## Asymmetric PSI and Its Leakage:

A Case Study of the MIGP Protocol



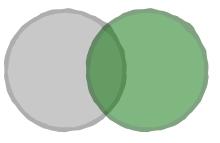
Evgenios M. Kornaropoulos

https://encrypted.systems

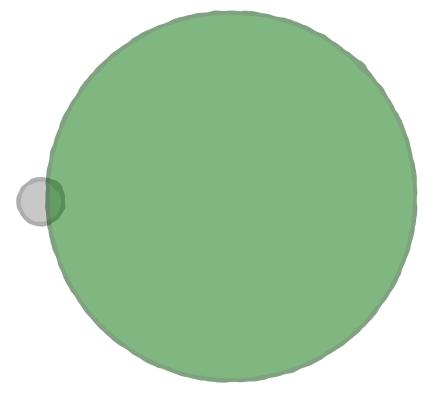
Joint work with:

Dario Pasquini George Mason University Danilo Francati
Royal Holloway University

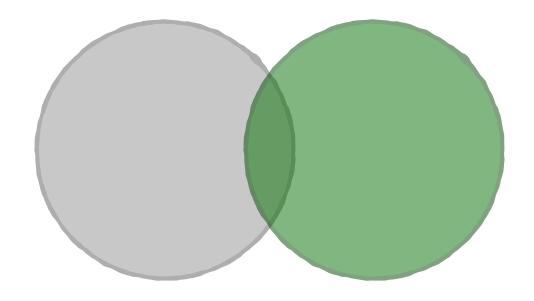
Giuseppe Ateniese
George Mason University



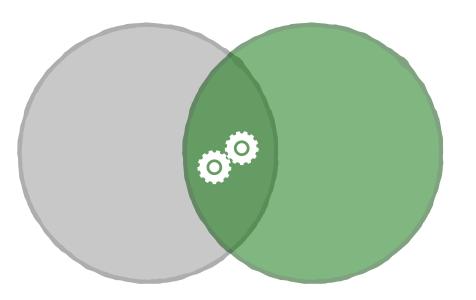
PSI on small sets (hundreds)



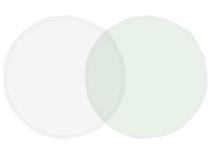
PSI on asymmetric sets (billions)



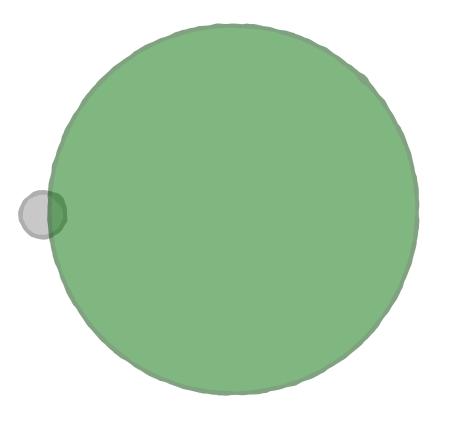
PSI on large sets (millions)



Computing on the set intersection



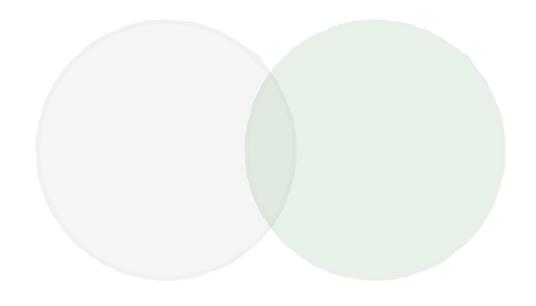
PSI on small sets (hundreds)



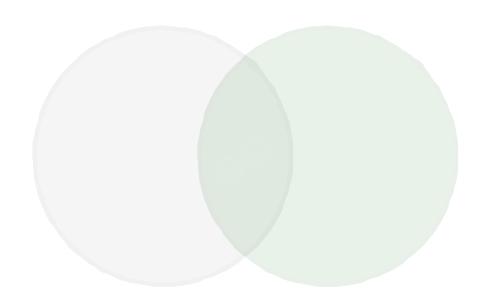
PSI on asymmetric sets (billions)







PSI on large sets (millions)



