

UMassAmherst

College of Information  
& Computer Sciences

# Enemy At the Gateways: Censorship-Resilient Proxy Distribution Using Game Theory

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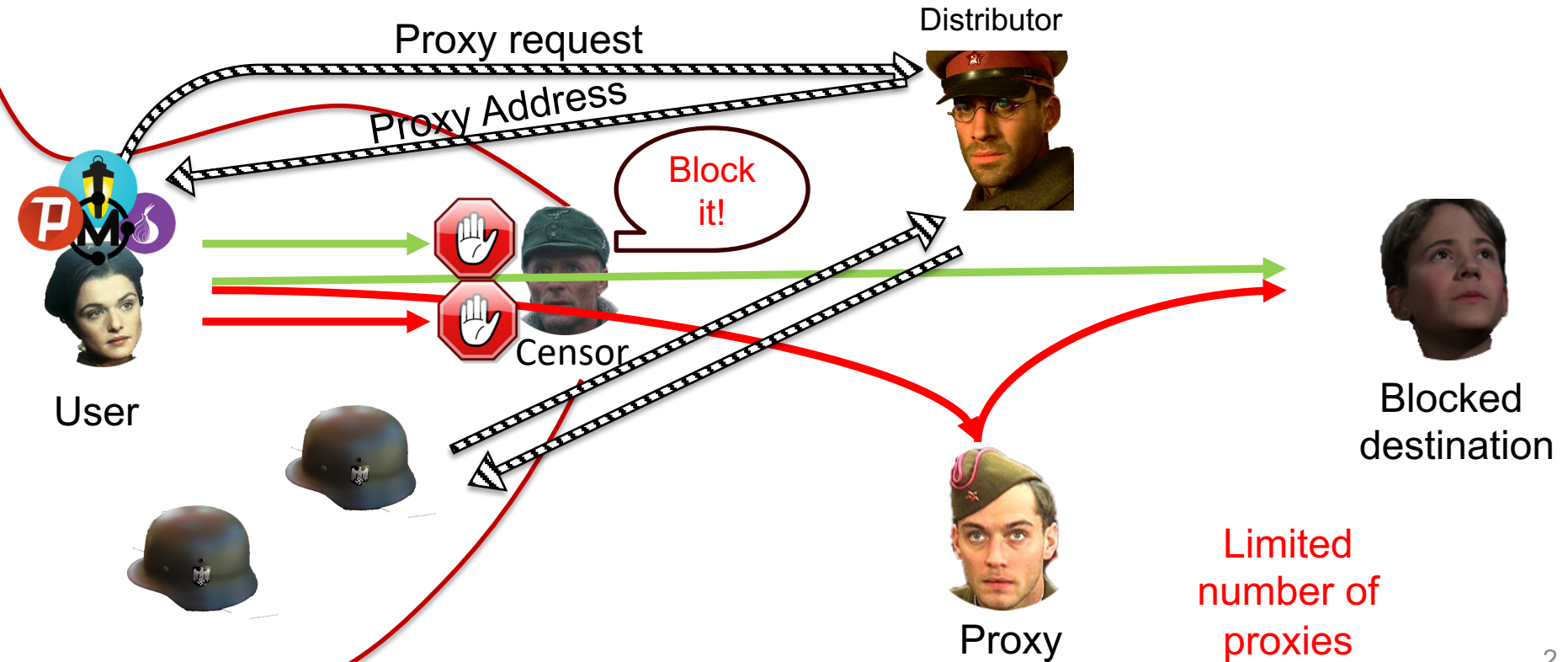
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# Internet Censorship

- Oppression regimes try to stop flow of information by censoring contents, specifically in **Internet censorship**
- There are a lot of **internet censorship circumvention tools** to help the users of such countries
- **Proxies** are the core technique for circumventions



