Time analysis Based Attacks Simulation in Tor Networks. Simulazione di Sistemi

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Standard *shapes* of information security:

- ► Confidentiality
- ► Integrity
- ► Availability

There is a new security that we want to obtain: **Anonymity**Anonymity [...] means that the personal identity, or personally identifiable information of that person is not known.



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There are a lot of anonymity driven software online, like *i2p*, *freenet* or *Tor*, we will talk about the last one because is the most used and expanded in the real world (2 million of client per day!).



Onion Routing

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The onion routing model is a way to gain anonymity on the net:

- ► Provides anonymity
- ► Protects from sniffing

Introduced by David Goldshlag, Paul Syverson and Michael Reed in the 1999.

It recalls an onion because every step **peel** a layer. Let us see an implementation.



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Overview

Tor is a group of volunteers that operates to defend anonymity online. The system is based on an interconnection of machines, called **routers**. It operates over the network level 4.

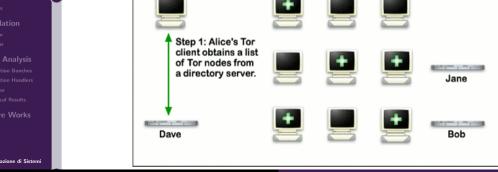
It operates as follow:



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How Tor Works: 1

Alice

Simulazione di Sistemi

Tor node

unencrypted link

encrypted link



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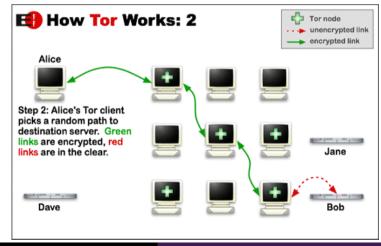
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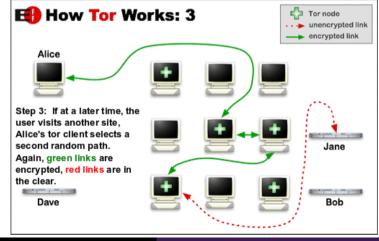
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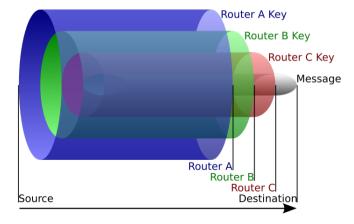
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Alice OR 1 OR 2 website (link is TLS-encrypted) (link is TLS-encryped) (unencrypted) Create c1, E(g^x1) Created c1, g^y1, H(K1) Legend: Relay c1{Extend, OR2, E(g^x2)} Create c2, E(g^x2) E(x)--RSA encryption Created c2, g^v2, H(K2) {X}--AES encryption Relay c1{Extended, g^v2, H(K2)} cN--a circID Relay c1 { {Begin < website >: 80} } Relay c2{Begin < website>:80} (TCP handshake) Relay c2{Connected} Relay c1{{Connected}} Relay c1{{Data, "HTTP GET..."}} Relay c2{ Data, "HTTP GET..."} "HTTP GET..." (response) Relay c2{Data, (response)} Relay c1{{Data, (response)}}



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A lot of attacks and vulnerabilities has been discovered for the system.

- ► Bad apple attack.
- ► Side channel attacks (tor bundle).
- ► Cypher attacks (Tor changed the cryptosystem a lot of time).
- ► Time analysis based attacks
- ► Sniper attack.
- ► Sybil attack.



Time analysis based attacks

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"Tor does not provide protection against end-to-end timing attacks[...]"

We can place a tracker after the client node and another before the server node and check for the connection time to profile users and nodes (and later associate IP to users.)



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- ▶ From this idea we started our simulation work.
- ▶ But OmNet++ doesn't have a reliable simulation model of Tor¹ and so NS2/3.
- ▶ We needed a simulation model for Tor.

¹And Tor is fully implemented in User-Space (over level 4)



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Limpirical results

Future Works

- ▶ We used the **Shadow** simulator
- ▶ Developed by **Rob Jansen** (U.S. Naval Research Lab).

Users







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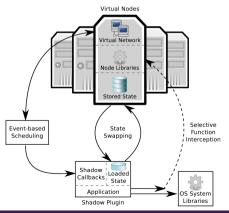
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The main feature of **shadow** is the capability of running real applications (like tor).

Shadow combines virtualization with simulation, it virtualize network stacks and act as an micro system hypervisor (partial virtualization).





