

Where The Wild Things Are: Brute-Force SSH Attacks In The Wild And How To Stop Them

Sachin Kumar Singh, Shreeman Gautam, Cameron Cartier, Sameer Patil, Robert Ricci

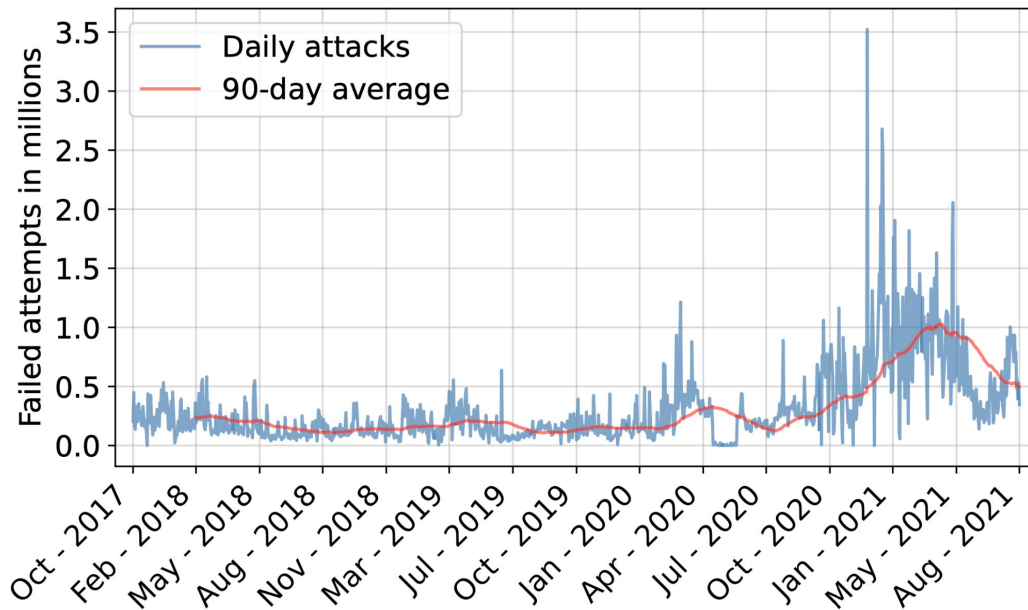
University of Utah



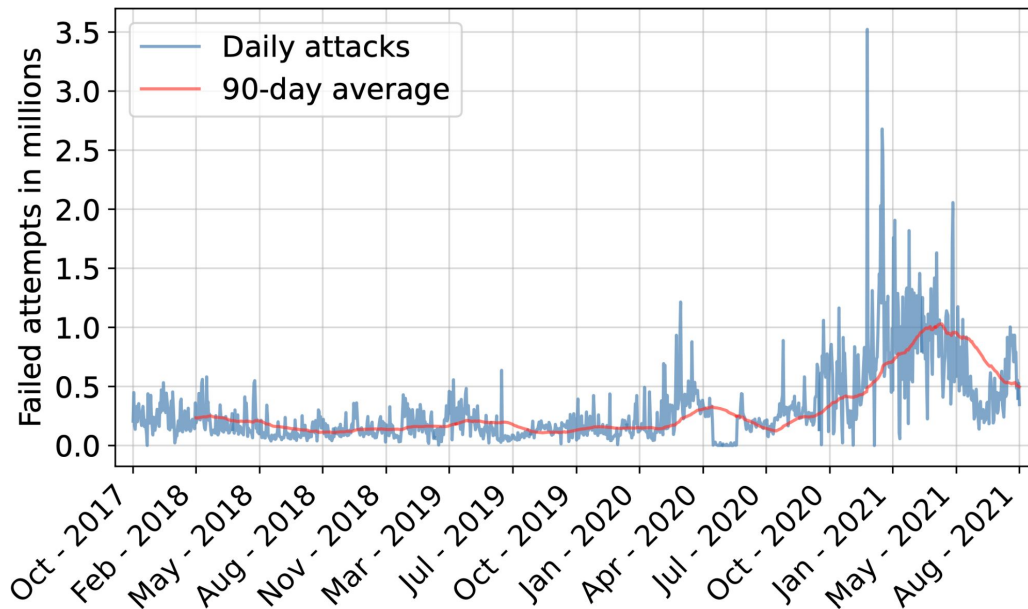
KAHLERT SCHOOL OF COMPUTING
THE UNIVERSITY OF UTAH

SSH Brute Force Attacks (BFAs) in the Wild

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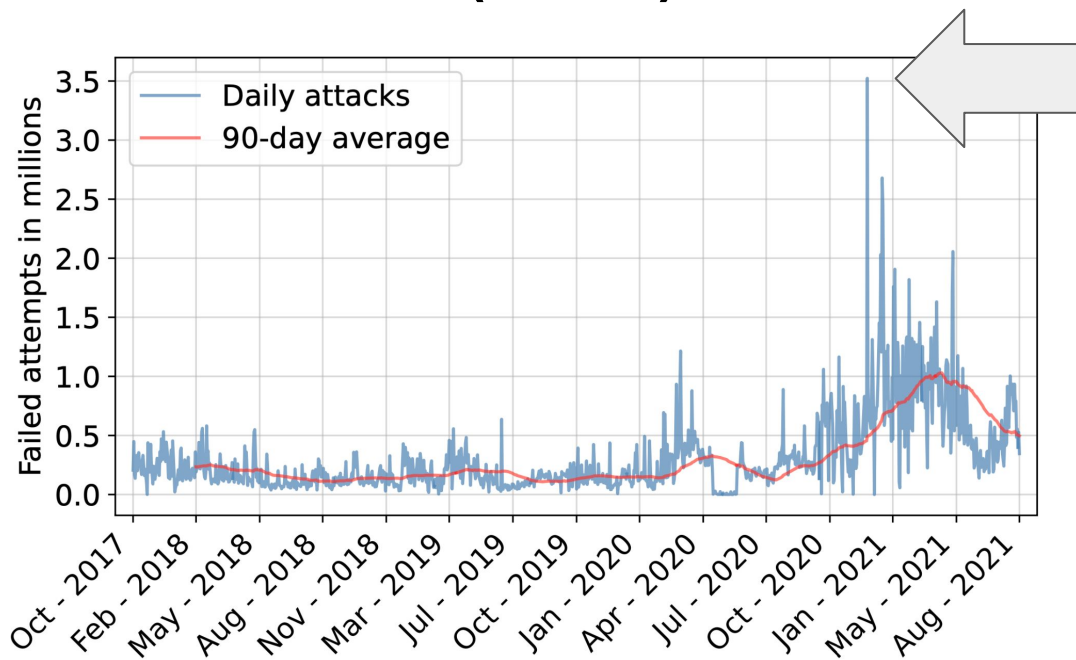


SSH Brute Force Attacks (BFAs) in the Wild



381 million failed brute force attempts

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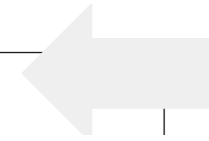
Peak 3.5 million a day

381 million failed brute force attempts

SSH Brute Force Attacks (BFAs) in the Wild

3.5
2.0
0.0

Daily attacks
90-day average



Peak 3.5
million a day

**“SSH Brute Force Attacks are still prevalent,
in fact INCREASING.”**

Oct - 20.
Feb - 20.
May - 20.
Aug - 20.
Nov - 20.
Mar - 20.
Jul - 20.
Oct - 20.
Jan - 20.
Apr - 20.
Jul - 20.
Oct - 20.
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381 million failed brute force attempts

Data Collection

Data Collection

CloudLab

Data Collection

CloudLab

Public Research Facility

Data Collection

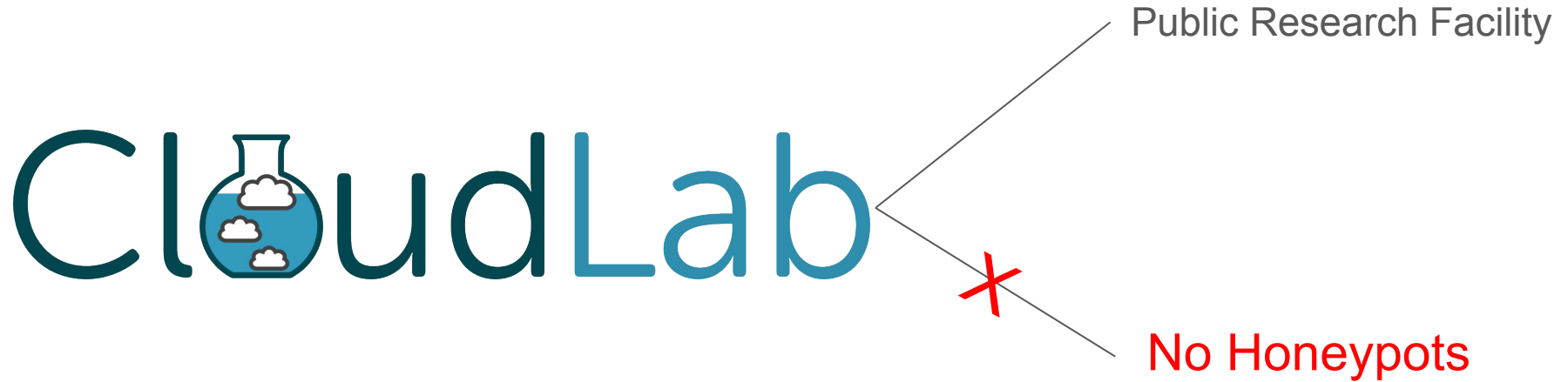
CloudLab

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No Honeypots

Data Collection



Legitimate Users & Attackers

Data Collection

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“Our unique data aided the development of blocking.”