Computing on the set intersection



Alice

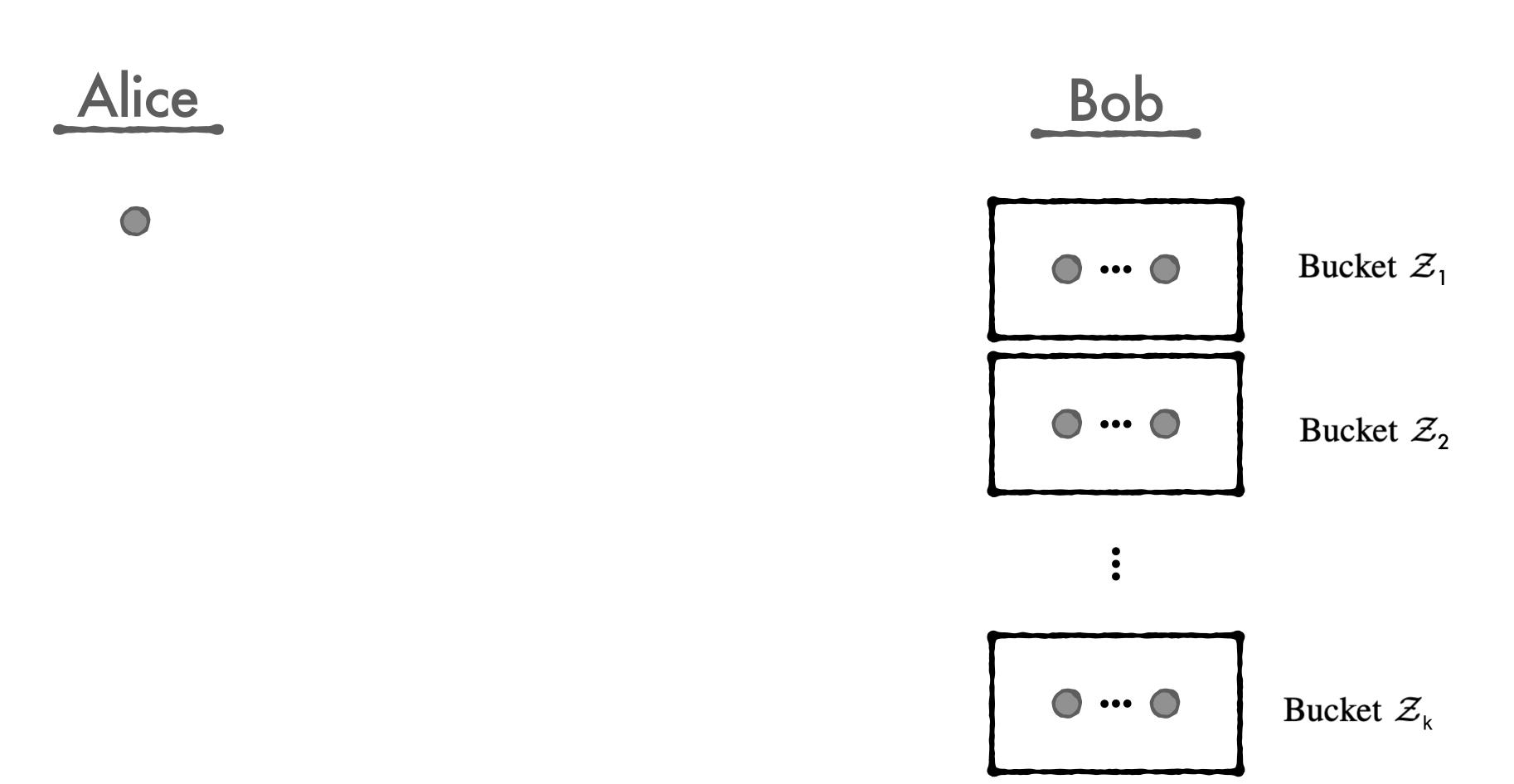
1 element

Bob

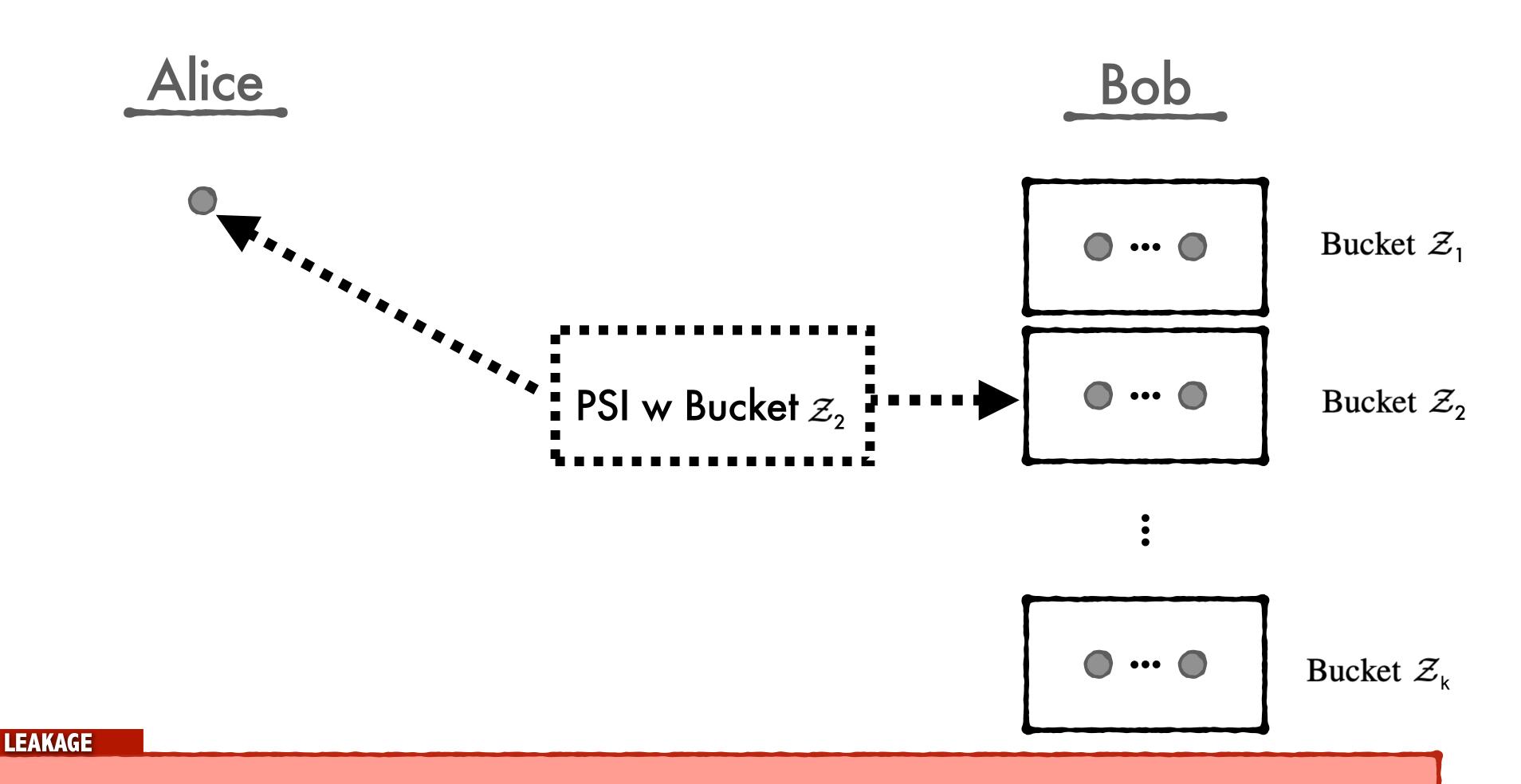


2 Billion elements





## A CLOSER LOOK AT A DEPLOYED ASYMMETRIC PSI SOLUTION: PARTITION THE LARGE SET



By Design: The choice of bucket reveals info about Alice's element

# Need to Understand the **CONTEXT** to Assess the Seriousness of this Leakage



☐ cybernews® News - Editorial Security Privacy Crypto Tech Resources - Tools - Reviews -

Home » Security

#### Mother of all breaches reveals 26 billion records: what we know so far

Updated on: January 29, 2024 10:07 AM 3

Vilius Petkauskas, Deputy Editor



Image by Cybernews.











The supermassive leak contains data from numerous previous breaches, comprising an astounding 12 terabytes of information, spanning over a mind-boggling 26 billion records. The leak, which contains LinkedIn, Twitter, Weibo, Tencent, and other platforms' user data, is almost certainly the largest ever discovered.

There are data leaks, and then there's this. A supermassive Mother of all Breaches (MOAB for short) includes records from thousands of meticulously compiled and reindexed leaks, breaches, and privately sold databases. The full and searchable list is included at the end of this article.

Bob Dyachenko, cybersecurity researcher and owner at SecurityDiscovery.com, together with the Cybernews team, has discovered billions upon billions of exposed records on an open instance.

Even though at first the owner of the database was unknown, Leak-Lookup, a data breach search engine, said it was the holder of the leaked dataset. The platform posted a message on X, saying the problem behind the leak was a "firewall misconfiguration" which was fixed

#### Editor's choice



Why are people returning their Apple Vision Pro headsets?

by Neil C. Hughes 3 21 February 2024

Why is the highly anticipated Apple Vision Pro headset returning to stores from the hands of early adopters, nfluencers, and tech bros?

Read more



Cybernews podcast: how algorithms curate and flatten our

© 23 February 2024



Book review: Kyle Chayka's "Filterworld" investigates algorithms

① 24 February 2024



The unequal nature of working from home

() 23 February 2024



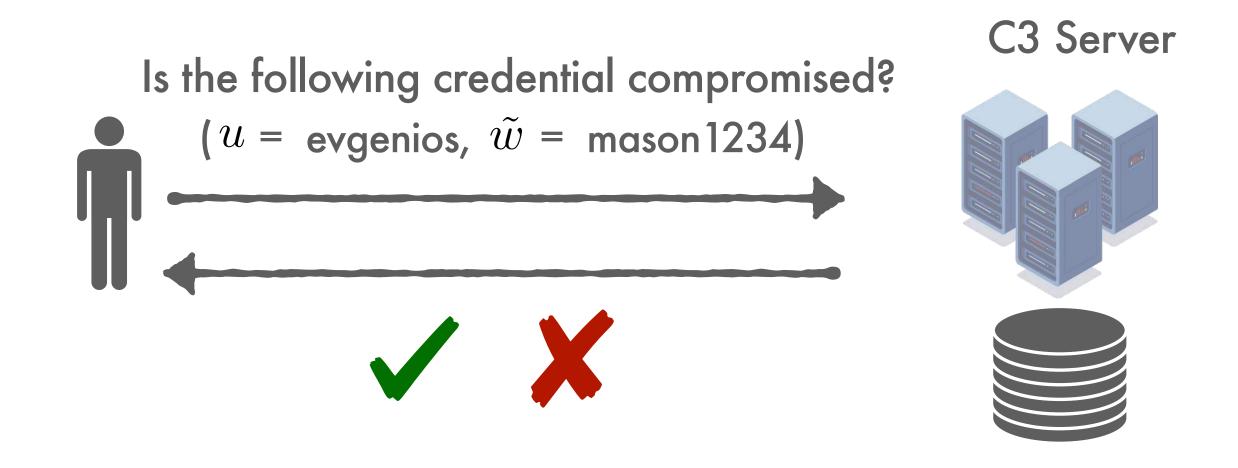
LockBit's earnings in the multibillion-dollar territory - NCA

A similar dataset in 2021 had 3 billion records (an 8x increase in 2024)

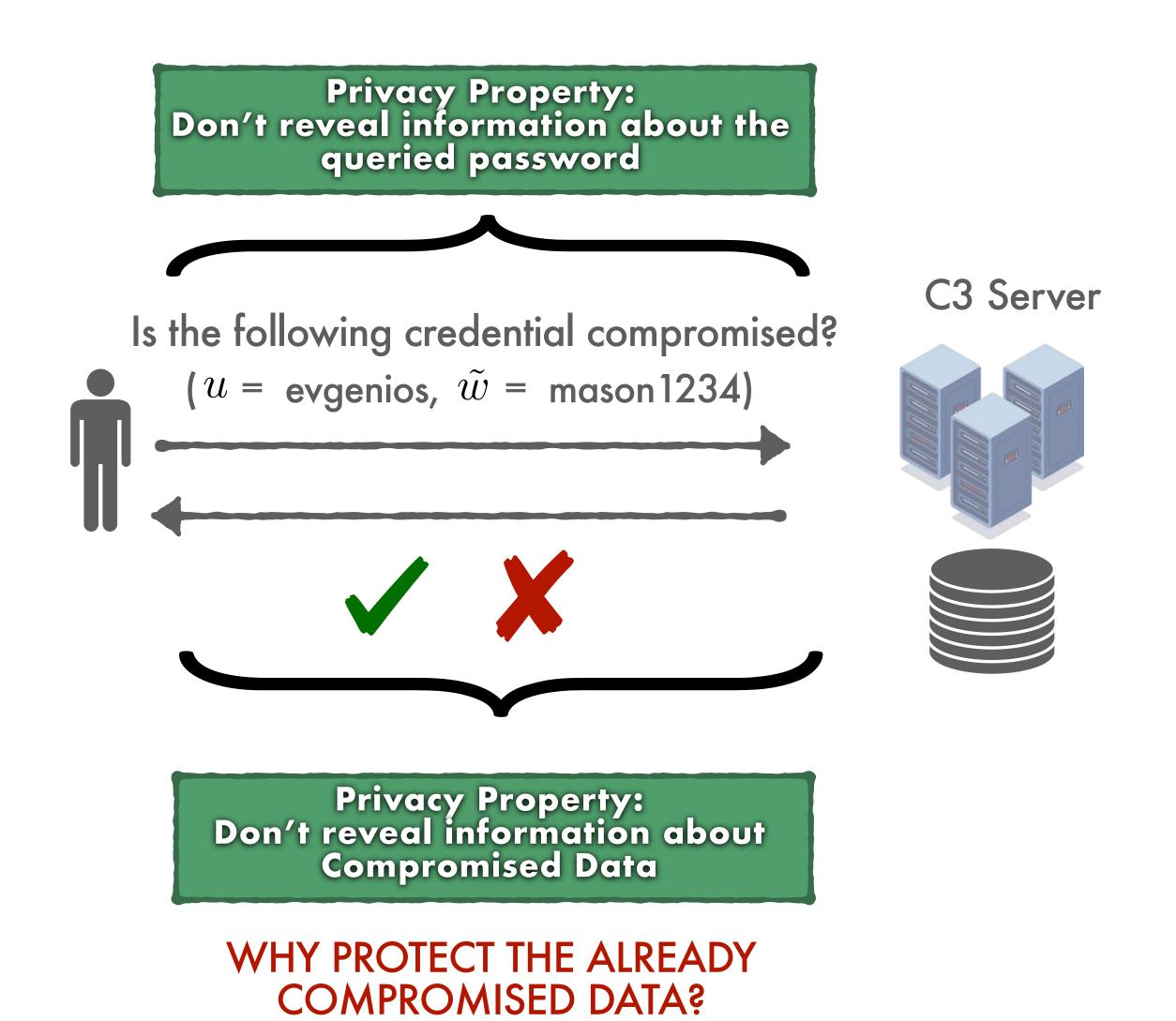
MOAB contains 12 Terabytes of information and 25 billion records. (January 2024)