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So we needed:

- 1. A client tracer shadow plug-in (proxy).
- 2. A server tracer shadow plug-in (proxy).
- 3. A logger plug-in.
- 4. A client plug-in (HTTP browser?).
- 5. A server plug-in (HTTP web-server?).
- 1,2 and 3 was not implemented by the shadow research team.



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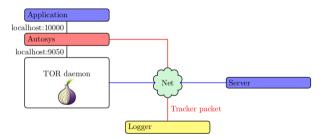
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- ► Trace the SYN flag that pass trough Tor (on both ways)².
- ► Send a packet to the logger
 - < type(Tracked_node); Hostname(Tracked_node); timestamp >.



 $^{^2}$ A future work could be the trace of the SYN-ACK flag, to get the corresponding gap in the analysis part.

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Can be implemented in a lot of different ways:

- ► As a sniffer installed on the routers which listen for every TCP SYN flag (the autonomous system).
 - ▶ But **Shadow** does not support Raw Sockets.
- ▶ We decided to implement that as a simple malware-like connection proxy installed on the client virtual node³.
- ▶ Otherwise the tracer can be installed on the guard relay (but we need to deal with re-association between traced clients and real clients because the path changes every 10 minutes).

FBI Spent \$775,000 on Hacking Team's Spying Tools

³A similar solution to the Hacking team one.



Plug-ins Analyzer/Logger plug-in

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- ► After being captured by the sniffers the data must be stocked for late-processing.
- ▶ We used a public logger service that logs this informations.
- ▶ Based on UDP for lightness.
- ► (In a real-world scenario this entity would have some form of security and could be replicated/load balanced).





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This plug-in so will save the data that it receives from the sniffers with a common format:

host_type; hostname; timestamp

- ► host_type: C or S if the tracked is a client or a server (the communication is going in or it exiting from Tor?).
- ► hostname: The hostname of the tracked (got by autosys).
- ▶ *timestamp*: The temporal reference of the connection (This will be used to compute distances and gaps).

This will be processed in the phase 2 to get the matches.



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We needed a simple client that sends his hostname on the network to compute the matching accuracy later.

- ▶ Do some connections to a fixed server.
- ▶ A future work should make it capable of multiple connections to multiple serves.
- ▶ This plug-in must have SOCKS5 capability to run over Tor.



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The server part, by opposite:

- ▶ Listen for some connections from the clients.
- ▶ Add a time stamp to the current received packet (correspondent host name).
- ► Save this data to a common file (per server).

This data will be used in the phase 2 to compute the **matching** accuracy.



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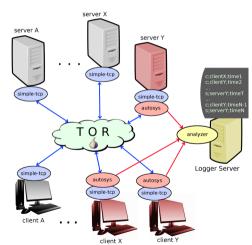
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- ► Simulation Bunches
- ► Simulation Handlers
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- ► Empirical Results



Simulation Bunches

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- 1. Traced clients fixed to the 100% and increasing traced servers at each macro bunch run (0% \rightarrow 100%).
- 2. Traced servers fixed to the 100% and increasing traced clients at each macro bunch run (0% \rightarrow 100%).
- 3. Increasing both traced clients and traced servers (traced portion) at each simulation (0% \rightarrow 100%).



Simulation Bunches

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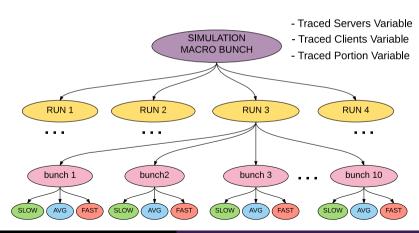
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- ► Netbuilder
- ▶ Launcher



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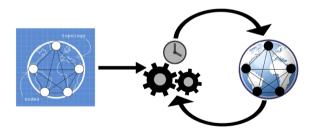
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Genereates an XML file that describes the network





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Allow the network configuration through:

- ▶ The number of TOR exit nodes in the simulation.
- ▶ The number of TOR 4authorities⁴ nodes in the simulation.
- ▶ The number of clients (simpletcp) of the simulation.
- ▶ The number of servers (simpletcp) of the simulation.
- ▶ The percentage of clients tracked by an autosys plug-in.
- ▶ The percentage of servers tracked by an autosys plug-in.
- ► The density of the network-requests.