Legitimate Users & Attackers

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“Our unique data aided the development of blocking.”

“Provide the means to evaluate effectiveness”

Legitimate Users & Attackers

Ingredients for a SSH Brute Force Attack

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- Target Machine (CloudLab Nodes)

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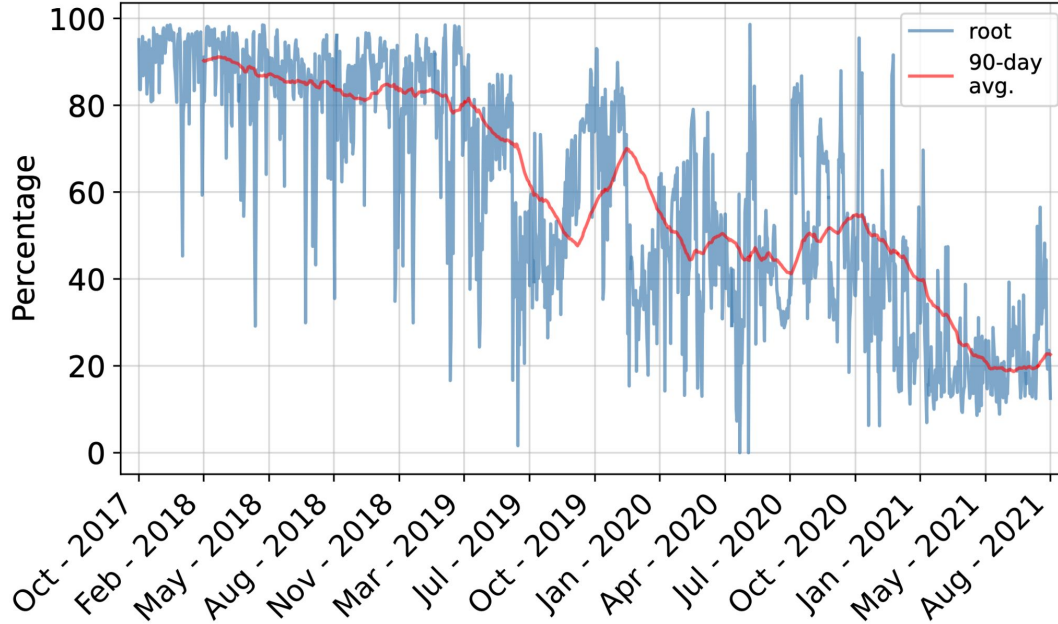
Username in Guessing Vector

***Username* in Guessing Vector**

- *root*

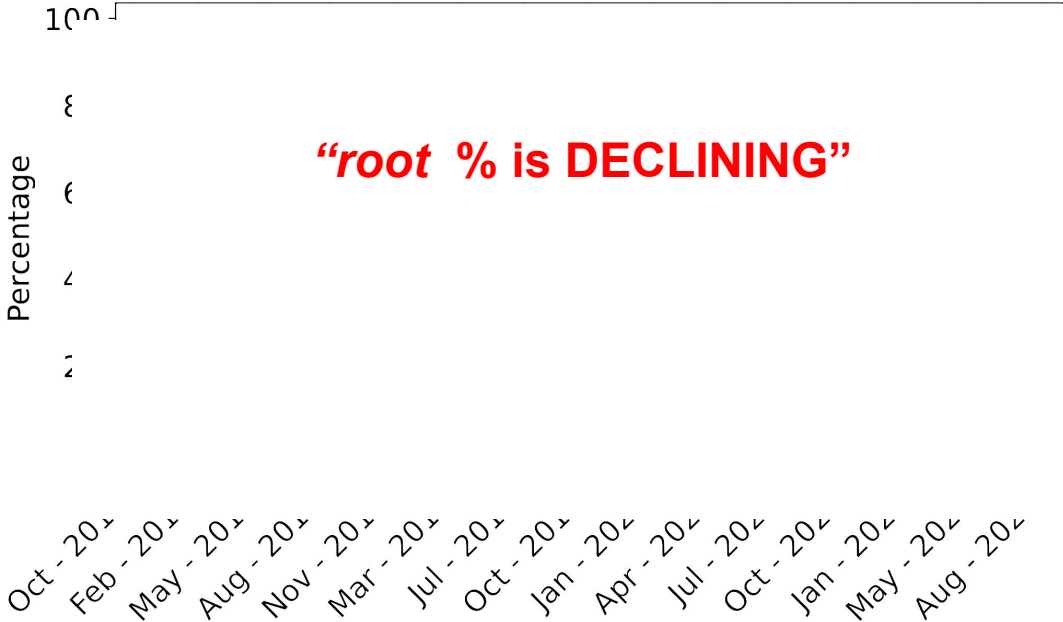
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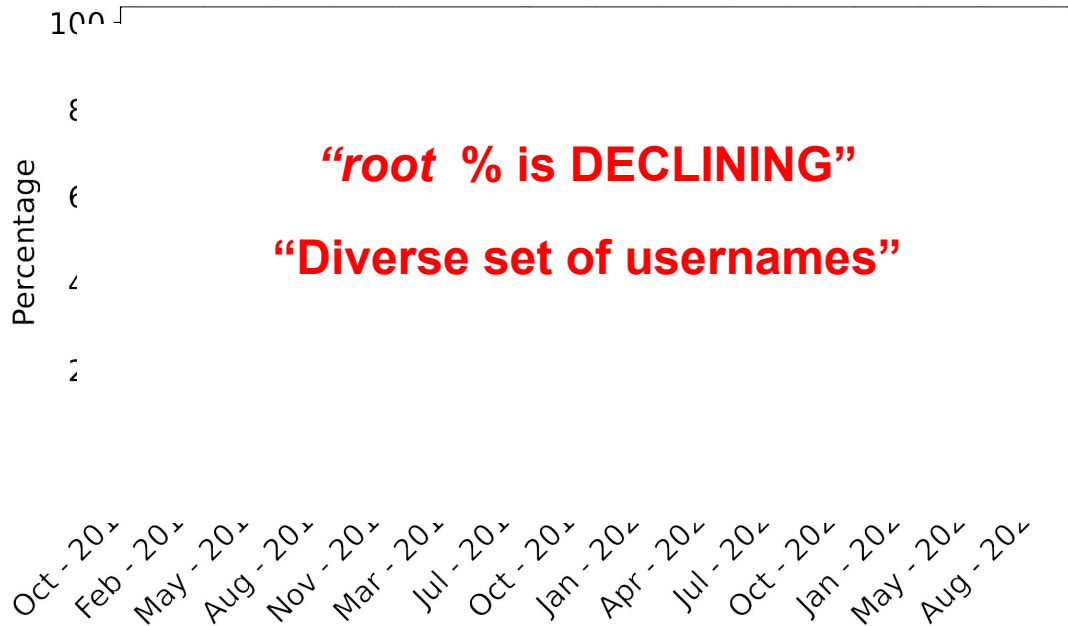
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Username in Guessing Vector

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- Are there patterns in the usernames utilized by attackers?

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- Can these patterns be fingerprinted for effective blocking?

