

# NEXT GENERATION INTERNET

## Anonymity

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# Learning Objectives

What is Anonymity?

How can we achieve anonymity on the Internet?

How does onion routing work?

Advanced Cryptographic Primitives

Secure Multiparty Computation

## Part I: What is Anonymity?

# Motivation



Suppose Alice and Bob communicate using encryption.

What can Eve still learn here?

# How much does TLS leak?

“We present a traffic analysis attack against over 6000 webpages spanning the HTTPS deployments of 10 widely used, industry-leading websites in areas such as healthcare, finance, legal services and streaming video. Our attack **identifies individual pages** in the same website with 89% accuracy, exposing personal details including **medical conditions**, financial and **legal affairs** and **sexual orientation**. We examine evaluation methodology and reveal accuracy variations as large as 18% caused by assumptions affecting caching and cookies.” [15]

# Anonymity definitions

Merriam-Webster:

1. not named or identified: “an anonymous author”, “they wish to remain anonymous”
2. of unknown authorship or origin: “an anonymous tip”
3. lacking individuality, distinction, or recognizability: “the anonymous faces in the crowd”, “the gray anonymous streets” – William Styron

# Anonymity definitions

Andreas Pfitzmann et. al.:

“Anonymity is the state of being not identifiable within a set of subjects, the anonymity set.”

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Our definition:

**A user's action is anonymous if the adversary cannot link the action to the user's identity**

# The user's identity

includes personally identifiable information, such as:

- ▶ real name
- ▶ fingerprint
- ▶ passport number
- ▶ IP address
- ▶ MAC address
- ▶ login name
- ▶ ...

# Actions

include:

- ▶ Internet access
- ▶ speak
- ▶ participation in demonstration
- ▶ purchase in a store
- ▶ walking across the street
- ▶ ...

# Anonymity: Terminology

- ▶ Sender Anonymity: The initiator of a message is anonymous. However, there may be a path back to the initiator.

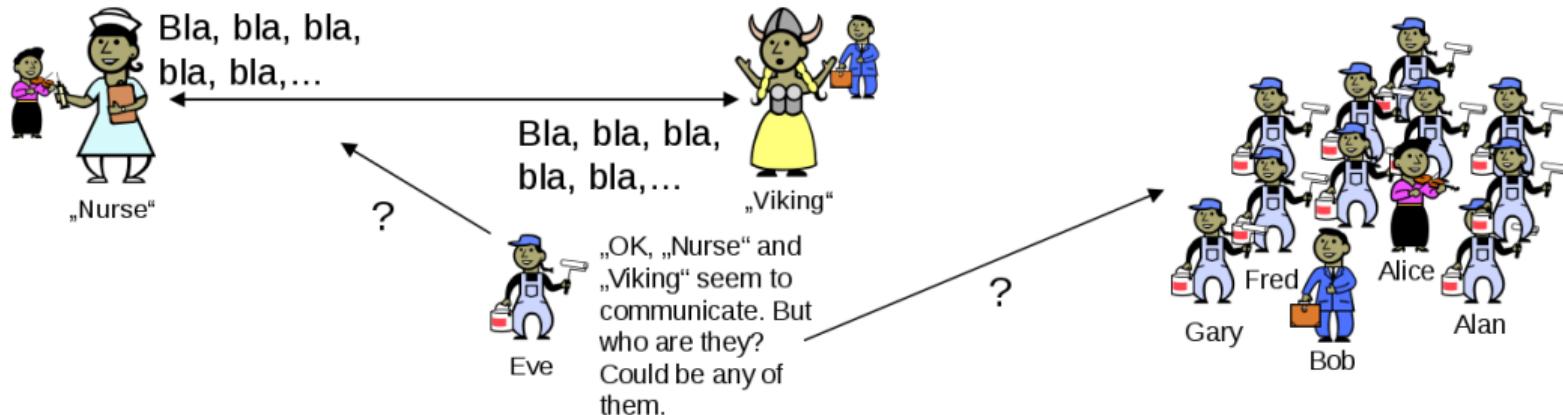


- ▶ Receiver Anonymity: The receiver of a message is anonymous.



# Pseudonymity

A pseudonym is an alternative name for an entity in the system.



A pseudonym can be tracked. We can observe its behaviour, but we should not learn the identity of who is behind it.

# Evaluating anonymity

How much anonymity does a given system provide?

- ▶ Number of known attacks?
- ▶ Lowest complexity of successful attacks?
- ▶ Number of users?
- ▶ Information leaked through messages and maintenance procedures?

# Anonymity: Basics

- ▶ **Anonymity Set** is the set of suspects
- ▶ Attacker computes a **probability distribution** describing the likelihood of each participant to be the responsible party.
- ▶ Anonymity is the stronger, the larger the anonymity set and the more evenly distributed the subjects within that set are.