⁴A 4 Authority node is simply the database that keep track of the state of the TOR network and the list of the TOR relays/exit-nodes



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The connection densities are the sleep time thresholds between each client connection request:

- ► Slow: 800 (mean) 2000 (mean) milliseconds
- ► Average: 80 (mean) 1000 (mean) milliseconds
- ► Fast: 20 (mean) 100 (mean) milliseconds



Launcher

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Simulazione di Sistemi

Algorithm 2 Launcher script

end for

end for 18: end for

for $(simulation_run \leftarrow 1; simulation_run \le steps; simulation_run + +)$ do 2: for $(sim_id \leftarrow 1; sim_id \le simulations_per_step; sim_id + +)$ do for all density in (slow, fast, average) do if The client trace percentage is not fixed then 4: $client_trace_value \leftarrow sim_id/simulations_per_step$ end if 6: if The server trace percentage is not fixed then 8: $server_trace_value \leftarrow sim_id/simulations_per_step$ end if 10: if A configuration is present for $\langle sim_id, density \rangle$ And the percentages are fixed then Use the previous configuration else 12. Generate a new configuration with net-builder end if 14:

Launch the Shadow Simulator with the appropriate configuration.

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c:client10:1420000000 s:server7:1420008031 c:client6:1420005867 s:server9:1420146660 s:server6:1420205384 s:server8:1420252482 c:client0:1420680882 c:client1:1421017740 (*)

s:server7:1421023888 s:server2:1421156205 c:client8:1421160529 s:server3:1421318345 s:server0:1421332488 c:client7;1421487295 c:client4:1421634744 s:server9:1421726485



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- ► For each client connection request *creq*, it looks for candidate server acceptances
- ► Nested loop "temporally" limited between *thr_{MIN}* (100ms) *thr_{MAX}* (6sec)

Time distance

Let $\Delta_t(creq, s)$ be the time distance between a *creq* time-stamp and a server candidate acceptance s time-stamp.



 $\Delta_{t} < thr_{MIN} \rightarrow$

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c;client10;1420000000 s:server7:1420008031 c:client6:1420005867 s:server9:1420146660 s;server6:1420205384 s:server8:1420252482 c:client0:1420680882 c:client1:1421017740 (*)

(*)s:server7:1421023888 s:server2:1421156205 c:client8:1421160529 s:server3:1421318345 s;server0;1421332488 c:client7:1421487295 c:client4:1421634744 s:server9:1421726485 . . .

← already considered

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The likelihood for a server acceptance to be related to a client request can be related to their time distance.

pmatch

$$pmatch(creq, s) = 1 - \frac{\Delta_t(creq, s) - thr_{min}}{thr_{max} - thr_{min}}$$
(1)



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candidate	pmatch	
server9	0.992	
server6	0.982	
server8	0.975	
server7	0.846	
server2	0.823	
server3	0.769	
server0	0.794	

The *pmatch* is higher when the server connection is closer to thr_{min} .



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Acceptance Delay Correlation

If a server receives a connection request from a client after a certain time Δ_t , that server will likely receive again another connection from the same client after a time that is close to Δ_t if the Tor communication path is the same as before

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As the *pmatch* is defined as the Δ_t normalization, let us define the *gap* average of a server s marked as candidate for a client c

$$gap_{AVG}(c,s) = \frac{\sum\limits_{i=0}^{N(c,s)}|pmatch(creq_{i+1},s) - pmatch(creq_{i},s)|}{N(c,s)}$$
(2)

where N(c, s) is the number of c connection requests that have been likely accepted from s.



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The score gained by a server s marked as candidate for a client c

$$score(c, s) = rac{\sum\limits_{i=0}^{N(c, s)} pmatch(creq_i, s)}{gap_{AVG}(c, s) + 1}$$
 (3)



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client633		client637		client349	
candidate	score	candidate	score	candidate	score
server8	9.44	server3	59.17	server0	14.86
server0	7.01	server2	15.14	server1	13.81
server2	6.88	server8	13.96	server5	11.94
server5	6.83	server5	8.33	server2	11.20

Best Candidate

The server candidate with the **highest score** is the best candidate for a certain client.



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Empirical Result

- ▶ How much are the estimated results close to the real ones?
- ▶ Use of real connections logged by the simple-tcp applications.
- ► Matched accuracy estimation
- ► Matched portion estimation



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For each client check if the best candidate is the real server that accepted its connections and mark it as **matched**.

If so calculate the client accuracy as the distance between the number of estimated connections N and the number of real connections M:

$$accuracy_c \leftarrow \frac{MIN(M,N)}{MAX(M,N)}$$
 (4)

The *matched accuracy* is the average of matched client accuracies.