***Username Set* in Guessing Vector**

Attacker →

***Username Set* in Guessing Vector**

Attacker → Guessing Vector →

Username Set in Guessing Vector

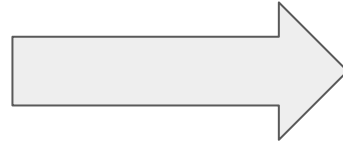
Attacker → Guessing Vector → ({username-1},
 {username-2},
 {username-3},
 .
 .
 .
 .
 {username-n})

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**Username
Set**

***Username Set* in Guessing Vector**

Attacker_1 →

Attacker_2 →

Attacker_3 →

Attacker_4 →

.

.

.

Attacker_n →

Username Set in Guessing Vector

Attacker_1 → **Username Set A**

Attacker_2 →

Attacker_3 →

Attacker_4 → **Username Set A**

.

.

.

Attacker_n →

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → **Username Set B**

Attacker_3 →

Attacker_4 → Username Set A

.

.

.

Attacker_n →

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → Username Set B

Attacker_3 → **Username Set C**

Attacker_4 → Username Set A

.

.

.

Attacker_n → **Username Set C**

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → Username Set B

Attacker_3 → Username Set C

Attacker_4 → Username Set A

.

.

.

Attacker_n → Username Set C

**Username
Set A**

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → Username Set B

Attacker_3 → Username Set C

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**Username
Set A**

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → Username Set B

Attacker_3 → Username Set C

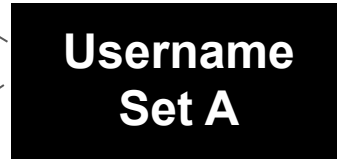
Attacker_4 → Username Set A

.

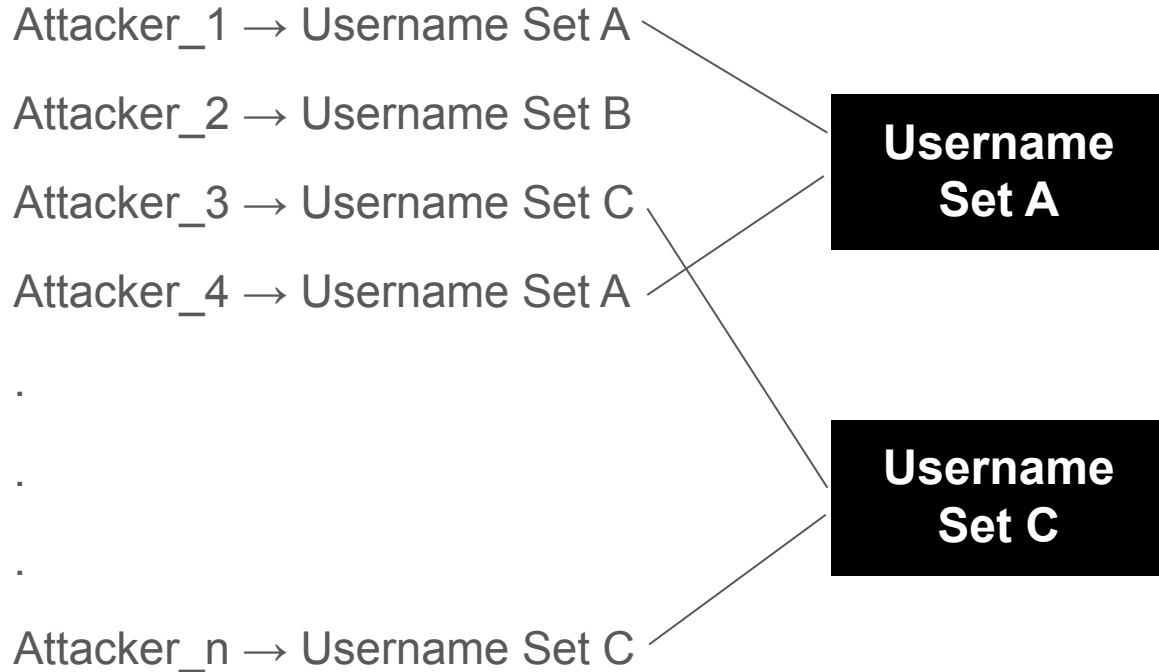
.

.

Attacker_n → Username Set C



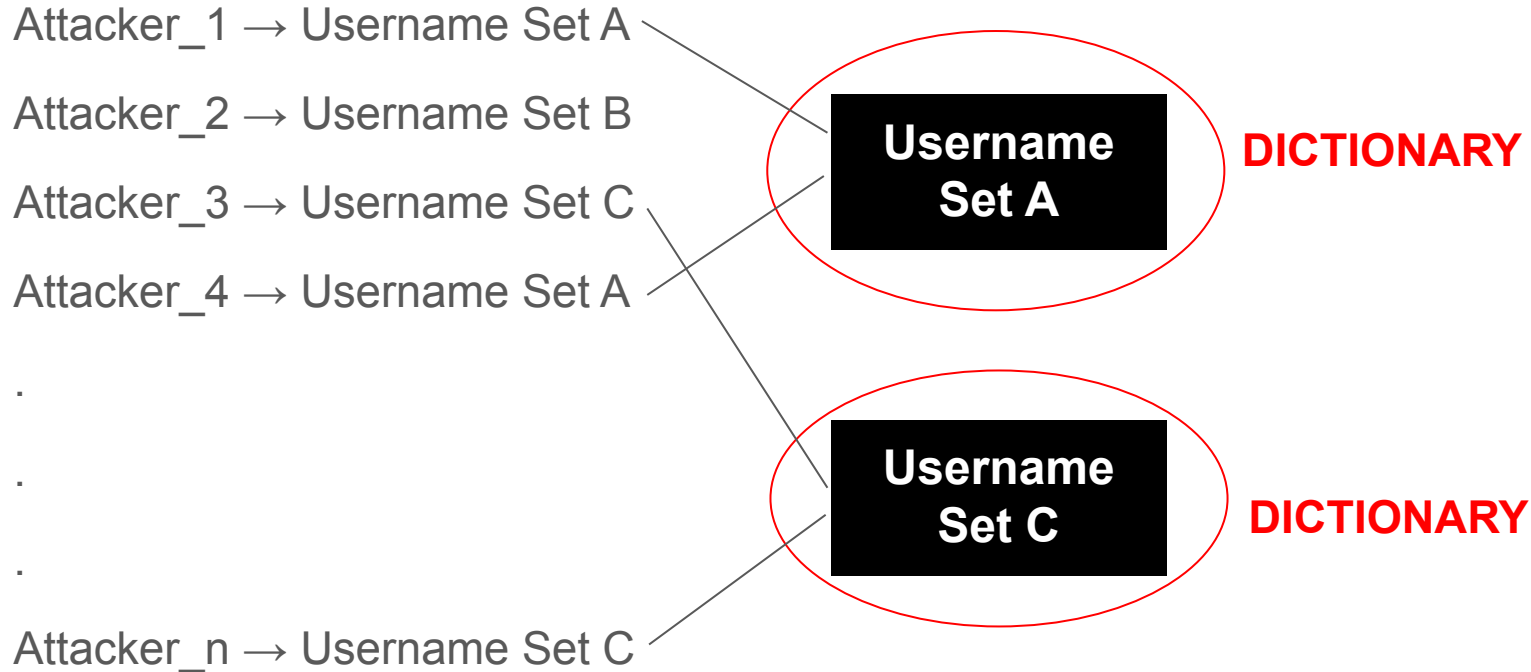
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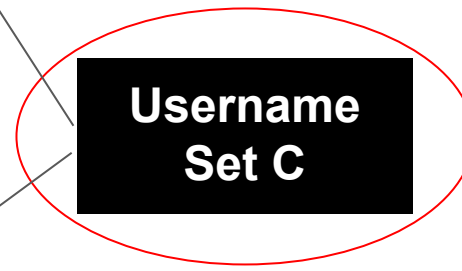
Attacker_1 → Username Set A