BRANDS WITH 100M+ LEAKED RECORDS						
BRAND NAME	RECORDS LEAKED					
Tencent	1.5B 504M					
Weibo						
MySpace	360M					
Twitter	281M					
Wattpad	271M					
NetEase	261M 258M					
Deezer						
LinkedIn	251M					
AdultFriendFinder	220M					
Zynga	217M					
Luxottica	206M					
Evite	179M					
Zing	164M					
Adobe	153M					
MyFitnessPal	151M					
Canva	143M					
JD.com	142M					
Badoo	127M					
VK	101M					
Youku	100M					

## POST-COMPROMISE SOLUTION COMPROMISED CREDENTIAL CHECKING (C3) SERVICE



# POST-COMPROMISE SOLUTION COMPROMISED CREDENTIAL CHECKING (C3) SERVICE







Seized Genesis Market Data is Now Searchable in Have I Been Pwned, Courtesy of the FBI and "Operation Cookie Monster"



A quick summary first before the details: This week, the FBI in cooperation with international law enforcement partners took down a notorious marketplace trading in stolen identity data in an effort they've named "Operation Cookie Monster". They've provided millions of impacted email addresses and passwords to Have I Been Pwned (HIBP) so that victims of the incident can discover if they have been exposed. This breach has been flagged as "sensitive" which means it is not publicly searchable, rather you must demonstrate you control the email address being searched before the results are shown. This can be done via the free notification service on HIBP and involves you entering the email address then clicking on the link sent to your inbox. Specific guidance prepared by the FBI in conjunction with the Dutch police on further steps you can take to protect yourself are detailed at the end of this blog post on the gold background. That's the short version, here's the whole story:

#### Troy Hunt

Regional Director and MVP who travels the world speaking at events and training technology professionals →

#### **Upcoming Events**

I often run <u>private workshops</u> around these, here's upcoming events I'll be at:

NDC Oslo: 10 to 14 Jun, Oslo (Norway)

#### Must Read

Data breach disclosure 101: How to succeed after you've failed

Data from connected CloudPets teddy bears leaked and ransomed, exposing kids' voice messages

Here's how I verify data breaches

In April 2023, FBI shared with a C3 service millions of compromised but not publicly available credentials

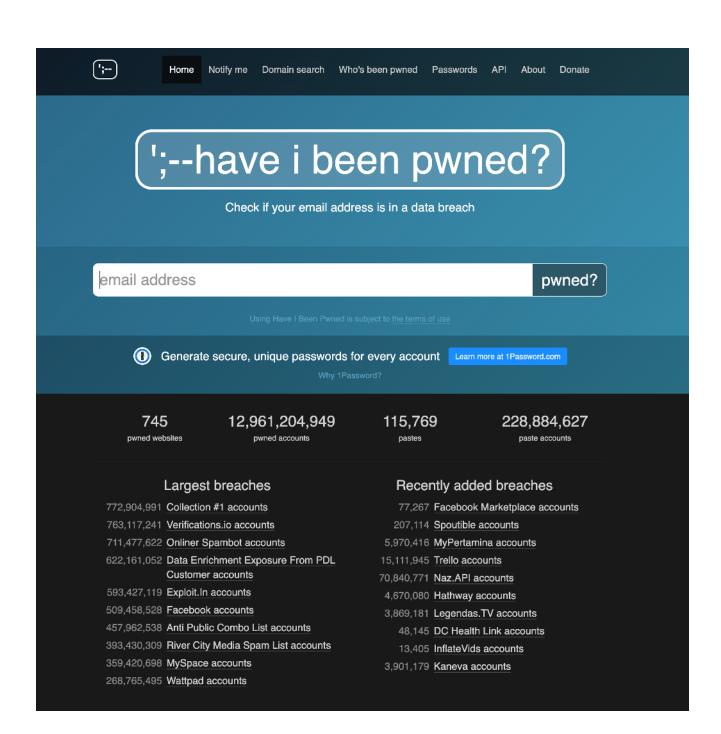
- In practice, the compromised credential set will contain a combination of:

  - (1) publicly available and(2) non-accessible compromised credentials.

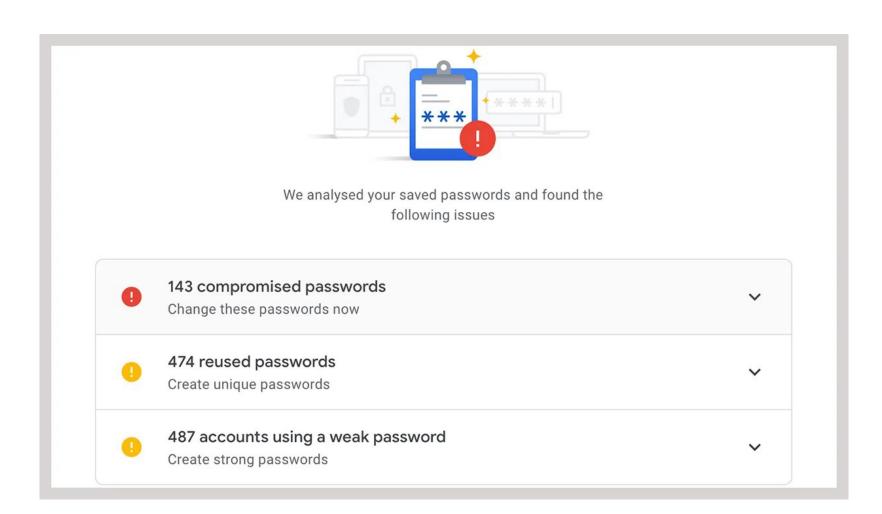


## DEPLOYED TECHNOLOGY

### COMPROMISED CREDENTIAL CHECKING (C3) SERVICE



https://haveibeenpwned.com/



Password Checkup (Google)

#### ACM CCS'19

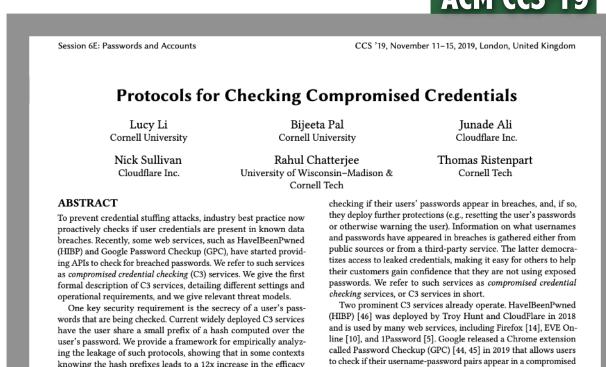
dataset. Both services work by having the user share with the C3

server a prefix of the hash of their password or of the hash of their

username-password pair. This leaks some information about user

passwords, which is problematic should the C3 server be compro-

nised or otherwise malicious. But until now there has been no

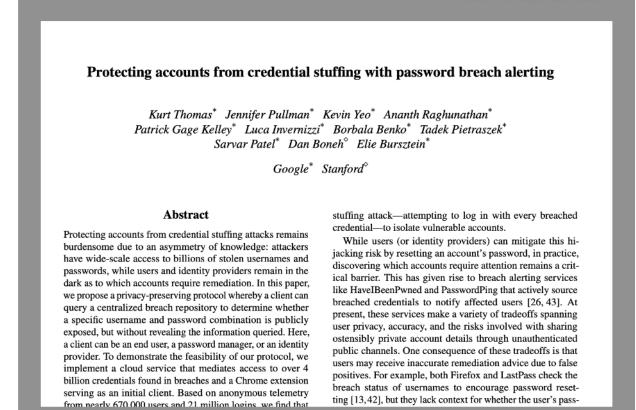


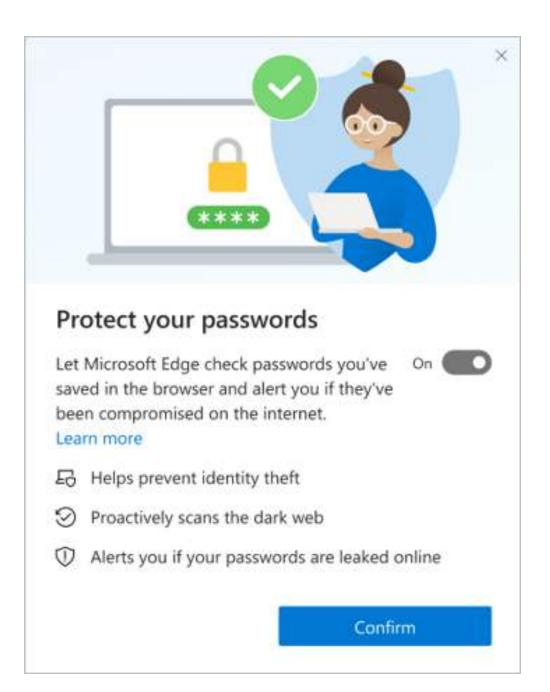
of remote guessing attacks. We propose two new protocols that

and show experimentally that they remain practical to deploy.