# Anonymity metric: Anonymity Set Size

Let  $\mathcal{U}$  be the attacker's probability distribution and  $p_u = \mathcal{U}(u)$  describing the probability that user  $u \in \Psi$  is responsible.

$$\text{ASS} := \sum_{\substack{u \in \Psi \\ p_u > 0}} 1 \quad (1)$$

# Large anonymity sets

Examples of large anonymity sets:

- ▶ Any human

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- ▶ Any human
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- ▶ Any human
- ▶ Any human with Internet access
- ▶ Any human speaking German
- ▶ Any human speaking German with Internet access awake at 3am CEST

# Anonymity metric: Maximum Likelihood

Let  $\mathcal{U}$  be the attacker's probability distribution describing the probability that user  $u \in \Psi$  is responsible.

$$ML := \max_{u \in \Psi} p_u \quad (2)$$

# Anonymity metric: Maximum Likelihood

- ▶ For successful criminal prosecution in the US, the law requires  $ML$  close to 1 (“beyond reasonable doubt”)
- ▶ For successful civil prosecution in the US, the law requires  $ML > \frac{1}{2}$  (“more likely than not”)
- ▶ For a given anonymity set, the best anonymity is achieved if

$$ML = \frac{1}{ASS} \tag{3}$$

# Anonymity metric: Entropy

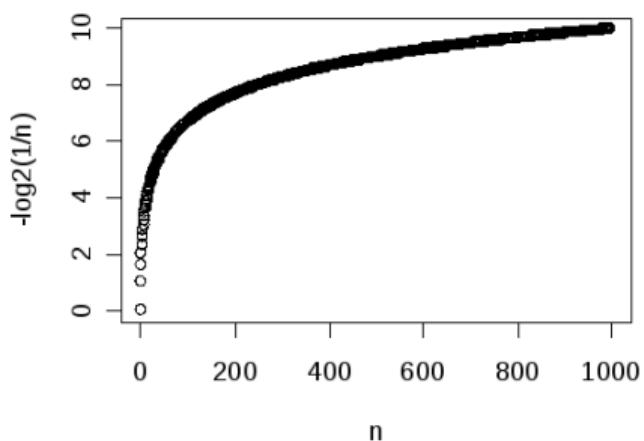
Let  $\mathcal{U}$  be the attacker's probability distribution describing the probability that user  $u \in \Psi$  is responsible. Define the effective size  $S$  of the anonymity distribution  $\mathcal{U}$  to be:

$$S := - \sum_{u \in \Psi} p_u \log_2 p_u \tag{4}$$

where  $p_u = \mathcal{U}(u)$ .

# Interpretation of entropy

$$S = - \sum_{u \in \Psi} p_u \log_2 p_u \quad (5)$$



# Entropy calculation example

Suppose we have 101 suspects including Bob. Furthermore, suppose for Bob the attacker has a probability of 0.9 and for all the 100 other suspects the probability is 0.001.

What is  $S$ ?

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Suppose we have 101 suspects including Bob. Furthermore, suppose for Bob the attacker has a probability of 0.9 and for all the 100 other suspects the probability is 0.001.

What is  $S$ ?

- ▶ For 101 nodes  $H_{max} = 6.7$
- ▶

$$S = -\frac{100 \cdot \log_2 0.001}{1000} - \frac{9 \cdot \log_2 0.9}{10} \quad (6)$$

$$\approx 0.9965 + 0.1368 \quad (7)$$

$$= 1.133... \quad (8)$$

# Attacks to avoid

Hopeless situations include:

- ▶ All nodes collaborate against the user
- ▶ All directly adjacent nodes collaborate
- ▶ All non-collaborating adjacent nodes are made unreachable from the user
- ▶ The user is required to prove her innocence

# Economics & Anonymity

There are hard issues in *the Economics of Anonymity* [1]:

- ▶ Providing anonymity services has economic disincentives (DoS, legal liability)
- ▶ Anonymity requires introducing inefficiencies!
- ⇒ Who pays for that?

# Economics & Anonymity

There are hard issues in *the Economics of Anonymity* [1]:

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# Anonymity Trilemma

The Anonymity Trilemma [7] states that given the objectives of:

- ▶ Strong anonymity
- ▶ Low bandwidth overhead
- ▶ Low latency

... one can only have two of the three.



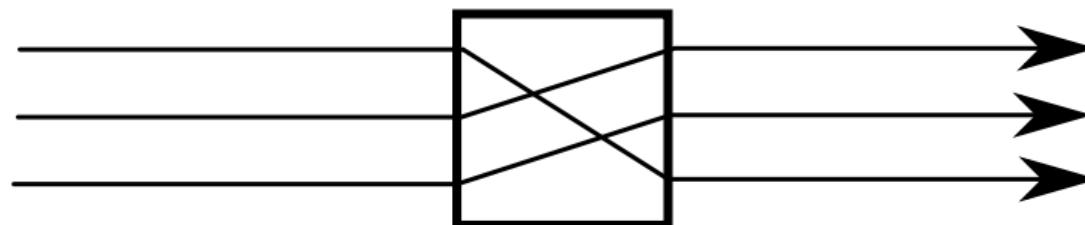
## Part II: How to achieve anonymity?

# Anonymity: Dining Cryptographers

“Three cryptographers are sitting down to dinner. The waiter informs them that the bill will be paid anonymously. One of the cryptographers maybe paying for dinner, or it might be the NSA. The three cryptographers respect each other’s right to make an anonymous payment, but they wonder if the NSA is paying.” – David Chaum

# Mixing

David Chaum's mix (1981) and cascades of mixes are the traditional basis for destroying linkability:

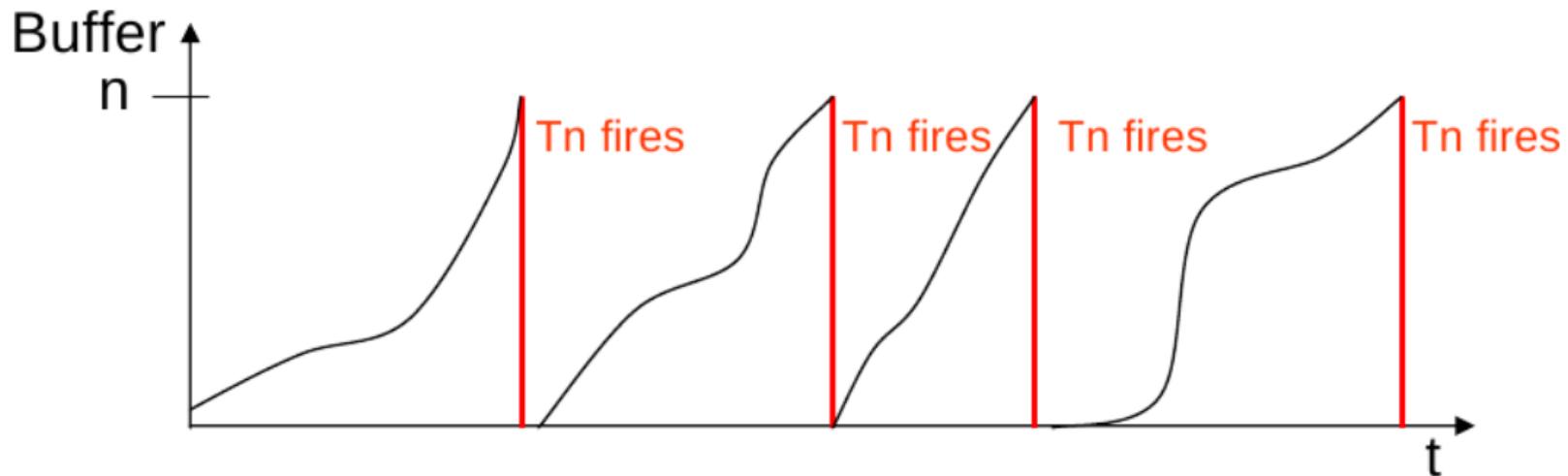


# Mixing

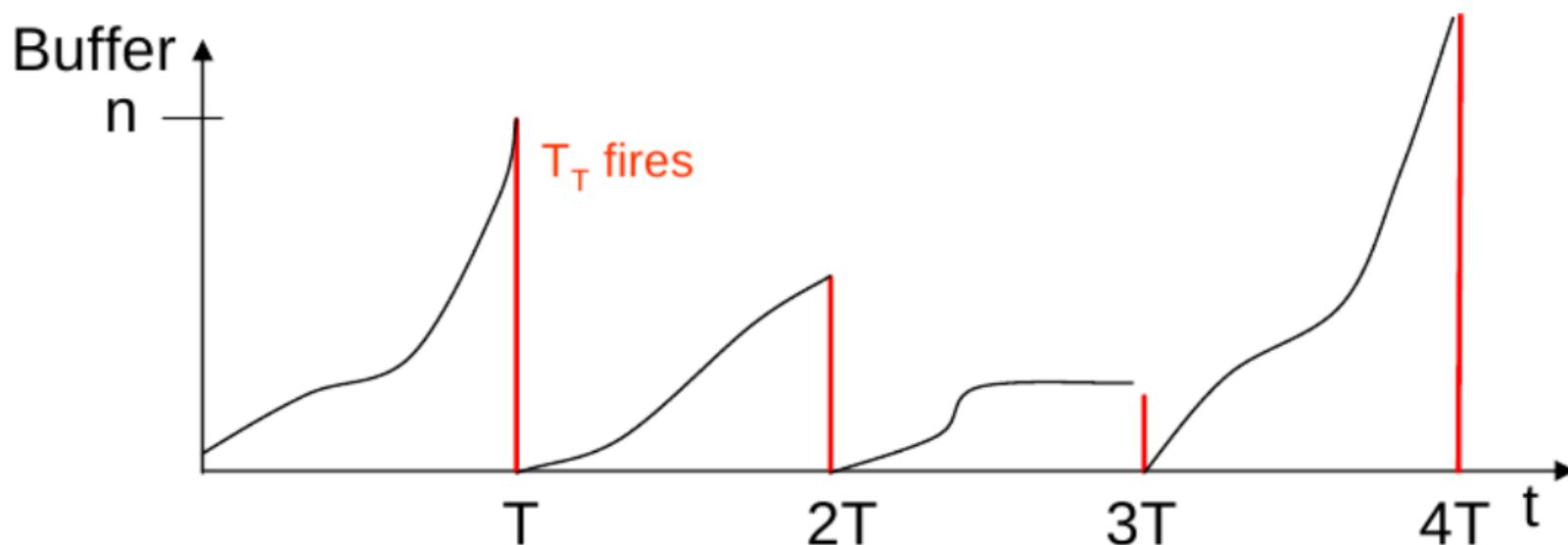
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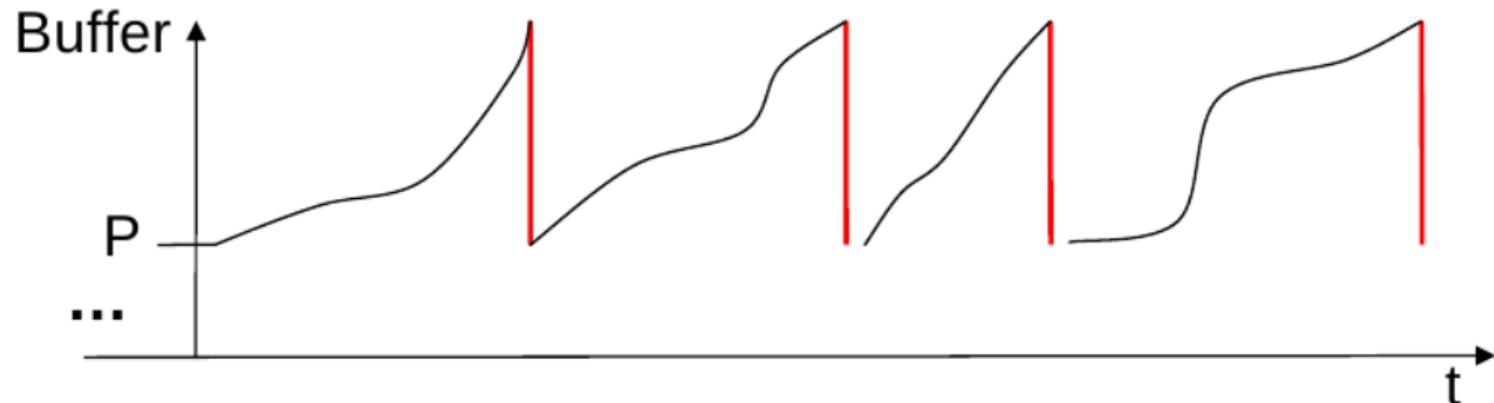
# Threshold Mix