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The matched portion indicates how many traced clients found their real server:

$$matched_portion = \frac{matched_clients}{traced_clients}$$
 (5)



Matched Portion

Servers traced portion augmenting

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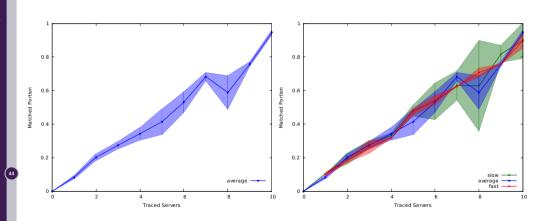
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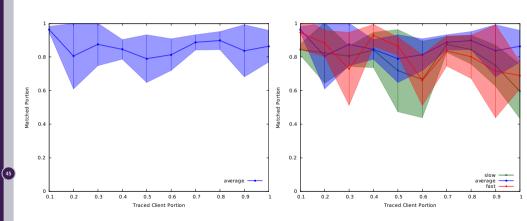
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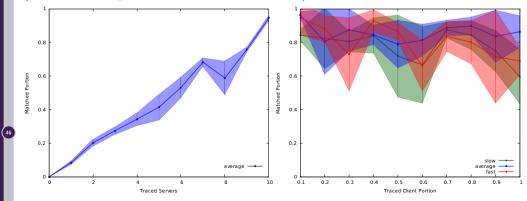
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We can see that the matched portion tends to be constant around 80% (as with an high portion of traced servers).





Matched Portion

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Empirical result

- ► This behaviour was expected because the analysis is conducted from the clients side.
- ► Increasing the connection density the function trend seems to be more precise.
- ▶ Linearly dependent by the number of traced servers.



Matched Accuracy

Servers traced portion augmenting

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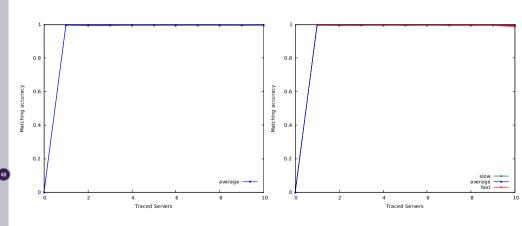
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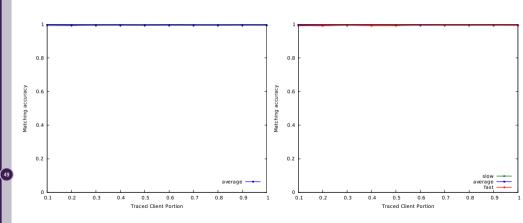
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Considered values Both portions

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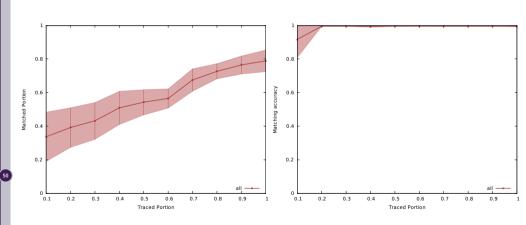
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► Most realistic scenario

Considerations

- ▶ Respect the avg sum of the other two experiments
- ► An attacker should be interested in trace as much Tor network nodes as possible.



Communication density

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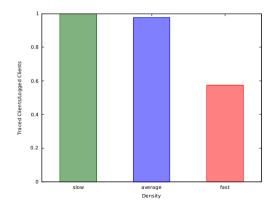
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Does not seems to highly interfere with the matched portion.





How to distinguish correct guesses?

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Empirical Results

- ▶ An attacker can, so far, get some maps between servers and clients.
- ▶ Let us see a 4 dimensional graph.



Correct guesses spatial distribution

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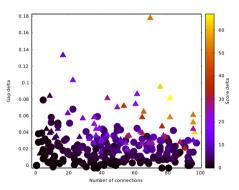
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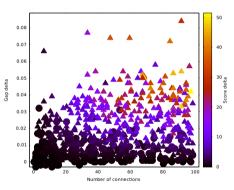
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40% of traced portion



90% of traced portion



Correct guesses spatial distribution

Based Attacks Simulation in Tor Networks.

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Shadow Plug-ins

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Empirical Results

- ▶ As we can see the correctly guessed servers (triangles) take place in the upper-right section in a yellowish color.
- ▶ We can choose some parameters to get the "Trusted matching set".
- ▶ An attacker so can blindly select some matchings.



Future works

Time analysis Based Attacks Simulation in Tor Networks.

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- ▶ A simulation with the alternative new-born Tor client "Astoria".
- ► An analysis of the i2p network model and the freenet network model.
- ► An analysis for some modification based on the paper "Mix network model".
- ► The modification to the **simple-tcp** plug-in to make it capable of connecting to multiple servers in single instance.
- ▶ Go on with the score delta driven analysis.
- ▶ Repeat the experiment with a bigger Tor network.