provide stronger protection for users' passwords, implement them,

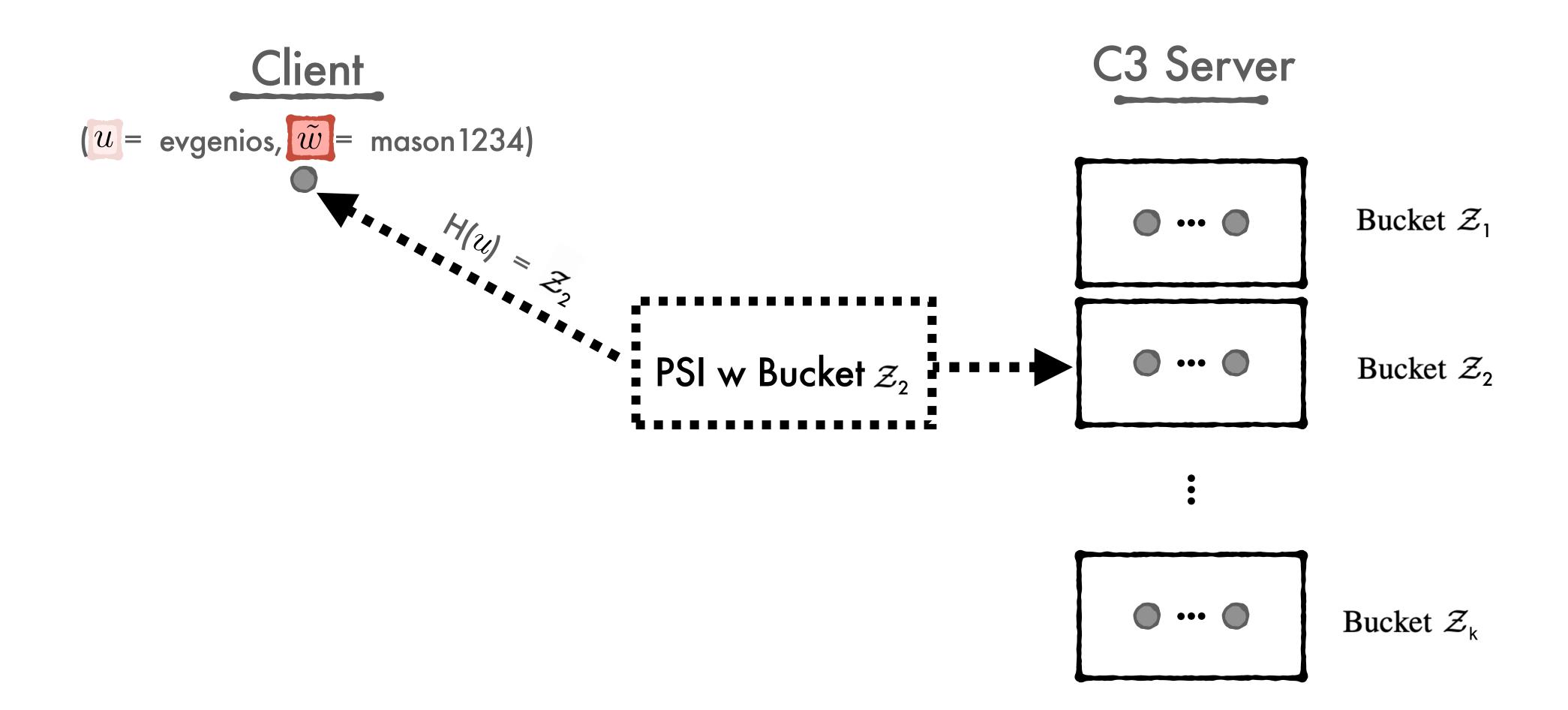
#### **USENIX SEC'19**



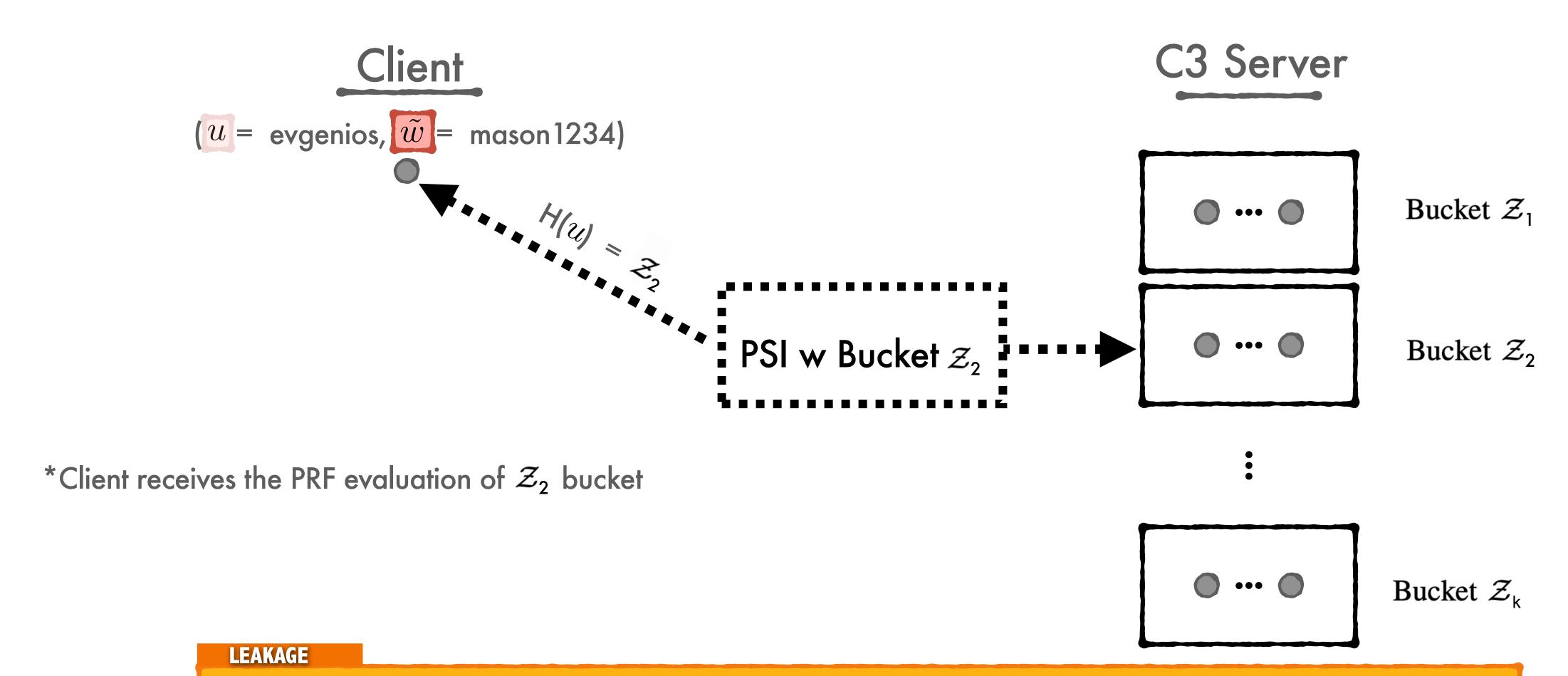


Password Monitor (Microsoft)









By Design: The choice of bucket reveals info about Client's <u>username</u>



### MIGHT I GET PWNED THE ASYMMETRIC PSI PROTOCOL UNDER ATTACK

#### **USENIX SEC'22**

#### **Might I Get Pwned:** A Second Generation Compromised Credential Checking Service

Bijeeta Pal<sup>†</sup>, Mazharul Islam<sup>‡</sup>, Marina Sanusi Bohuk<sup>†</sup>, Nick Sullivan<sup>\*</sup>, Luke Valenta<sup>\*</sup>, Tara Whalen\*, Christopher Wood\*, Thomas Ristenpart<sup>††</sup>, Rahul Chatterjee<sup>‡</sup> <sup>†</sup>Cornell University, <sup>‡</sup>University of Wisconsin–Madison, <sup>\*</sup>Cloudflare, <sup>††</sup>Cornell Tech

#### Abstract

Credential stuffing attacks use stolen passwords to log into victim accounts. To defend against these attacks, recently deployed compromised credential checking (C3) services provide APIs that help users and companies check whether a username, password pair is exposed. These services however only check if the exact password is leaked, and therefore do not mitigate credential tweaking attacks — attempts to compromise a user account with variants of a user's leaked passwords. Recent work has shown credential tweaking attacks can compromise accounts quite effectively even when the credential stuffing countermeasures are in place.