## Timed Mix



# Pool mix



# Mixminion

G. Danezis, R. Dingledine, D. Hopwood and N. Mathewson describe Mixminion [5]:

- ▶ builds on the idea of remailers: Mixes for E-mail
- ▶ possibility to reply
- ▶ directory servers to evaluate participating remailers (reputation system)
- ▶ exit policies
- ▶ dummy traffic

# Mixminion: key ideas

When a message traverses mixminion, each node must decrypt the message using its (ephemeral) private key.

The key idea behind **replies** is splitting the path into two legs:

- ▶ the first half is chosen by the responder to hide the responder identity
- ▶ the second half was communicated by the receiver to hide the receiver identity
- ▶ a crossover-node in the middle is used to switch the headers specifying the path

# Mixminion: replay?

Replay attacks were an issue in previous mixnet implementations.

- ▶ Mixes are vulnerable to replay attacks
- ▶ Mixminion: servers keep hash of previously processed messages until the server key is rotated
- ⇒ Bounded amount of state in the server, no possibility for replay attack due to key rotation

# Mixminion: Directory Servers

- ▶ Inform users about servers
- ▶ Probe servers for reliability
- ▶ Allow a partitioning attack unless the user always queries all directory servers for everything

# Mixminion: Nymservers

- ▶ Nymservers keep list of use-once reply blocks for a user
- ▶ Vulnerable to DoS attacks (deplete reply blocks)
- ▶ Nymservers could also store mail (use one reply block for many messages).

# Mixminion: obvious problems

- ▶ no benefits for running a mixmailer for the operator
- ▶ quite a bit of public key cryptography
- ▶ trustworthiness of directory servers questionable
- ▶ servers must keep significant (but bounded) amount of state
- ▶ limited to E-mail (high latency)

# Mixminion: open problems

- ▶ exit nodes are fair game for legal actions
- ▶ no accounting to defend against abuse / DoS attacks
- ▶ statistical correlation of entities communicating over time possible (observe participation)
- ⇒ bridging between an anonymous network and a traditional protocol is difficult

Subsequent remailer research has focused on improving the cryptography [6, 16] and integrating economic incentives for operators [8].

<https://nymtech.com/> and <https://github.com/katzenpost/katzenpost> are modern examples.

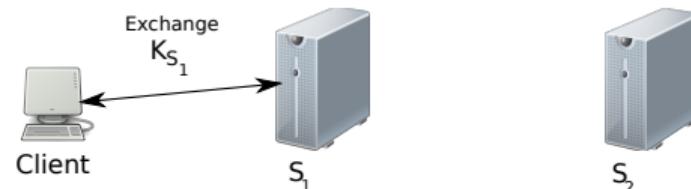
## Part III: Onion Routing

# Onion Routing

- ▶ Multiple mix servers
- ▶ Path of mix servers chosen by initiator
- ▶ Chosen mix servers create “circuit”
  - ▶ Initiator contacts first server  $S_1$ , sets up symmetric key  $K_{S_1}$
  - ▶ Then asks first server to connect to second server  $S_2$ ; through this connection sets up symmetric key with second server  $K_{S_2}$
  - ▶ ...
  - ▶ Repeat with server  $S_i$  until circuit of desired length  $n$  constructed

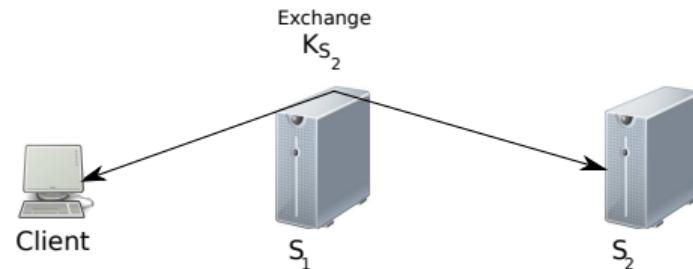
# Onion Routing Example

- ▶ Client sets up symmetric key  $K_{S_1}$  with server  $S_1$



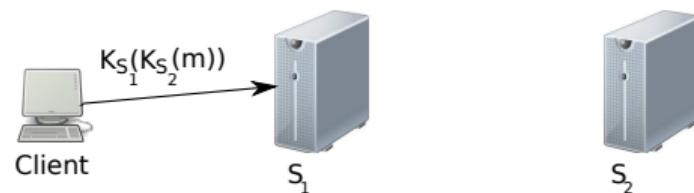
# Onion Routing Example

- ▶ Via  $S_1$ , the client sets up symmetric key  $K_{S_2}$  with server  $S_2$



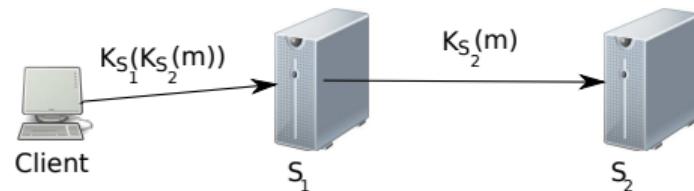
# Onion Routing Example

- ▶ Client encrypts  $m$  as  $E(K_{S_1}, E(K_{S_2}, (m)))$  and sends to  $S_1$



# Onion Routing Example

- ▶ Server  $S_1$  decrypts and forwards  $E(K_{S_2}, (m))$  to  $S_2$ .