Attacker_2 → Username Set B

- **64% attackers use dictionary**



DICTIONARY



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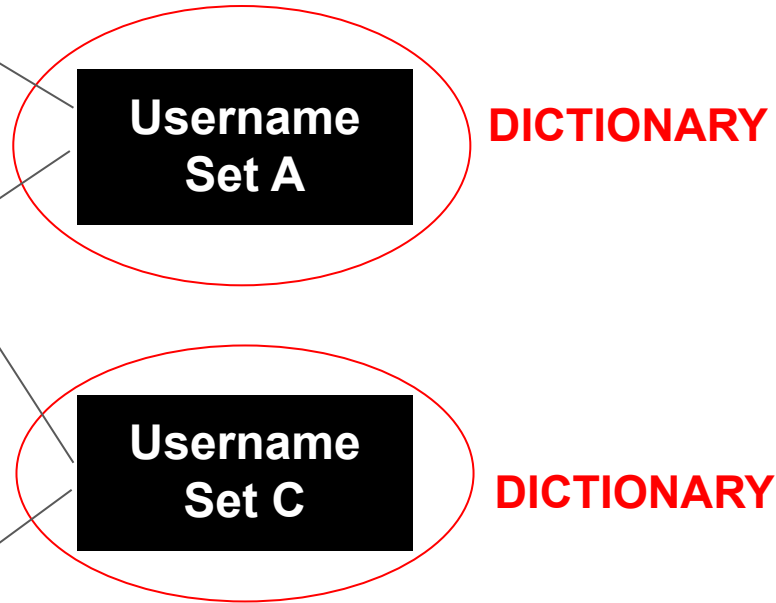
Attacker_n → Username Set C

Username Set in Guessing Vector

Attacker_1 → Username Set A

Attacker_2 → Username Set B

- **64% attackers use dictionary**
- **94% of the attackers user at least one username from a dictionary**



Attacker_n → Username Set C

Dictionary Based Blocking (DBB)

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- How DBB performs in % Attacks Blocked and False Positives?

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- Does the characteristics of Dictionary Based Blocking generalize?

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- We simulated DBB on three different sites data (A,B,C) over ten weeks.
- DBB effectively blocked over 99.3% of BFAs across all sites with only ~14 false positives per site.

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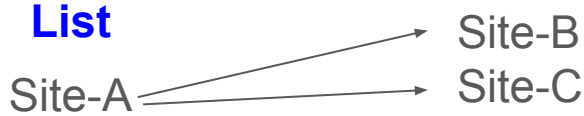
Username Blocking List

Site-A

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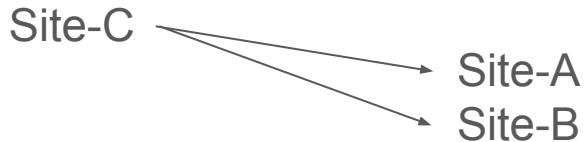
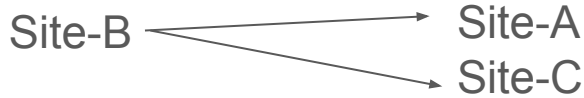
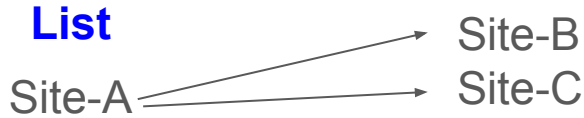
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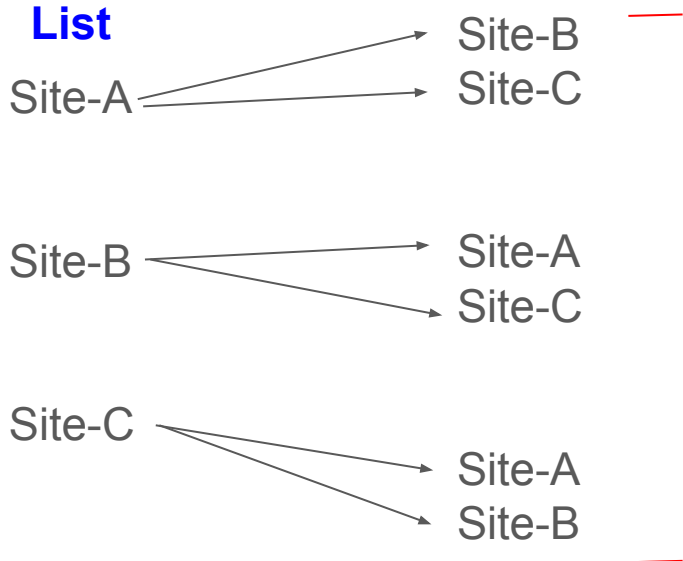
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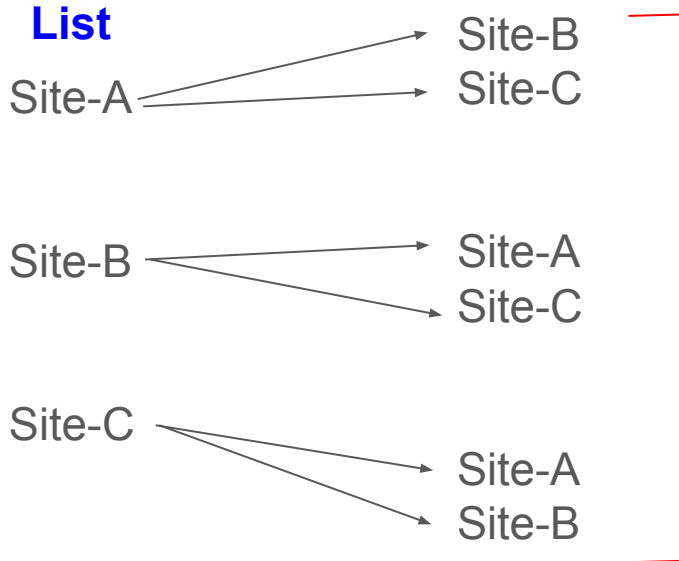


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13 False Positives

Dictionary Based Blocking (DBB)

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“High Blocking Rate with Low False Positives”