# Censorship Circumvention



# Tor Is Blocked in Most Censoring Countries



# Proxy distribution is an open challenge in censorship circumvention tools

**Our goal:**  
**Find the optimal assignment  
between clients and proxies**

# Existing Approaches

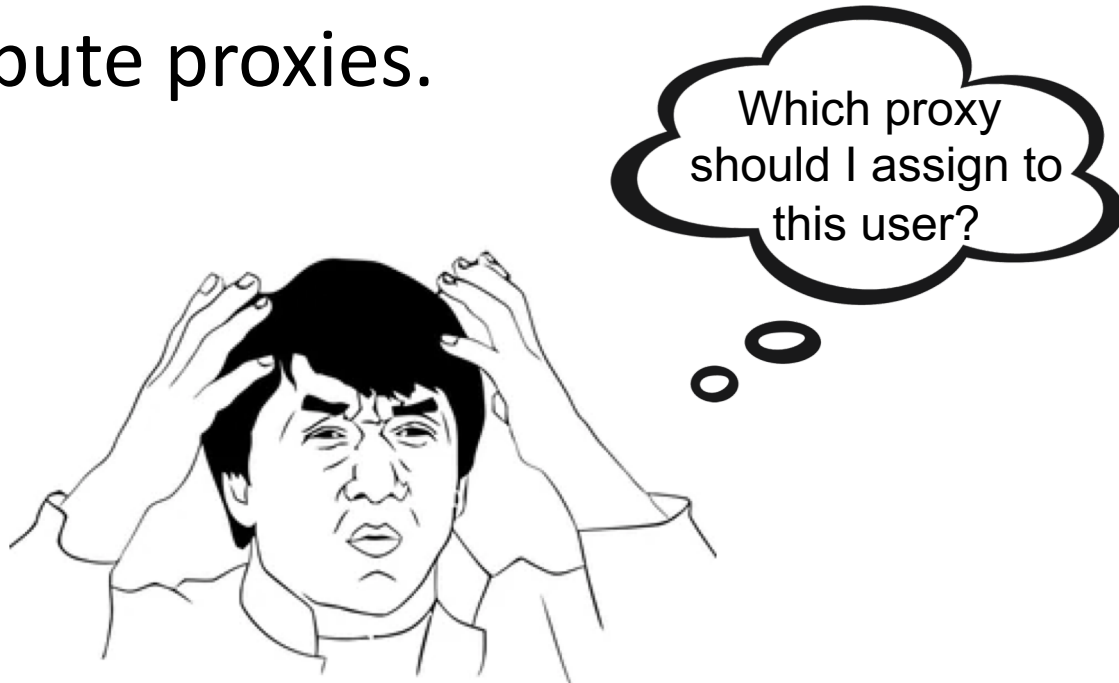
- Social networks:
  - Proximax [FC 11], Pass it on [IPTPS 10]
- Solving puzzles:
  - CAPTCHA, Feamster et al. [PETS 03]
- Theoretical modeling:
  - rBridge [NDSS 13], Mahdian [Fun with Algorithms.2010]

Not scalable

Orthogonal  
with our work

# Existing Approaches (Cont.)

- None of existing methods define how to distribute proxies.





# Existing Approaches (Cont.)

- Only consider the simple censoring strategies.

**What we consider as  
a censoring strategy**



**But actually...**



# Our approach

- A **generic** framework which can be applied on different censorship circumvention tools
- We use **game theory** to model the problem and find the best solution
- We model the **optimal** censoring strategy and evaluate our model against it

# How Does It Work?

We want a stable assignment such that:

Each user gets the **most desirable** proxies

No any **two** users want to change their proxies and they get the best proxy under this condition