- ▶  $S_2$  decrypts, revealing  $m$ .

## Tor [9]

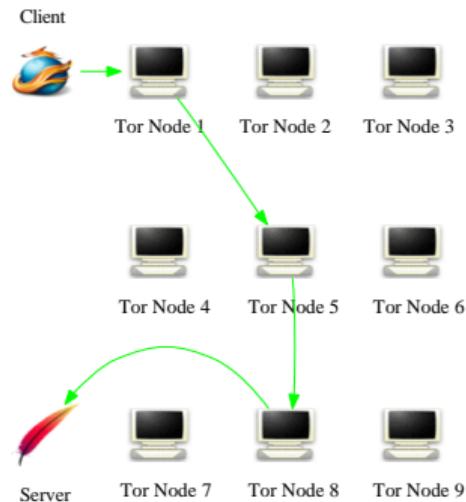
- ▶ Tor is a P2P network of **low-latency** mixes which use onion routing to provide anonymous communication between parties on the Internet.
- ▶ Tor works for any TCP-based protocol and is designed for interactive traffic (https, ssh, etc.)
- ▶ TCP traffic enters the Tor network via a SOCKS proxy
- ▶ **Common usage:** client anonymity for Web browsing

# Tor - How it Works

- ▶ "Directory Servers" store list of participating servers
  - ▶ Contact information, public keys, statistics
  - ▶ Directory servers are replicated for security
- ▶ Clients choose servers randomly with bias towards high BW/uptime
- ▶ Clients build long lived Onion routes "circuits" using these servers
- ▶ Circuits are bi-directional
- ▶ Circuits are of length three