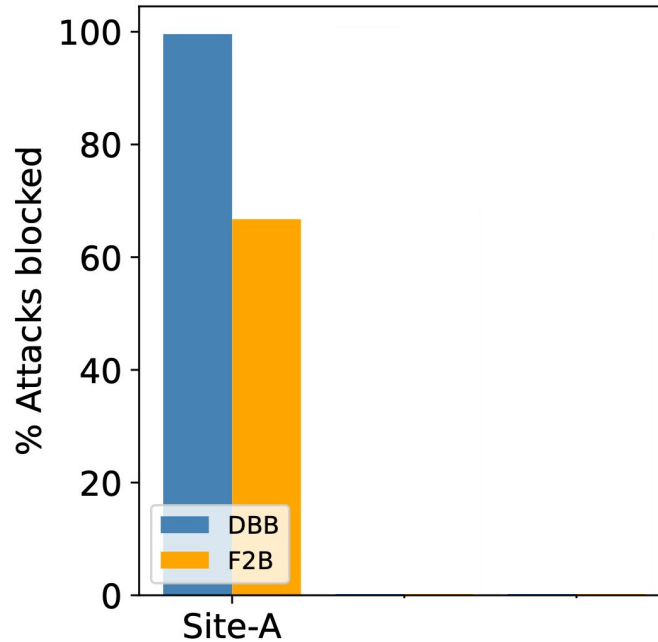
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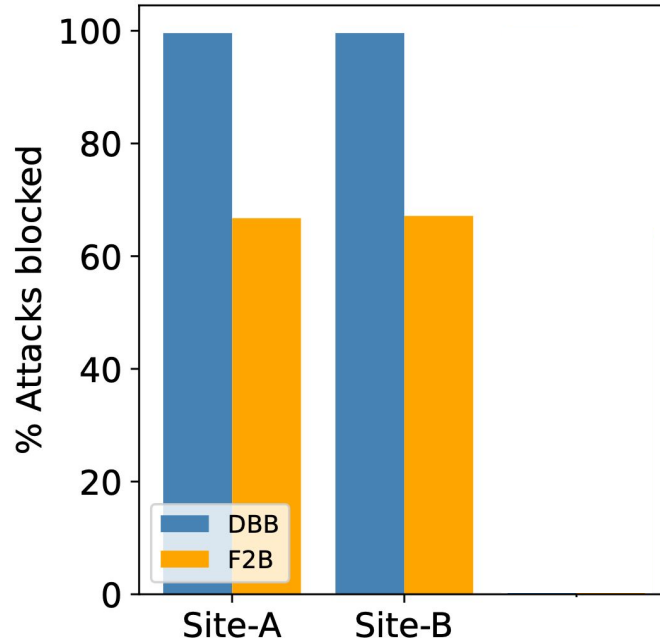
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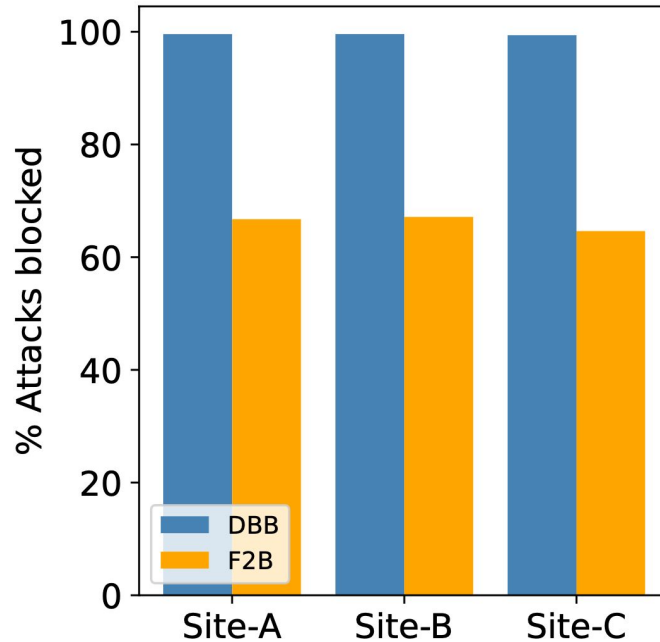
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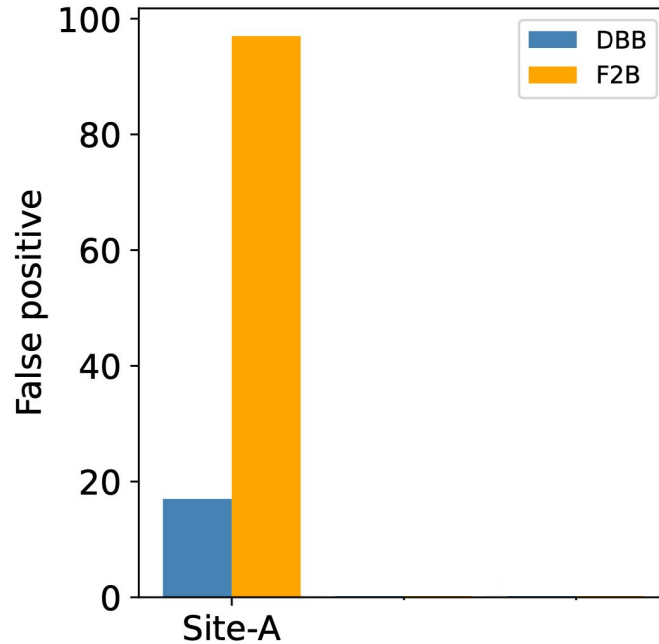
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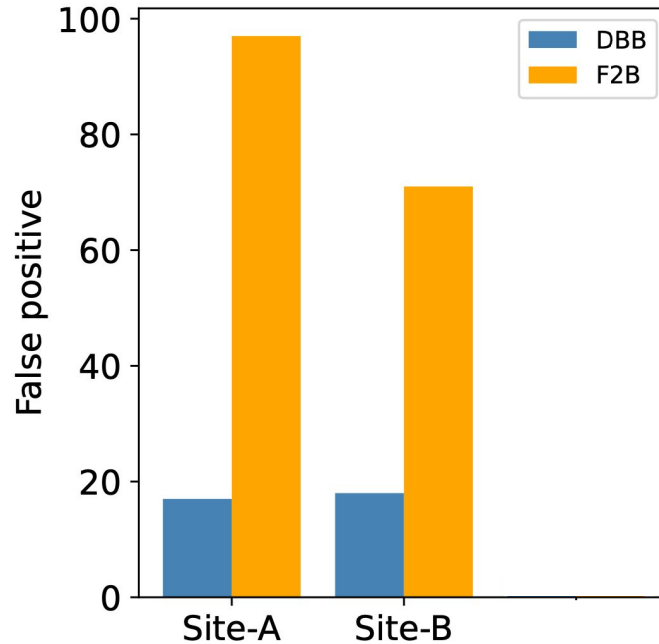
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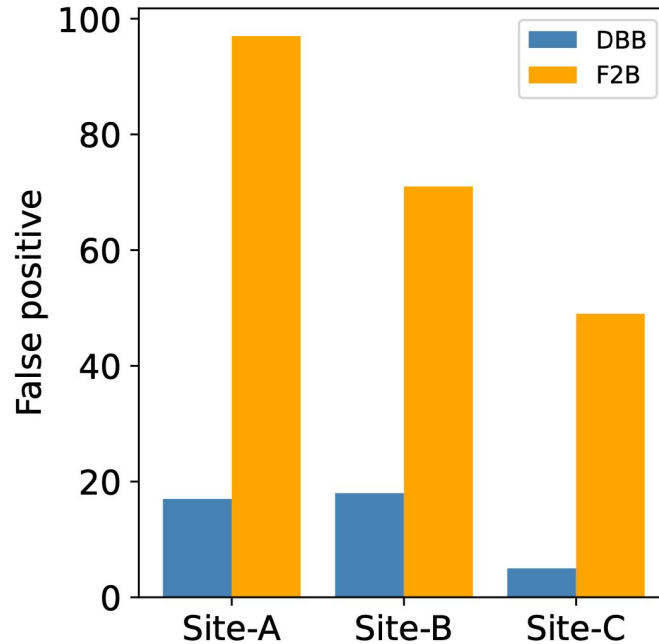
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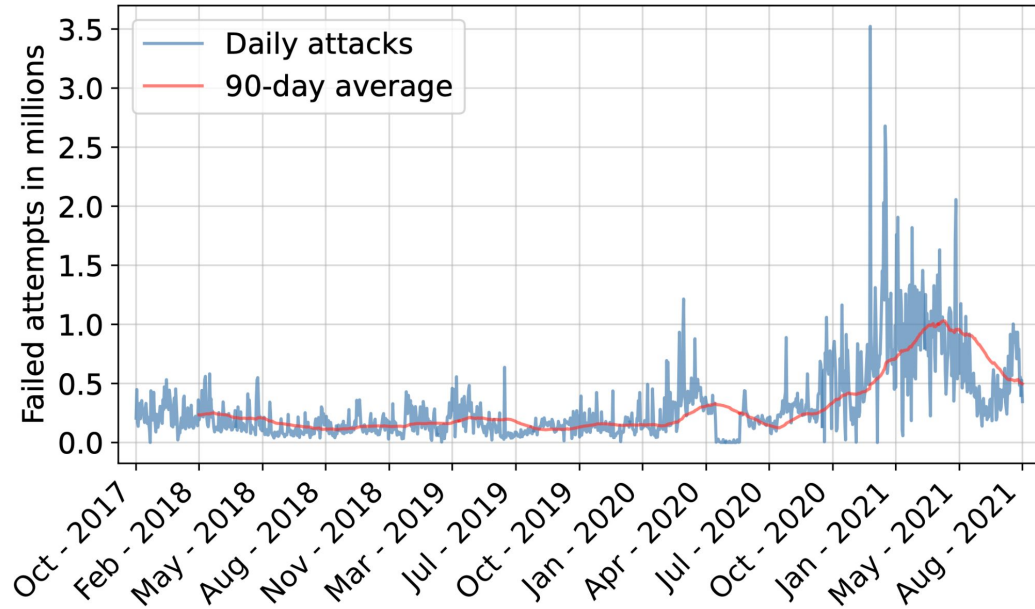
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**“Dictionary Based Blocking outperforms
Fail2ban with huge margin”**

