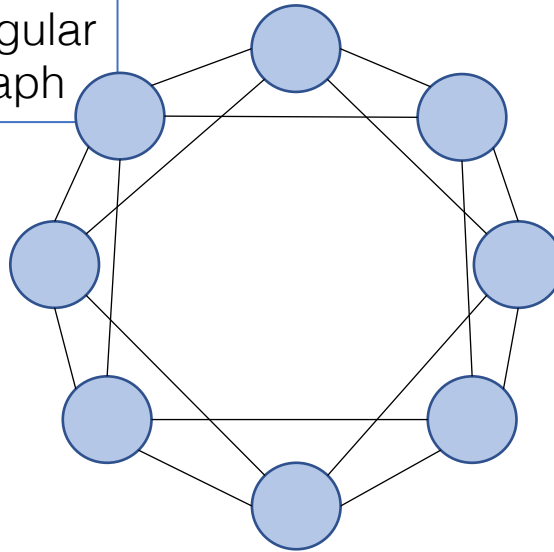
Dandelion Spreading



Given a graph, how do we spread content?

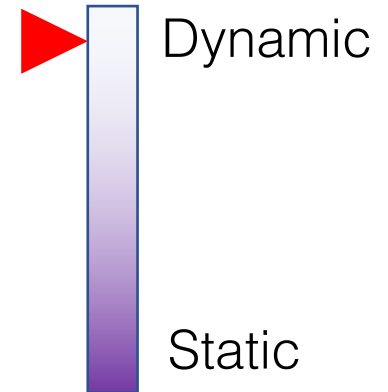
Topology

4-regular graph



What is the anonymity graph topology?

Dynamicity



How often does the graph change?