# Tor - How it Works - Example

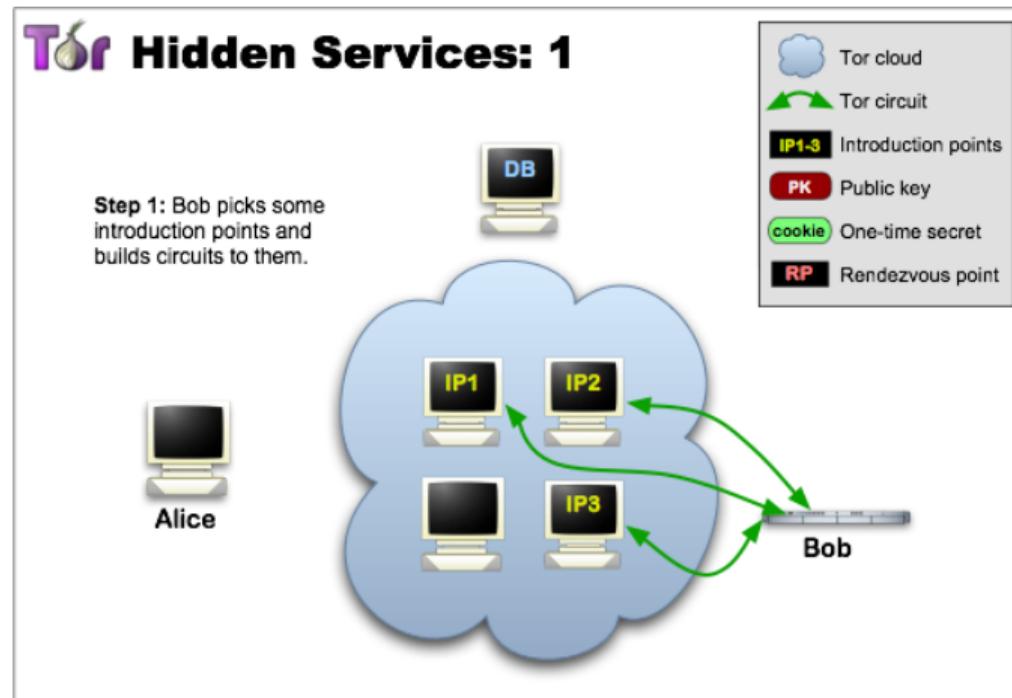
- ▶ Example of Tor client circuit



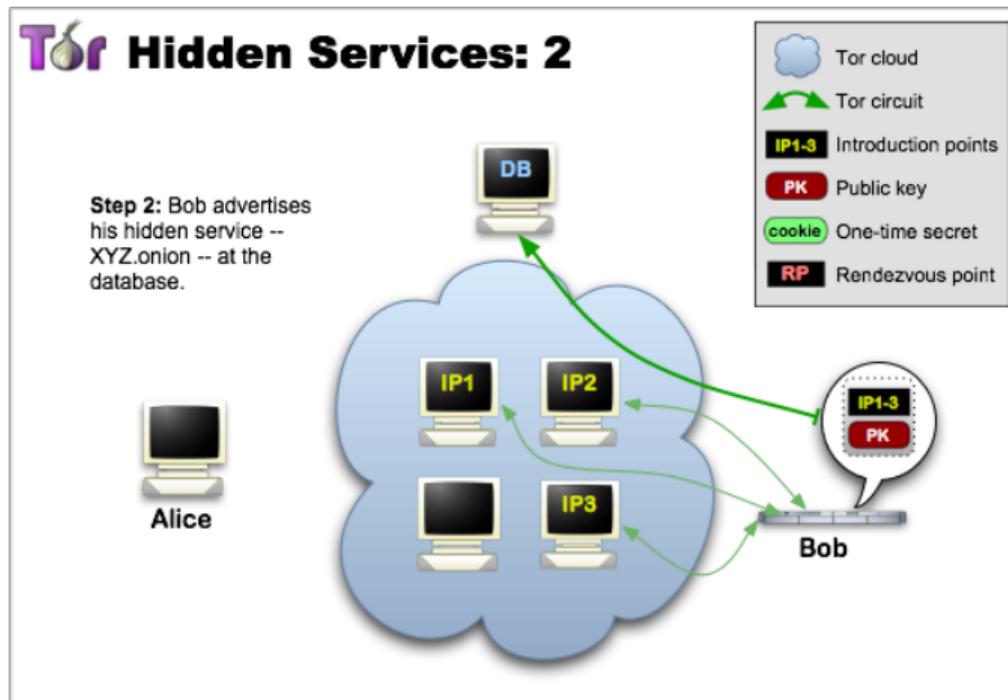
# Hidden Services in Tor

- ▶ Hidden services allow Tor servers to receive incoming connections anonymously
- ▶ Can provide access to services available *only* via Tor
  - ▶ Web, IRC, etc.
  - ▶ For example, host a website without your ISP knowing