Users



Proxies

# How Does It Work? (Cont.)



Users



Users history

## College admission game

Uptime

Number of  
blocked proxies

Location

⋮

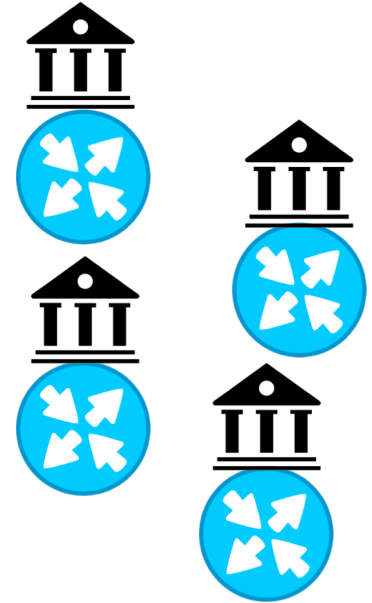
Bandwidth

Number of  
connected users

Location

⋮

Proxy history



Proxies

# How Does It Work? (Cont.)



Users

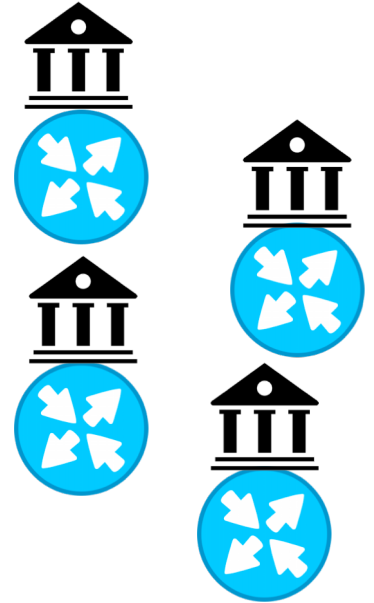


## College admission game

User (i) utility function  
for each proxy (x) :  $U_{a_i}^t(p_x)$

Proxy (x) utility function  
for each user (i) :  $U_{p_x}^t(a_i)$

We use a customized Gale-Shapley algorithm to find equilibrium assignment between proxies and users



Proxies

# Suggested metrics

- Proxy ( $\beta$ ):
  - Number of users who know the proxy
  - Number of users connected to the proxy
  - Total time utilization of the proxy
  - Distance from user
- User ( $\alpha$ ):
  - Proxy utilization
  - Blocked proxy usage
  - Number of requests for new proxy addresses
  - Number of blocked proxies that a user knows
  - Distance from proxy

Distributor Type	$\alpha_1$	$\alpha_2$	$\alpha_3$	$\alpha_4$	$\alpha_5$	$\beta_1$	$\beta_2$	$\beta_3$	$\beta_4$
Strict - Balanced distribution	L	M	H	H	M	L	M	M	M
Strict - Sparse distribution	L	M	H	H	H	H	L	M	H
Kind - Balanced distribution	H	M	M	M	M	L	M	M	M
Kind - Sparse distribution	H	M	M	M	H	H	L	M	H

# Optimal Censoring Strategy

- Censor decides based on the collective information from the agents
- Optimal censor increases its users' utility while blocking maximum number of proxies:

$$U_C^t = \omega \sum_{a_i \in \mathbb{J}} U_C^t(a_i) + r_{Blocked}$$

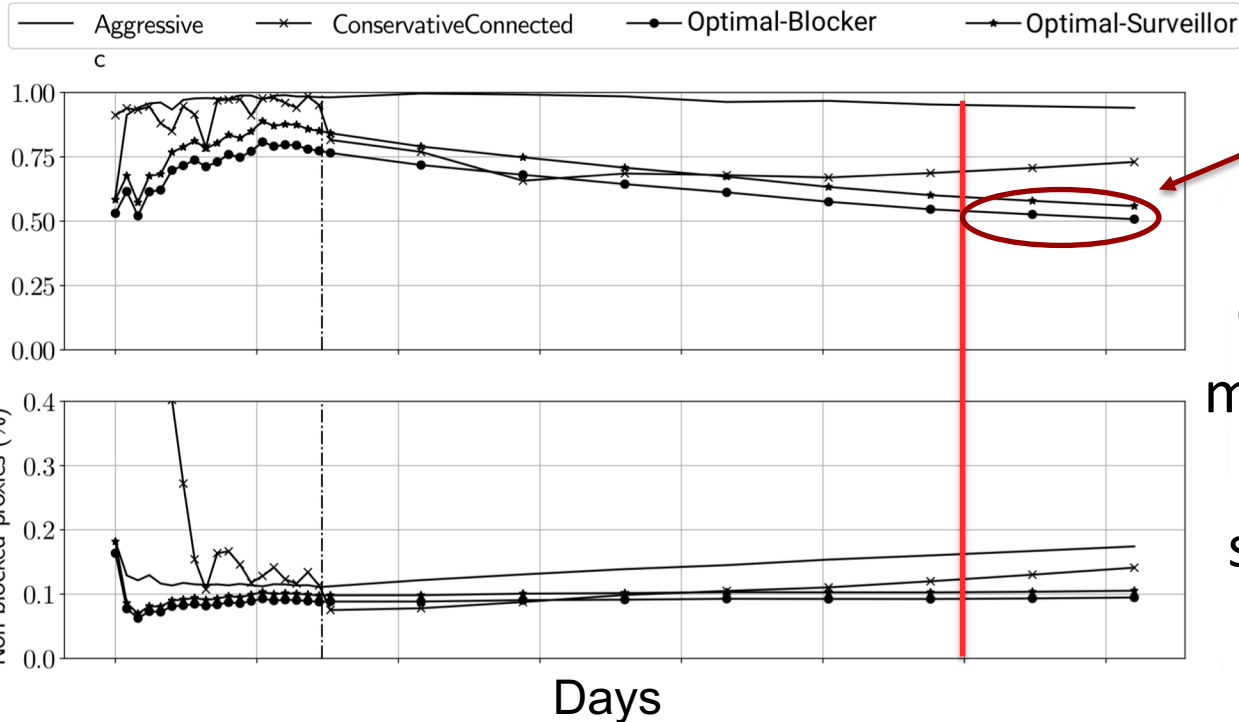
# Experiments



# Experimental Setup

- We implemented a proxy distribution simulator
- The proxy distributor assigns new proxies at the end of each epoch
- We simulated each experiment for 5 years
- We used different rates of proxies and users

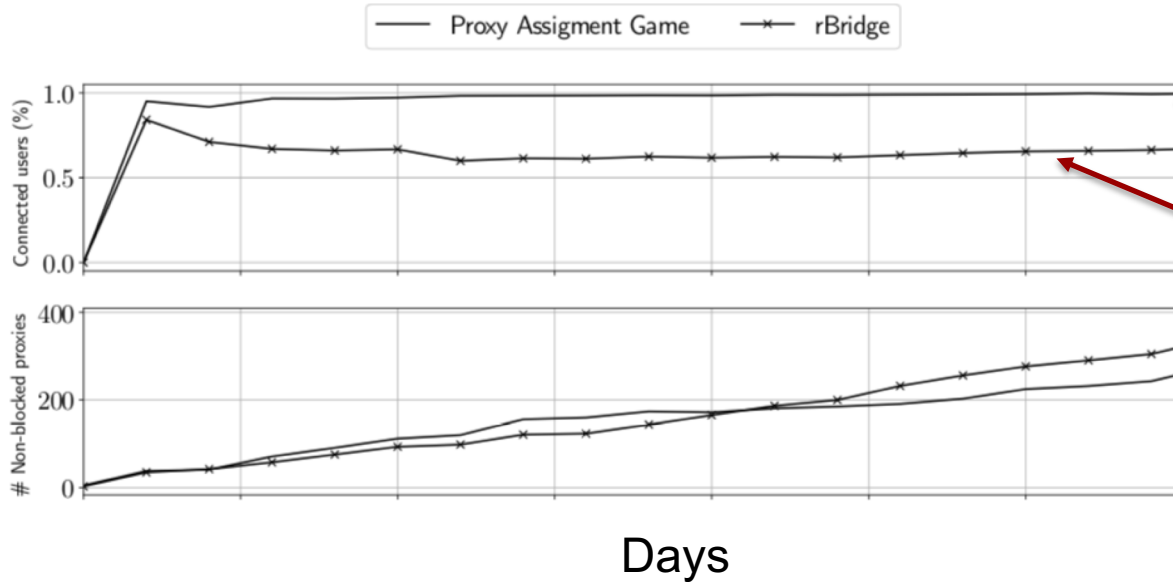
# Our Optimal Sensor Is More Powerful



Optimal Sensor

Our optimal censor is much **stronger** than any other censoring strategy mentioned in the previous works