We initiate work on C3 services that protect users from credential tweaking attacks. The core underlying challenge is how to identify passwords that are similar to their leaked passwords while preserving honest clients' privacy and also preventing malicious clients from extracting breach data from the service. We formalize the problem and explore ways to measure password similarity that balance efficacy, performance, and security. Based on this study, we design "Might I Get Pwned" (MIGP), a new kind of breach alerting service. Our simulations show that MIGP reduces the efficacy of stateof-the-art 1000-guess credential tweaking attacks by 94%. MIGP preserves user privacy and limits potential exposure of sensitive breach entries. We show that the protocol is fast, with response time close to existing C3 services. We worked with Cloudflare to deploy MIGP in practice.

#### 1 Introduction

Users often pick the same or similar passwords across multiple web services [22,42,54]. Attackers therefore compromise user accounts using passwords leaked from other websites. This is known as a credential stuffing attack [25]. In response, practitioners have set up third-party services such as Have I Been Pwned (HIBP) [37, 48], Google Password Checkup (GPC) [44, 47], and Microsoft Password Monitor [33] that provide APIs to check if a user's password has been exposed in known breaches. Such breach-alerting services, also called compromised credential checking (C3) services [37], help prevent credential stuffing attacks by alerting users to change

Existing C3 services, however, can leave users vulnerable to credential tweaking attacks [22,41,51] in which attackers guess variants (tweaks) of a user's leaked password(s). Pal et al. [41] estimate that such a credential tweaking attacker can compromise 16% of user accounts that appear in a breach in less than a thousand guesses, despite the use of a C3 service.

We therefore initiate exploration of C3 services that help warn users about passwords similar to the ones that have appeared in a breach. We design "Might I Get Pwned" (MIGP, the name is a tribute to the first-ever C3 service, HIBP). In MIGP, a server holds a breach dataset D containing a set of username, password pairs  $(u_i, \tilde{w}_i)$ . A client can query MIGP with a username, password pair (u, w), and learns if there exists  $(u, \tilde{w}) \in D$  such that  $w = \tilde{w}$  or w is similar to  $\tilde{w}$ . To realize such a service, we must (1) determine an effective way of measuring password similarity, that (2) works well with a privacy-preserving cryptographic protocol, and that (3) resists malicious clients that try to extract entries from D.

Ideally, we want our similarity measure to help warn users if their password w is vulnerable to online credential tweaking attacks. These attacks [22, 41, 51] take as input a breached password  $\tilde{w}$  and generate an ordered list of guesses. Therefore, a good starting point for defining similarity is to call w similar to  $\tilde{w}$  should w appear early in the guess list generated by a state-of-the-art credential tweaking attack. Such a generative approach also works well with simple extensions to existing cryptographic private membership test (PMT)-based protocol [37,47]. A PMT allows a client to learn if  $(u, \tilde{w}) \in D$ without revealing it to the server. To extend, we can have the server insert *n* variants of each breached password into D and we can allow clients to generate m variants and repeat the PMT for each of them. The PMT can be designed to reveal, upon a match, whether a password matches the original

To concretize this approach requires understanding how to efficiently generate effective variants. Existing credential tweaking attack algorithms are computationally expensive to

Cloudflare Research MIGP ("Might I Get Pwned") Enter the credentials you would like to check: Email Password Submit credentials Get Started Free | Contact Sales: +1 (888) 993-5273 Subscribe to receive notifications of new posts: **Privacy-Preserving Compromised Credential Checking** Luke Valenta Cefan Daniel Rubin Christopher Wood 13 min read Today we're announcing a public demo and an open-sourced Go implementation of a next-generation, privacy-preserving compromised credential checking protocol called MIGP ("Might I Get Pwned", a nod to Troy Hunt's "Have I Been Pwned"). Compromised credential checking services are used to alert users when their credentials might have been exposed in data breaches. Critically, the 'privacy-preserving' property of the MIGP protocol means that clients can check for leaked credentials without leaking any information to the service about the queried password, and only a small amount of information about the queried username. Thus, not only can the service inform you

when one of your usernames and passwords may have become compromised, but it

MIGP ("Might I Get Pwned") is a privacy-preserving compromised credential checking (C3) service. Read more about our work <a href="here">here</a>. When using other C3s you may be <u>leaking sensitive information</u> while you are trying to check that your credentials have not been compromised! MIGP avoids that irony and preserves your privacy. Aside from a bucket ID derived from a prefix of the hash of your email,

**DEMO** 

encrypted) over the Internet. This site is a demonstration of the protocol and not a fully-fledged

your credentials stay on your device and are never sent (even

service. For a more comprehensive dataset visit HIBP

<u>Contact us Privacy policy Terms of service</u>

https://migp.cloudflare.com/

**USENIX Association** 

31st USENIX Security Symposium 1831

#### Breach Extraction Attacks: Exposing and Addressing the Leakage in **Second Generation Compromised Credential Checking Services**

George Mason University

ateniese@gmu.edu

Dario Pasquini\* SPRING lab, EPFL Danilo Francati\* Aarhus University

dario.pasquini@epfl.ch dfrancati@cs.au.dk

Giuseppe Ateniese Evgenios M. Kornaropoulos

George Mason University

Abstract—Credential tweaking attacks use breached passwords to generate semantically similar passwords and gain access to victims' services. These attacks sidestep the first generation of compromised credential checking (C3) services. The second generation of compromised credential checking services, called "Might I Get Pwned" (MIGP), is a privacy-preserving protocol that defends against credential tweaking attacks by allowing clients to query whether a password or a semantically similar variation is present in the server's compromised credentials dataset. The desired privacy requirements include not revealing the user's entered password to the server and ensuring that no compromised credentials are disclosed to the client.

In this work, we formalize the cryptographic leakage of the MIGP protocol and perform a security analysis to assess its impact on the credentials held by the server. We focus on how this leakage aids breach extraction attacks, where an honest-but-curious client interacts with the server to extract information about the stored credentials. Furthermore, we discover additional leakage that arises from the implementation of Cloudflare's deployment of MIGP. We evaluate how the discovered leakage affects the guessing capability of an attacker in relation to breach extraction attacks. Finally, we propose MIGP 2.0, a new iteration of the MIGP protocol designed to minimize data leakage and prevent the introduced attacks.

#### 1. Introduction

In the evolving cyber threat landscape, attackers target user credentials, particularly those stored in plaintext, exploiting system vulnerabilities to compromise and post them online, thereby breaching user privacy and enabling *creden*tial stuffing attacks [1]. In these attacks, adversaries exploit widespread password reuse [2], [3], [4], [5] by using credentials exposed from a data breach to attempt unauthorized access to another unrelated domain. Services like "Have I Been Pwned" [6], Google Password Checkup [7], and Microsoft Password Monitor [8]—known as Compromised Credential Checking (C3) services— aim to alert users about the possibility of a credential stuffing attack. Specifically, they allow users to check if their active credentials appear in breach datasets. To accomplish this, C3 services use cryptographic tools to create a privacy-preserving protocol,

\*Equal contribution.

ensuring that the queried password of the user (which may not be breached) is not disclosed to the server and the sensitive breached credentials are not shared with the client.

However, these services cannot cover an increasingly common type of attack: credential tweaking attacks [2], [9], [10]. In these attacks, cybercriminals employ sophisticated techniques to generate slight variants of known breached passwords, enabling them to make distinct educated password guesses towards unauthorized access to the target's services. Unfortunately, credential tweaking attacks are not covered by C3 services since they only check for an exact match against the breached credentials. To address these shortcomings, Pal et al. [11] proposed Might I Get Pwned (MIGP), a second-generation C3 service. MIGP extends the capabilities of conventional C3 by checking not only for exact password matches but also for semantic similarity with breached credentials. To achieve this, MIGP uses a password-generating function called au to generate semantically similar passwords during the initialization phase.

The Role of Cryptographic Leakage in MIGP. It is important to note that the privacy-preserving design of MIGP serves (in part) the purpose of safeguarding the collection of breached credential data from being exposed to MIGP query issuers. Paradoxically, despite the MIGP server's data collection being labeled as "breached credentials," it can contain credentials that have been breached but are not publicly available. In April 2023 [12], the FBI took down a stolen identity marketplace that was selling non-publicly available breached credentials. To combat credential stuffing attacks, the FBI shared in confidence millions of non-publicly available compromised credentials with HIBP. Thus, real-world C3 services work with breached credentials that should not be exposed under any circumstances.<sup>1</sup>

Our work sheds light on an unexplored aspect of the MIGP protocol: the existence of *cryptographic leakage* over the stored credentials. This leakage is a controlled disclosure intentionally designed into the protocol. The term breach extraction attack describes the attack vector in which

1. We note that if the breached credentials of the server are all considered public, then there is no point in deploying a privacy-preserving C3; the server can simply return a subset (i.e., a bucket) of the credentials in plaintext. This change enhances efficiency by forgoing cryptographic operations for non-interactive queries. Additionally, it fortifies defenses against tweaking attacks, allowing users to apply arbitrary similarity functions to PASQUINI, FRANCATI, ATENIESE, E.M.K.