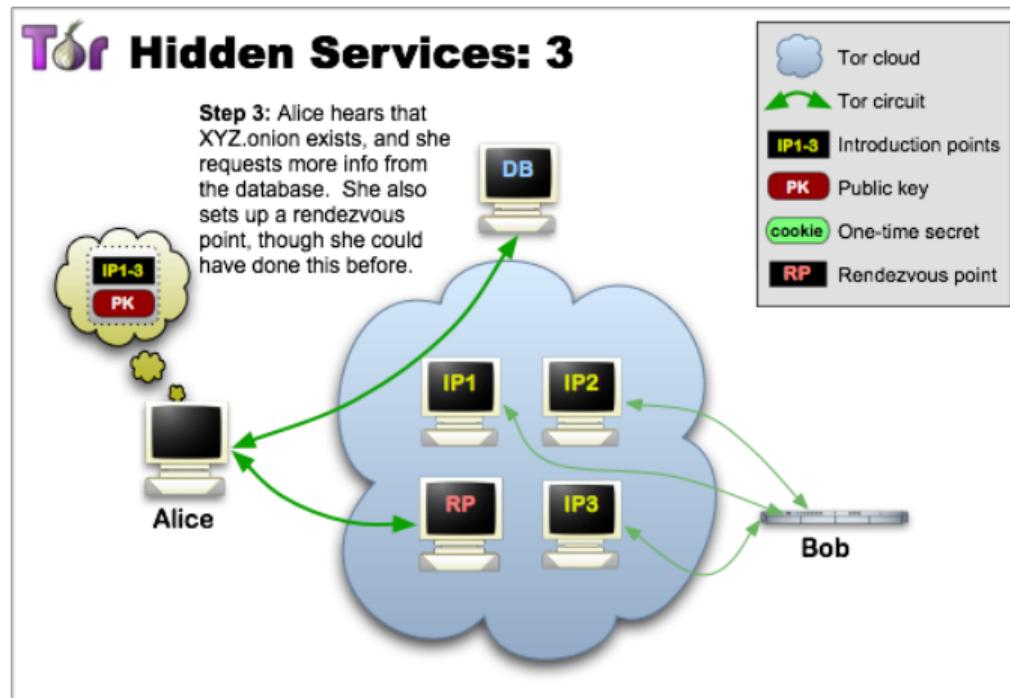
# Hidden Services Example 1



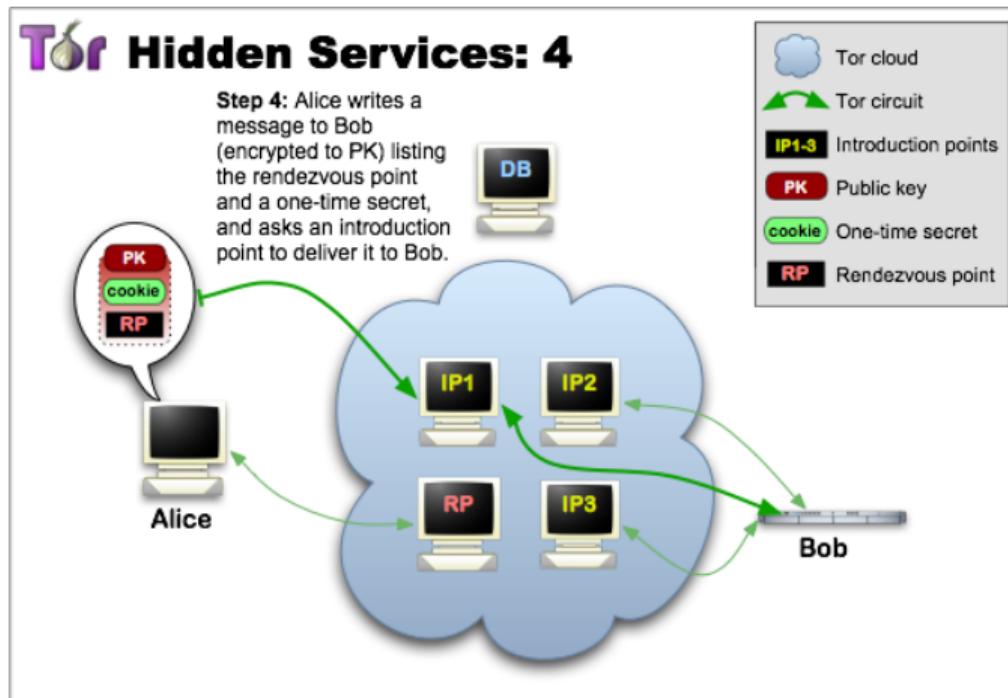
# Hidden Services Example 2



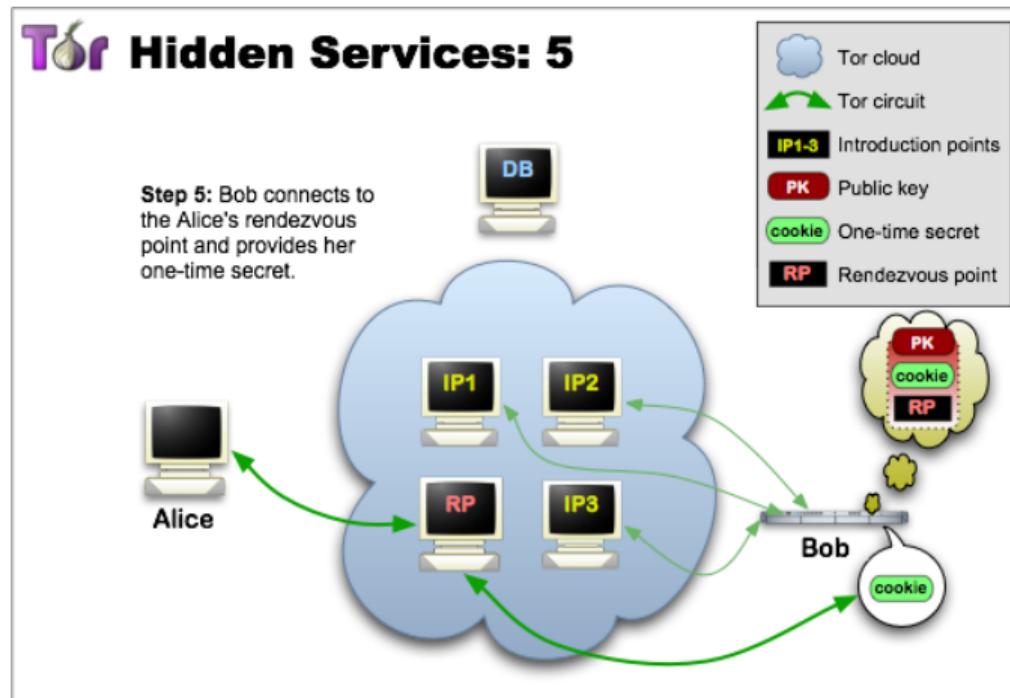
# Hidden Services Example 3



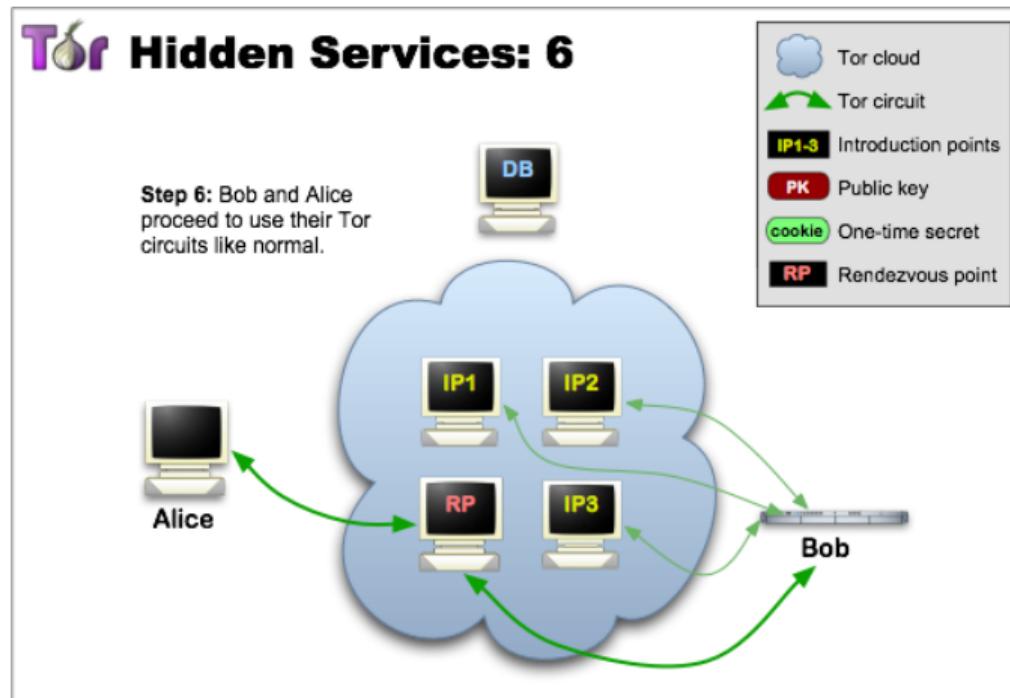
# Hidden Services Example 4



# Hidden Services Example 5



# Hidden Services Example 6



# Types of Attacks on Tor

- ▶ Exit relay snooping
- ▶ Website fingerprinting
- ▶ Traffic analysis
- ▶ Intersection attacks
- ▶ DoS [10]

**An avoidable (but historically common) issue are badly configured hidden services that directly expose critical information about the operator by accident over the application protocol.**