Dictionary Based Blocking In Production

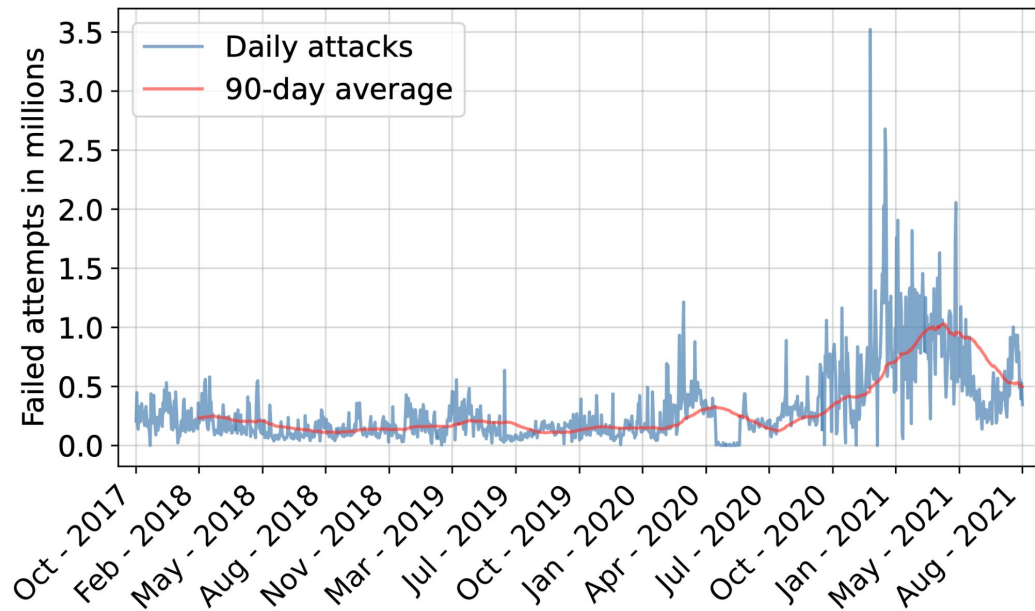
Dictionary Based Blocking In Production

Revisiting SSH Brute Force Attacks in the Wild



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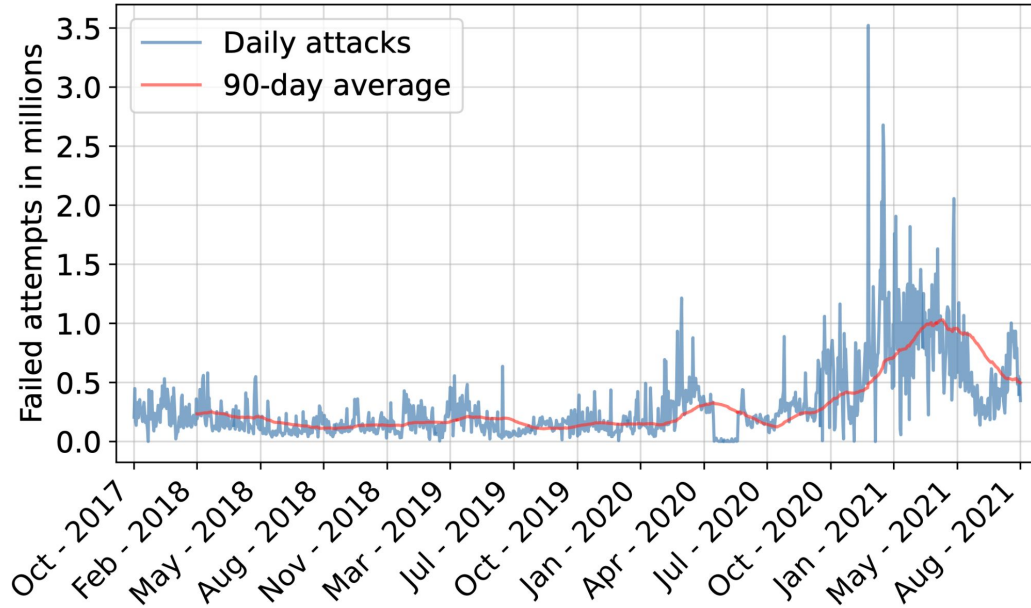
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→ After Aug 2021?

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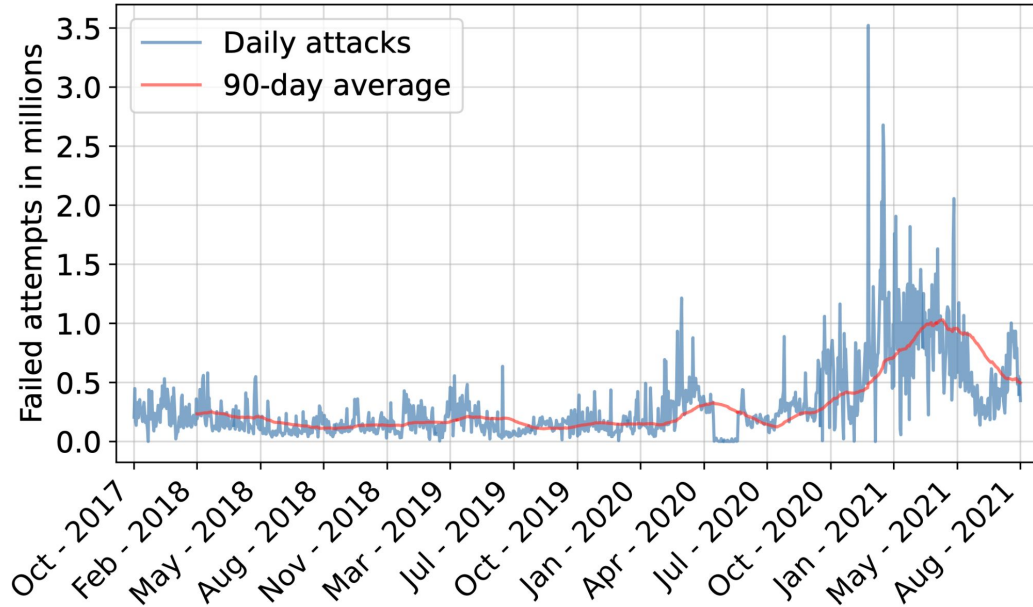
FIREWALL