Proc. IEEE SECURITY & PRIVACY (Oakland), 2024

#### Our Contributions:

- 1. Formalizing the Leakage in MIGP
- 2. Taxonomy of T-collisions
- 3. Breach Extraction Attacks via Leakage
- 4. MIGP 2.0

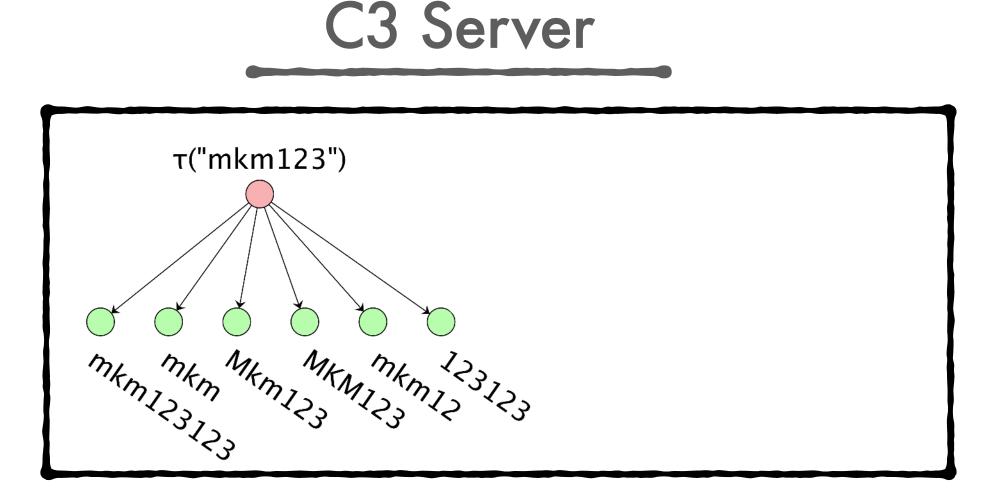


2024

BREACH EXTRACTION ATTACKS: Exposing and Addressing the Leakage in Second-Generation Compromised Credential Checking Services

## UNINTENDED LEAKAGE OF MIGP ZOOMING IN THE BUCKETS OF ASYMMETRIC PSI

- MIGP needs to check whether a client MIGHT get exposed
- Given a password "mkm123", MIGP generates PROBABLE PASSWORDS the client might be using now or in the future



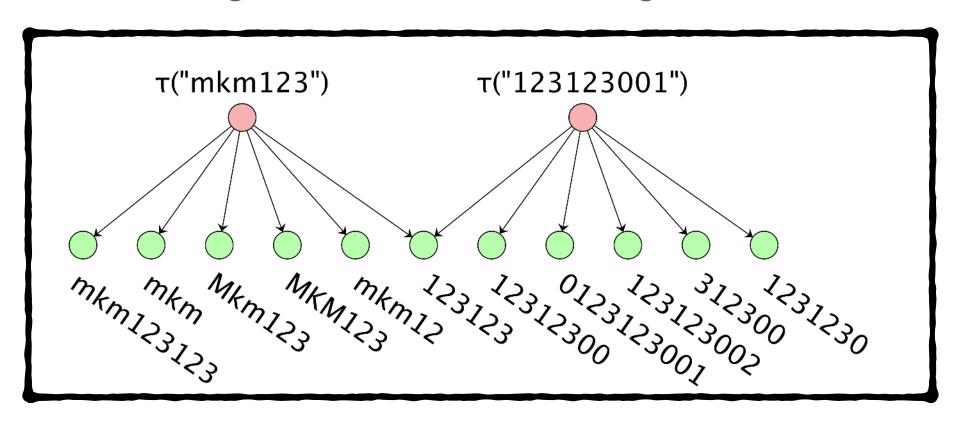
Bucket  $\mathcal{Z}_2$ 

## UNINTENDED LEAKAGE OF MIGP ZOOMING IN THE BUCKETS OF ASYMMETRIC PSI

- MIGP needs to check whether a client MIGHT get exposed
- Given a password "mkm123", MIGP generates PROBABLE PASSWORDS the client might be using now or in the future

If both passwords "mkm123" and "123123001" are breached, then duplicate-insertion creates a hole.

### C3 Server



Bucket  $\mathcal{Z}_2$ 



- MIGP needs to check whether a client MIGHT get exposed
- Given a password "mkm123", MIGP generates PROBABLE PASSWORDS the client might be using now or in the future

If both passwords "mkm123" and "123123001" are breached, then duplicate-insertion creates a hole.

# τ("mkm123") τ("123123001")

C3 Server

Bucket  $\mathcal{Z}_2$ 

**PROTOCOL** 

semantically-similar passwords



τ-collisions

**ATTACK** 

semantically-similar passwords



τ-collisions

## INTRINSIC TENSION

## STRONG PROTECTION AGAINST TWEAKING ATTACKS

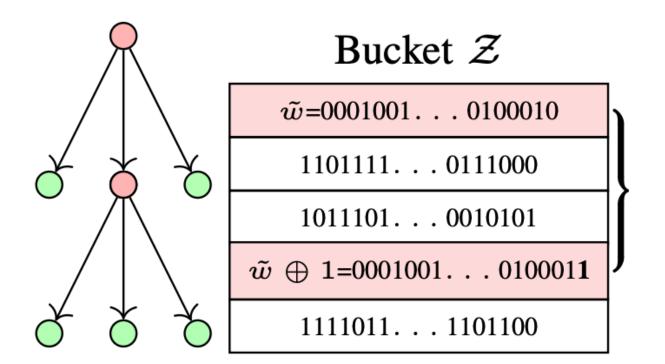


INCREASED LEAKAGE

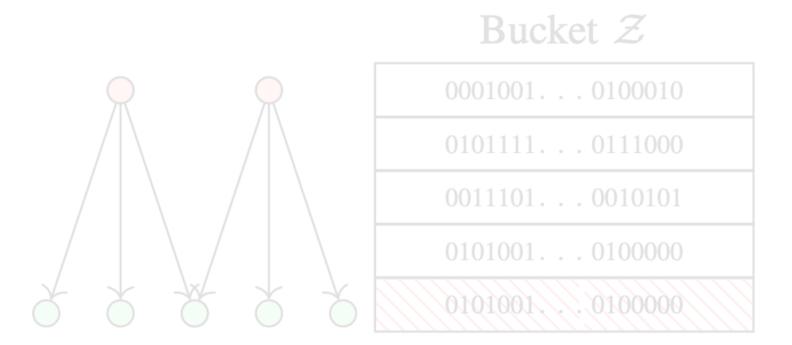
Function T generates passwords contained in future breaches