## Part IV: Advanced Cryptographic Primitives

# Homomorphic Encryption

$$E(x_1 \oplus x_2) = E(x_1) \otimes E(x_2) \quad (9)$$

# Multiplicative Homomorphism: RSA & ElGamal

- ▶ Unpadded RSA (multiplicative):

$$E(x_1) \cdot E(x_2) = x_1^e x_2^e = E(x_1 \cdot x_2) \quad (10)$$

- ▶ ElGamal:

$$E(x_1) \cdot E(x_2) = (g^{r_1}, x_1 \cdot h^{r_1})(g^{r_2}, x_2 \cdot h^{r_2}) \quad (11)$$

$$= (g^{r_1+r_2}), (x_1 \cdot x_2)h^{r_1+r_2}) \quad (12)$$

$$= E(x_1 \cdot x_2) \quad (13)$$

# Additive Homomorphism: Paillier

$$E_K(m) := g^m \cdot r^n \pmod{n^2}, \quad (14)$$

$$D_K(c) := \frac{(c^\lambda \pmod{n^2}) - 1}{n} \cdot \mu \pmod{n} \quad (15)$$

where the public key  $K = (n, g)$ ,  $m$  is the plaintext,  $c$  the ciphertext,  $n$  the product of  $p, q \in \mathbb{P}$  of equal length, and  $g \in \mathbb{Z}_{n^2}^*$ . In Paillier, the private key is  $(\lambda, \mu)$ , which is computed from  $p$  and  $q$  as follows:

$$\lambda := \text{lcm}(p - 1, q - 1), \quad (16)$$

$$\mu := \left( \frac{(g^\lambda \pmod{n^2}) - 1}{n} \right)^{-1} \pmod{n}. \quad (17)$$

Paillier offers additive homomorphic public-key encryption, that is:

$$E_K(a) \otimes E_K(b) \equiv E_K(a + b) \quad (18)$$

# Fully homomorphic encryption

Additive:

$$E(A) \oplus E(B) = E(A + B) \quad (19)$$

**and** multiplicative:

$$E(A) \otimes E(B) = E(A \cdot B) \quad (20)$$

Known cryptosystems: Brakerski-Gentry-Vaikuntanathan (BGV), NTRU, Gentry-Sahai-Waters (GSW).

# Pairing-based cryptography

Let  $G_1, G_2$  be two additive cyclic groups of prime order  $q$ , and  $G_T$  another cyclic group of order  $q$  (written multiplicatively). A pairing is an efficiently computable map  $e$ :

$$e : G_1 \times G_2 \rightarrow G_T \quad (21)$$

which satisfies  $e \neq 1$  and bilinearity:

$$\forall_{a,b \in F_q^*}, \forall_{P \in G_1, Q \in G_2} : e(aP, bQ) = e(P, Q)^{ab} \quad (22)$$

Examples: Weil pairing, Tate pairing.

# Hardness assumption

Computational Diffie Hellman:

$$g, g^x, g^y \Rightarrow g^{xy} \quad (23)$$

remains hard on  $G$  even given  $e$ .

# Boneh-Lynn-Sacham (BLS) signatures [4]

Key generation:

Pick random  $x \in \mathbb{Z}_q$

Signing:

$\sigma := h^x$  where  $h := H(m)$

Verification:

Given public key  $g^x$ :

$$e(\sigma, g) = e(h, g^x) \quad (24)$$

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Why:

$$e(\sigma, g) = e(h, g)^x = e(h, g^x) \quad (25)$$

due to bilinearity.

# Fun with BLS

Given signature  $\langle \sigma, g^x \rangle$  on message  $h$ , we can *blind* the signature and public key  $g^x$ :

$$e(\sigma^b, g) = e(h, g)^{xb} = e(h, g^{xb}) \quad (26)$$

Thus  $\sigma^b$  is a valid signature for the *derived* public key  $(g^x)^b$  with blinding value  $b \in \mathbb{Z}_q$ .

## Part V: Secure Multiparty Computation

# Secure Multiparty Computation (SMC)

- ▶ Alice und Bob haben private Daten  $a_i$  and  $b_i$ .
- ▶ Alice und Bob führen ein Protokoll aus und berechnen gemeinsam  $f(a_i, b_i)$ .
- ▶ Nur einer von beiden lernt das Ergebnis (i.d.R.)

# Adversary models

**Honest but curious**

**Dishonest and curious**

# Secure Multiparty Computation: Scalar Product

We want to calculate

$$\sum_i a_i b_i \tag{27}$$

- ▶ Original idea by Ioannidis et al. in 2002 [12] (use:  
$$(a - b)^2 = a^2 - 2ab + b^2$$
)
- ▶ Refined by Amirkhanyan et al. in 2007 (corrected math) [2]

# SMC (ECC Version)<sup>1</sup>

Let Alice's secret value be  $a \in \mathbb{Z}$ . Alice sends to Bob  $(g_i, h_i) = (g^{r_i}, g^{r_i a + a_i})$  with random values  $r_i$  for  $i \in M$ .

Bob answers with:

$$\left( \prod_{i \in M} g_i^{b_i}, \prod_{i \in M} h_i^{b_i} \right) = \left( \prod_{i \in M} g_i^{b_i}, \left( \prod_{i \in M} g_i^{b_i} \right)^a g^{\sum_{i \in M} a_i b_i} \right)$$

Alice can then calculate:

$$\left( \prod_{i \in M} g_i^{b_i} \right)^{-a} \cdot \left( \prod_{i \in M} g_i^{b_i} \right)^a \cdot g^{\sum_{i \in M} a_i b_i} = g^{\sum_{i \in M} a_i b_i}.$$

Assuming  $\sum_{i \in M} a_i b_i$  is sufficiently small, then Alice can compute the scalar product by solving the DLP.

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