Periodic updation of filter rules

Aug 2021

Dictionary Based Blocking In Production

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Unfiltered

Aug 2021

Filtered

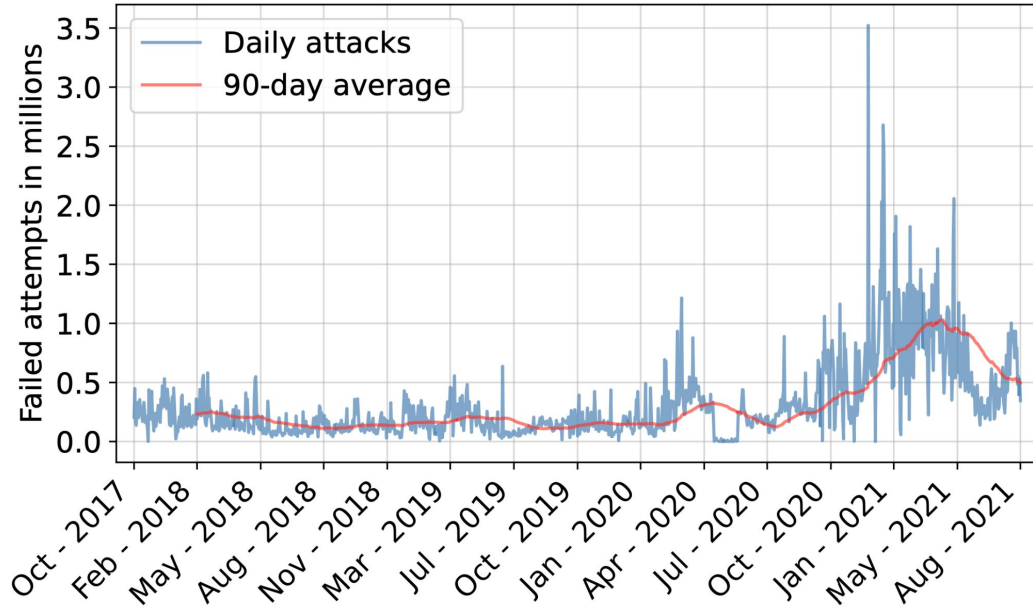
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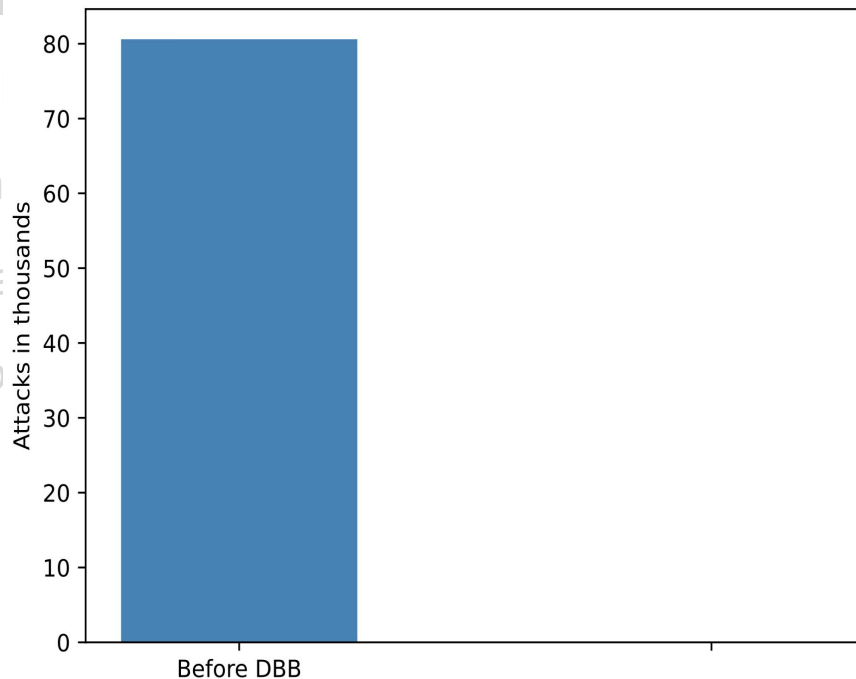
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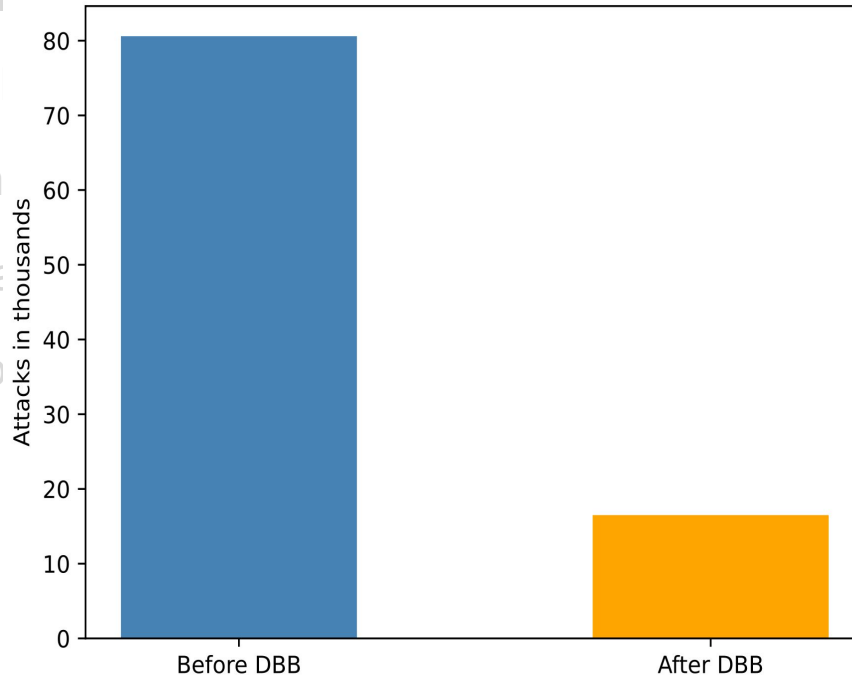
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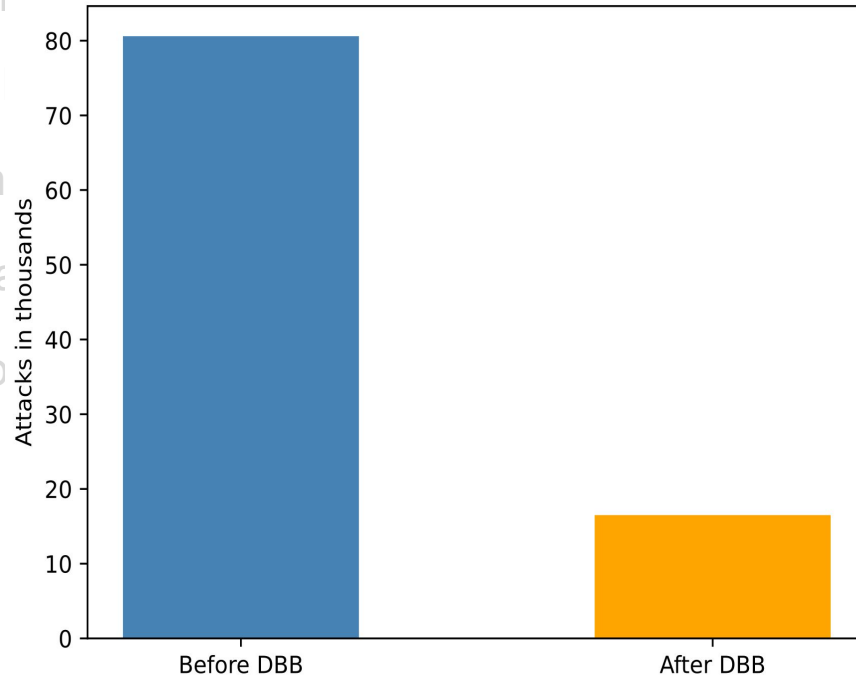
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Evaluating DBB In Production

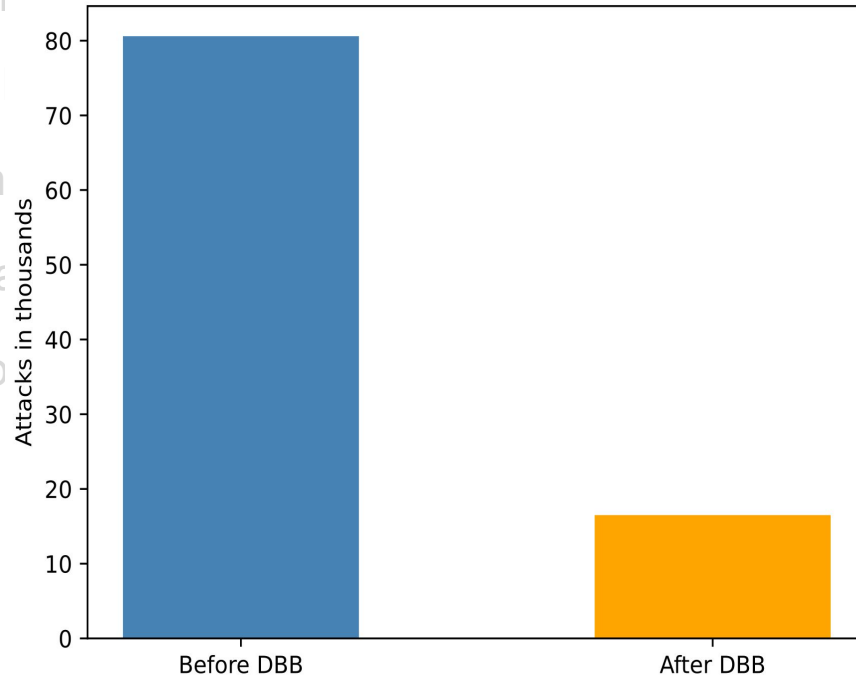
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Blocks Four-fifths attacks missed by other defences

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an exact attack block

**Blocks Four-fifths
attacks missed by
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DBB had zero FP

- Does the performance comes from the high number of nodes in CloudLab?

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Short answer is

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Short answer is NO

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Short answer is **NO**

Long answer is

- Does the performance comes from the high number of nodes in CloudLab?

Short answer is **NO**

Long answer is **NO IT DOESN'T**

- Does the performance comes from the high number of nodes in CloudLab?
 - How many nodes (collectors) are required to perform effective blocking?

Long answer is **NO IT DOESN'T**

Performance based on number of Collectors

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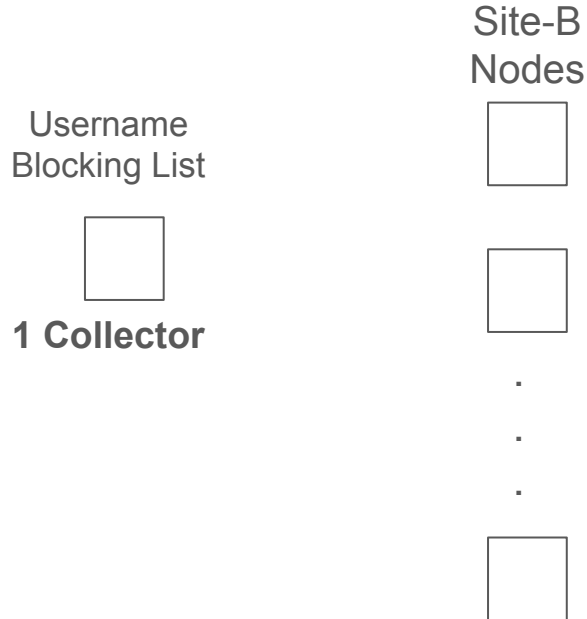
Username
Blocking List