# Comparison to Previous Works



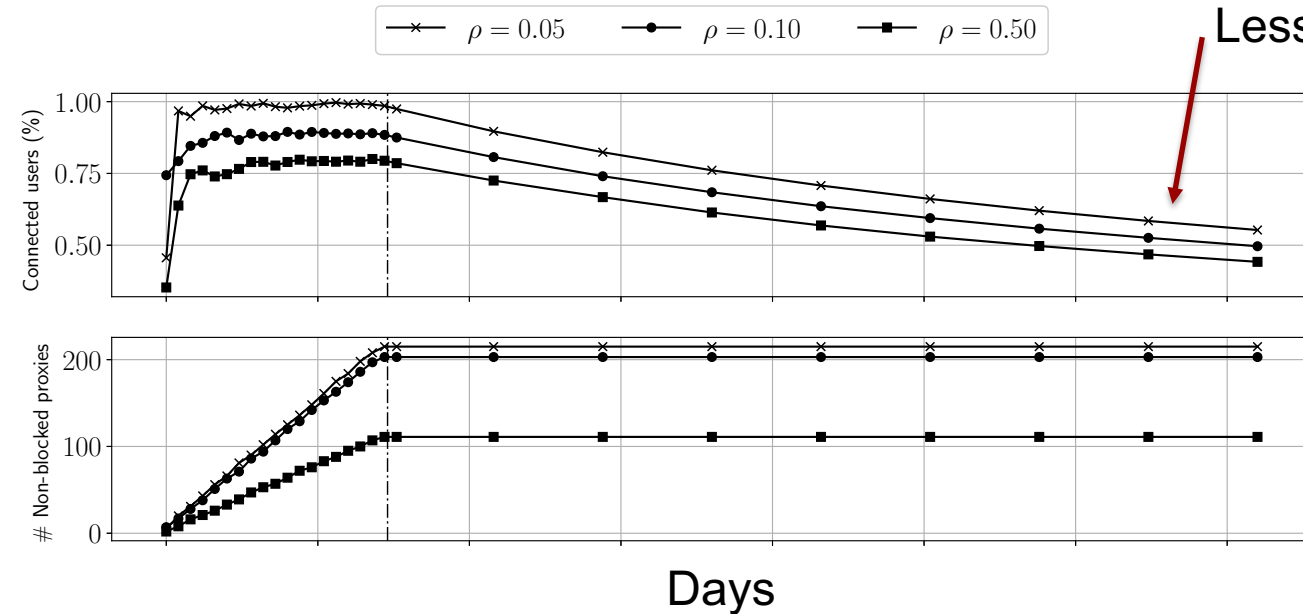
Our approach

rBridge [NDSS' 13]