1 Collector

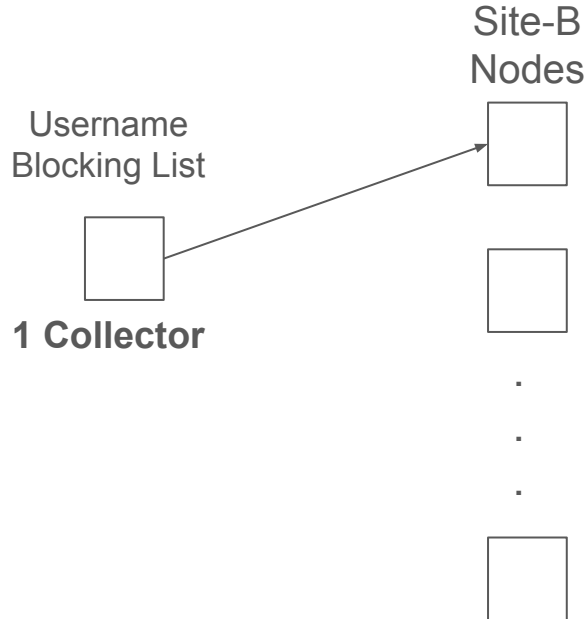
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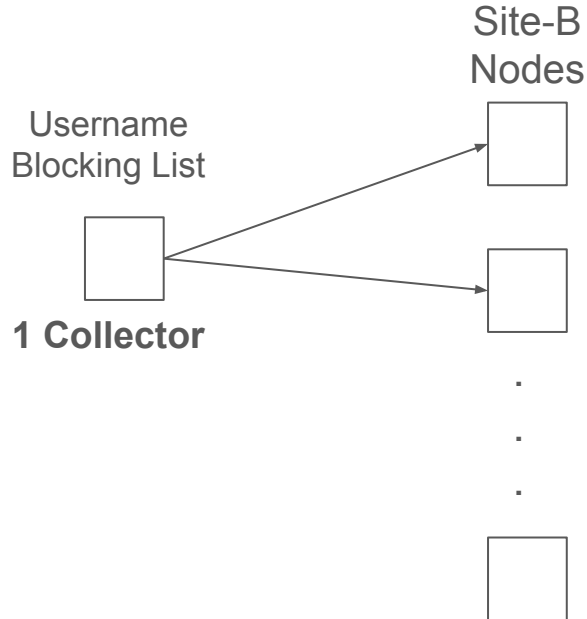
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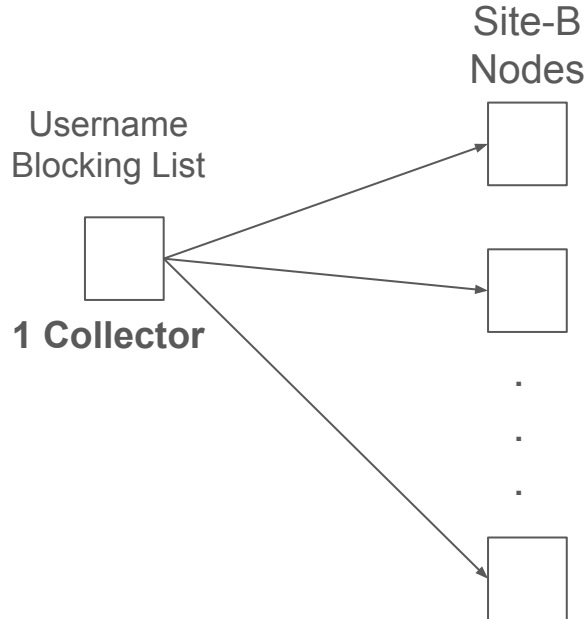
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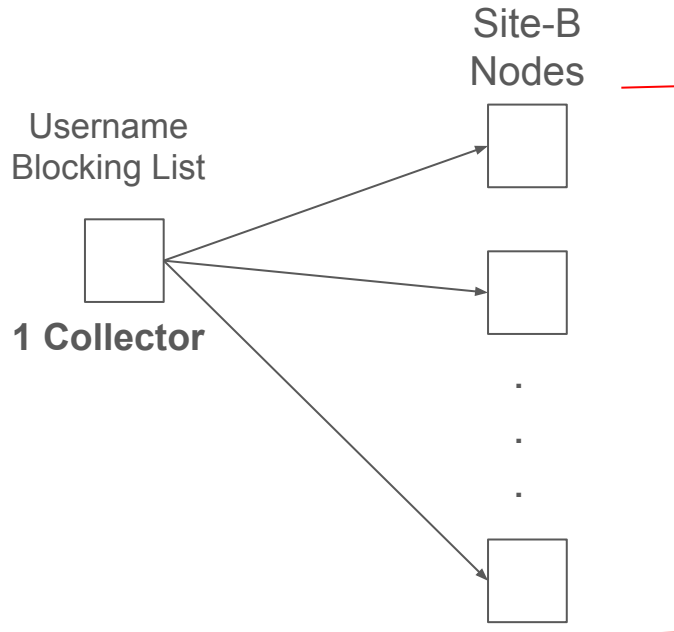
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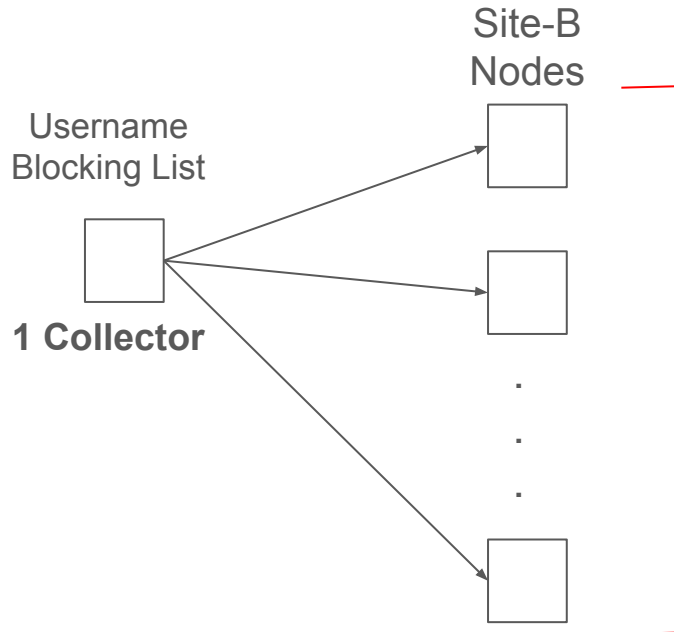
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1 Collector - Blocked Minimum 97.6% attacks

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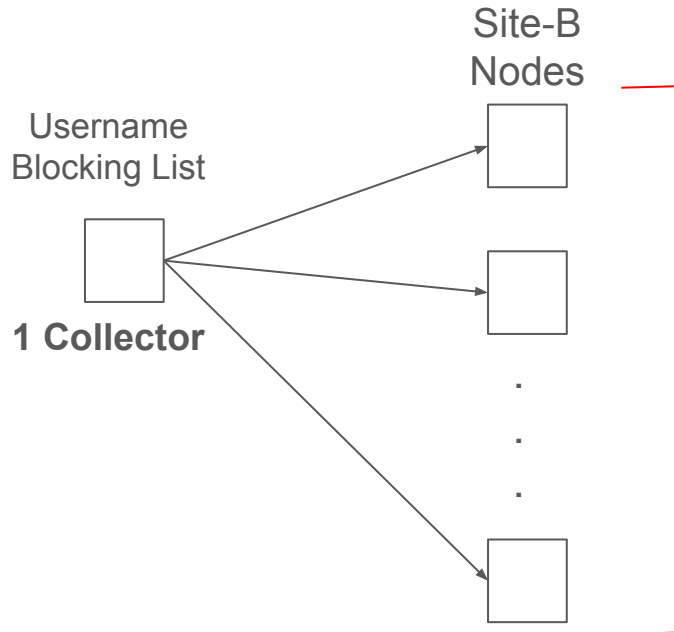
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6 Collector - Blocked Minimum 99.0% attacks

Performance based on number of Collectors

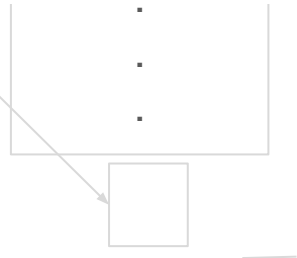
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“Few collectors can also perform effective blocking”

Username
Blocking List



1 Collector



6% attacks
4% attacks

6 Collector - Blocked Minimum 99.0% attacks

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Paper has more insights.

Questions

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