We get better  
performance against  
The same censoring  
strategy

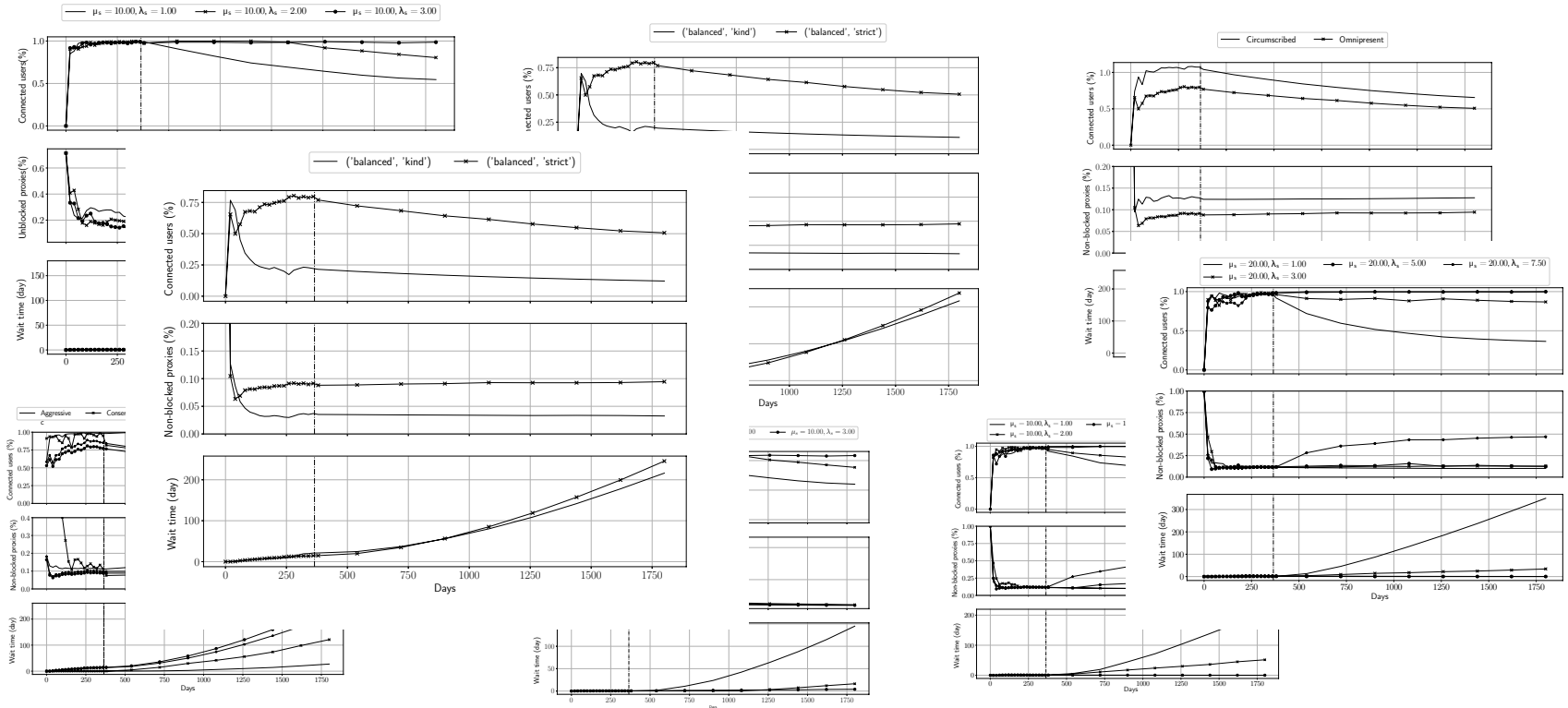
[NDSS' 13] "rBridge: User Reputation based Tor Bridge Distribution with Privacy Preservation."

# Static Proxy Distribution System



No matter how dumb is the censor we should always **add new proxies** to the system.

# Different Settings and Scenarios



# Summary

- Proxy distribution is a core problem in censorship circumvention tools
- We used game theory to model the problem and derive the optimal answers
- We show the performance of the system against the optimal censoring strategy

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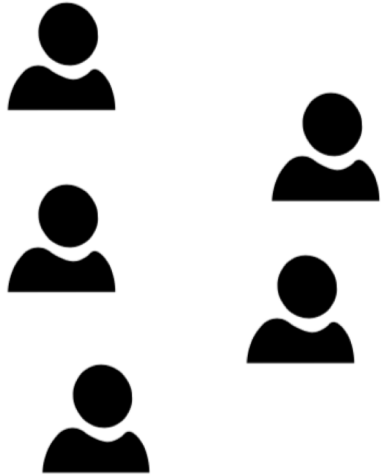
Join us!

Milad Nasr

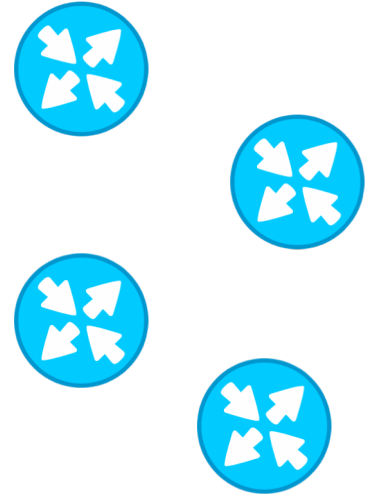
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# How Does It Work? (Cont.)



Users



Proxies