Function T maximizes the number of collisions

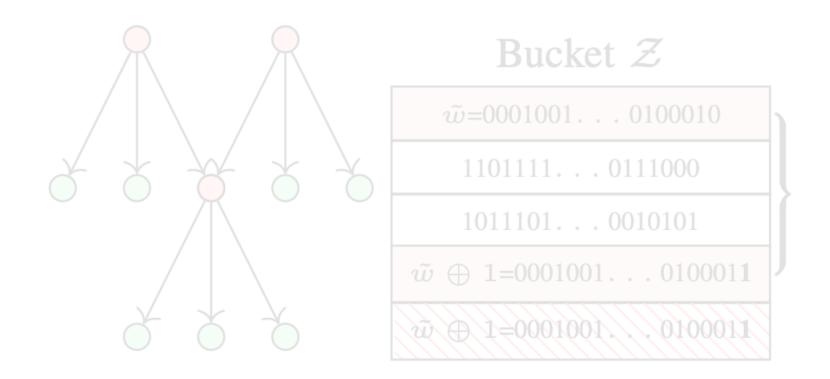
### TYPE - 0



### TYPE - 1A

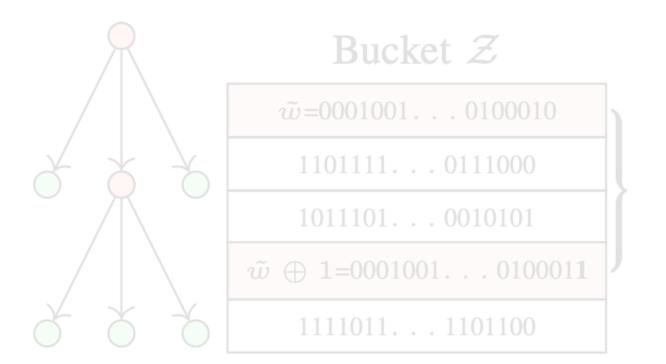


#### TYPE - 1B

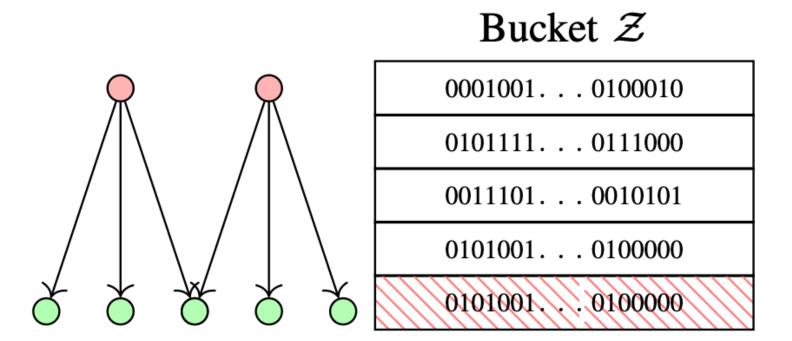




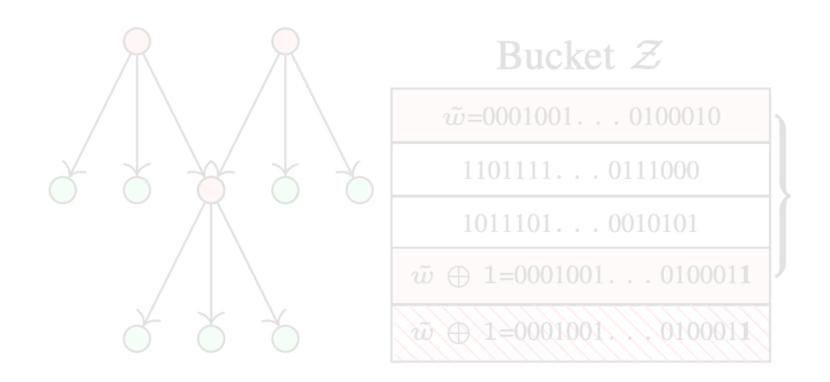
### TYPE - 0



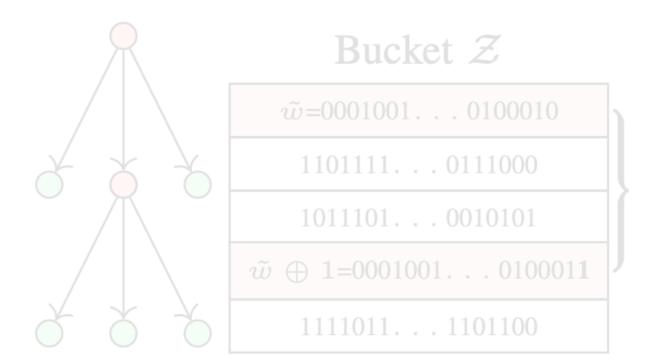
### TYPE - 1A



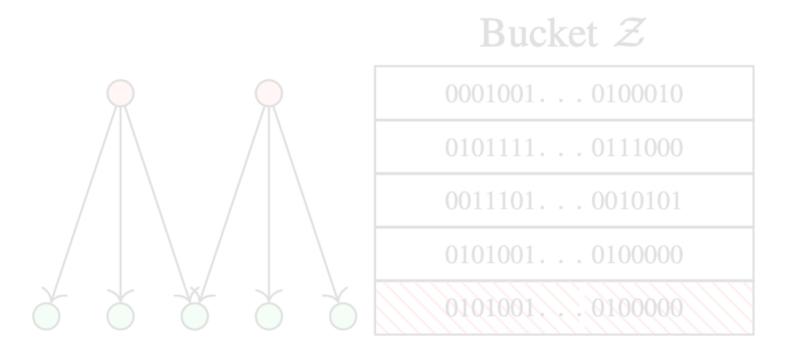
#### TYPE - 1B



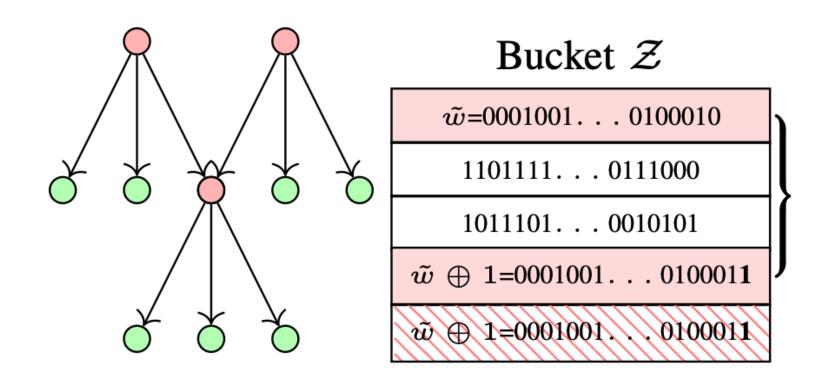
### TYPE - O



### TYPE - 1A



#### TYPE - 1B

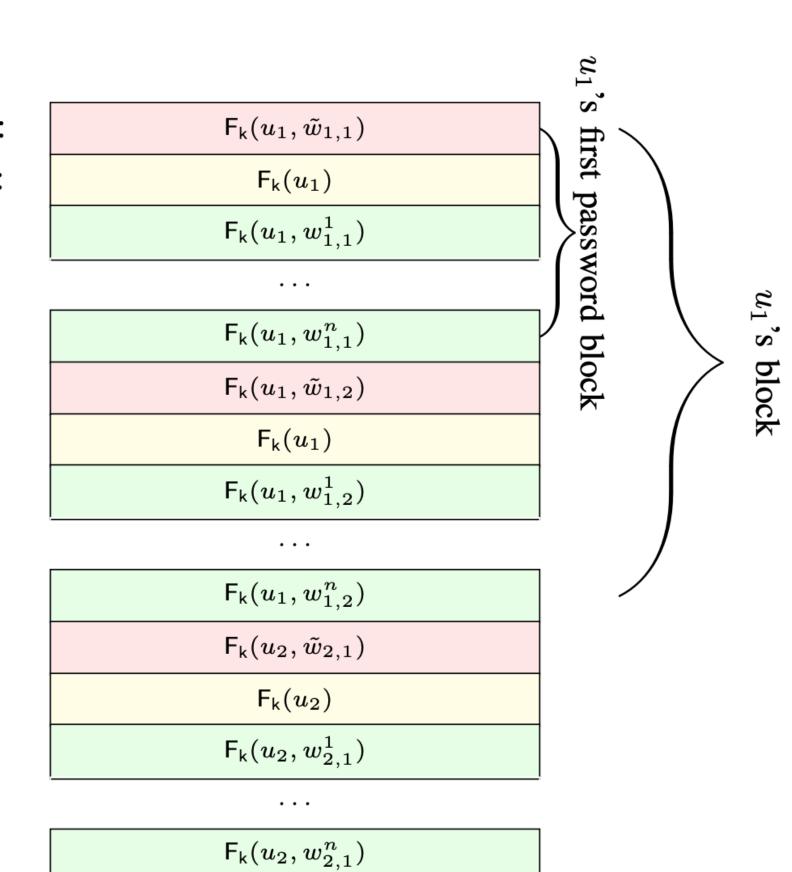


## ADDITIONAL LEAKAGE IN CLOUDFLARE MIGP STRUCTURE OF BUCKET

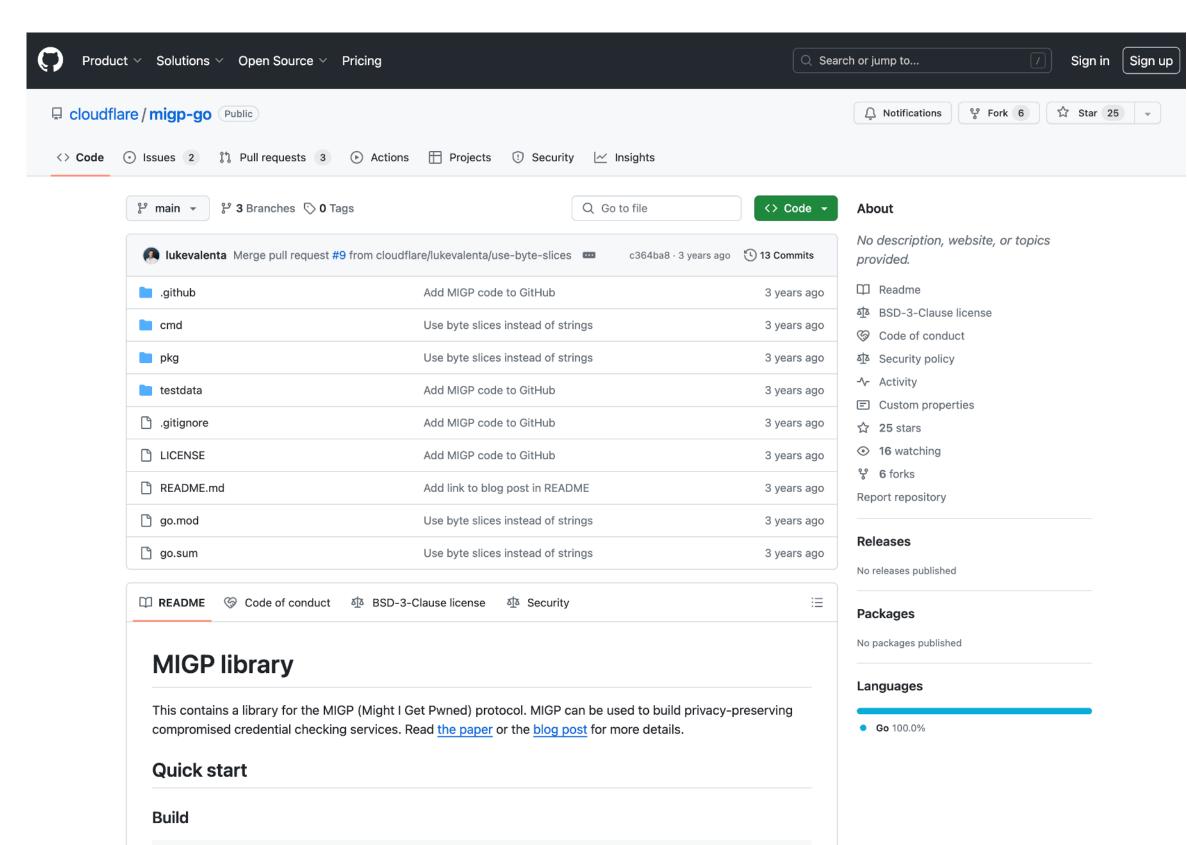
Real password:
Username only:

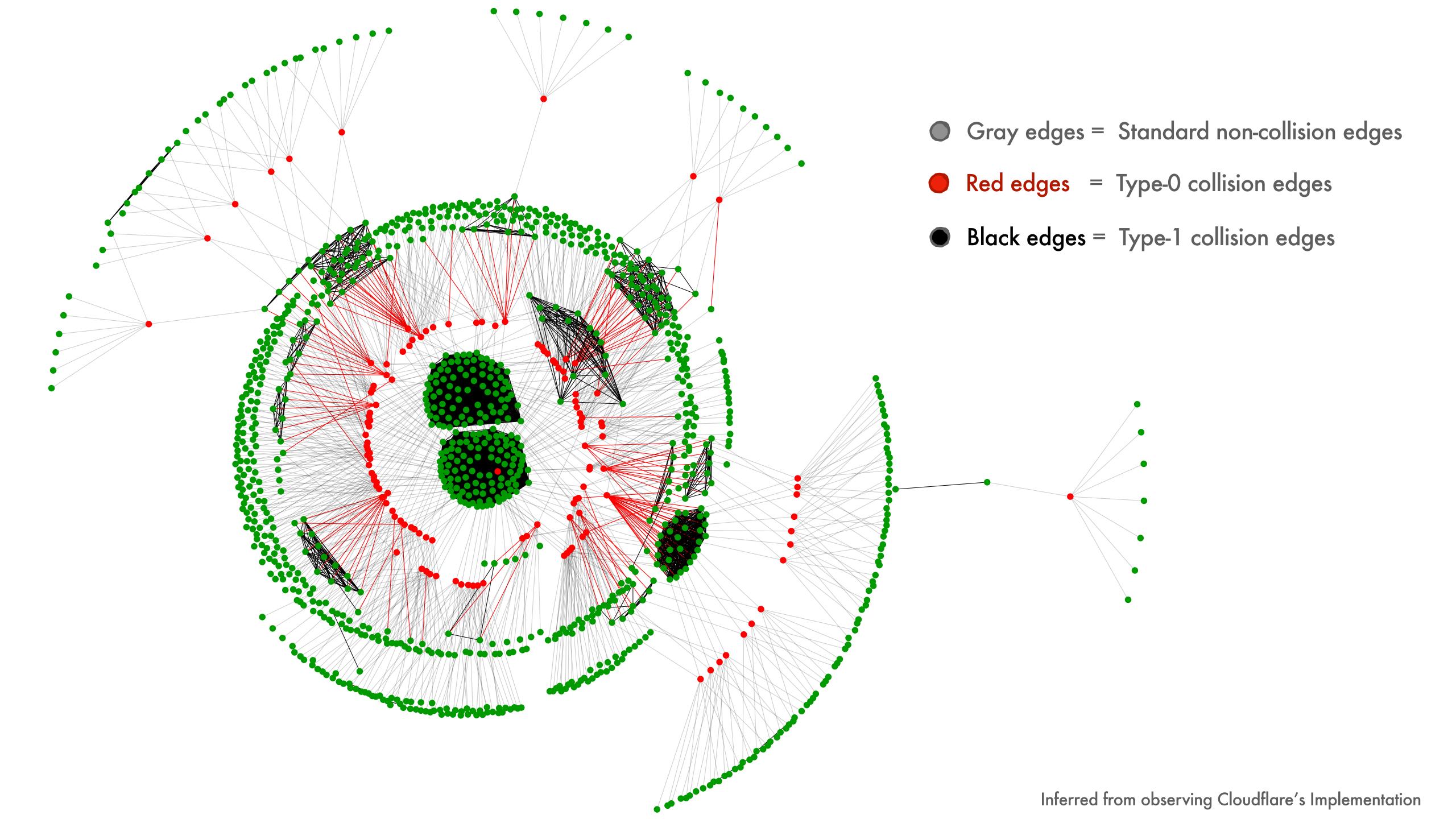
1-st generated password:

n-th generated password:



- Preserved Ordering
- Preserve PRF Duplicates
- PRF Evaluation of the Username







#### Threat Model

- Client A tries to infer the credentials of another target user  $u_{\mathsf{trgt}}$
- A knows one compromised password (publicly available)
- Given this one password, A guesses the rest of the compromised passwords of  $u_{\mathsf{trgt}}$



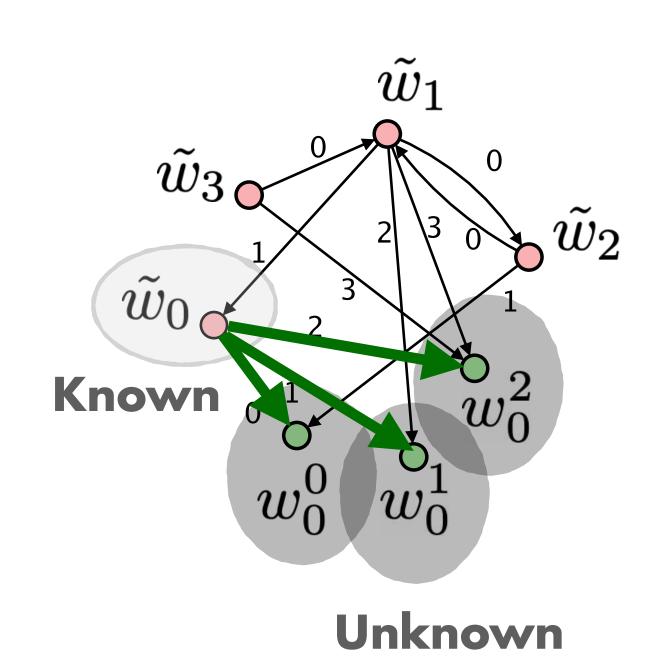
#### Threat Model

- Client A tries to infer the credentials of another target user  $u_{\mathsf{trgt}}$
- A knows one compromised password (publicly available)
- Given this one password, A guesses the rest of the compromised passwords of  $u_{\mathsf{trgt}}$

### Intuition Using the Collision Graph

Edge (u, v) from Known u to Unknown v

Apply T function (Das-r/P2P)



## BREACH EXTRACTION VIA COLLISION GRAPH ONE KNOWN PASSWORD AND T-INVERSION

#### Threat Model

- Client A tries to infer the credentials of another target user  $u_{\mathsf{trgt}}$
- A knows one compromised password (publicly available)
- Given this one password, A guesses the rest of the compromised passwords of  $u_{\mathsf{trgt}}$

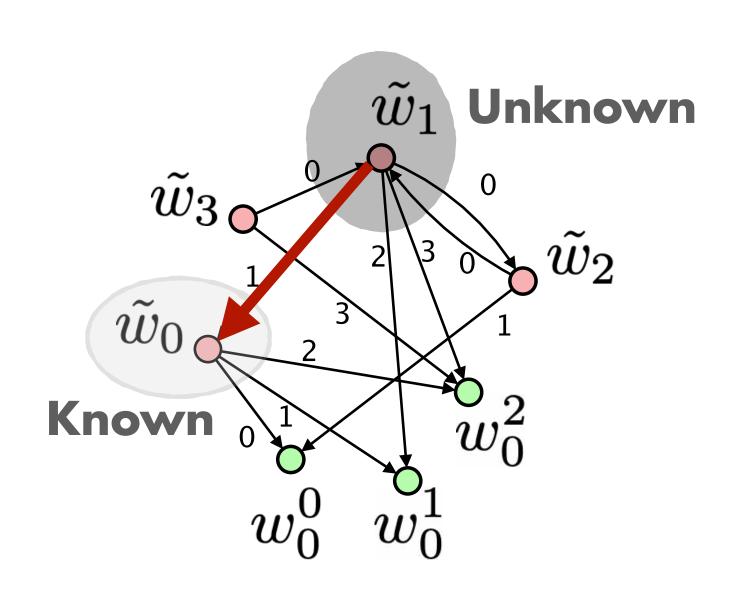
### Intuition Using the Collision Graph

Edge (u, v) from Known u to Unknown v

Apply T function (Das-r/P2P)

Edge ( u , v ) from Unknown u to Known v

Need to invert T function!





#### Threat Model

- Client A tries to infer the credentials of another target user  $u_{\mathsf{trgt}}$
- A knows one compromised password (publicly available)
- Given this one password, A guesses the rest of the compromised passwords of  $u_{\mathsf{trgt}}$

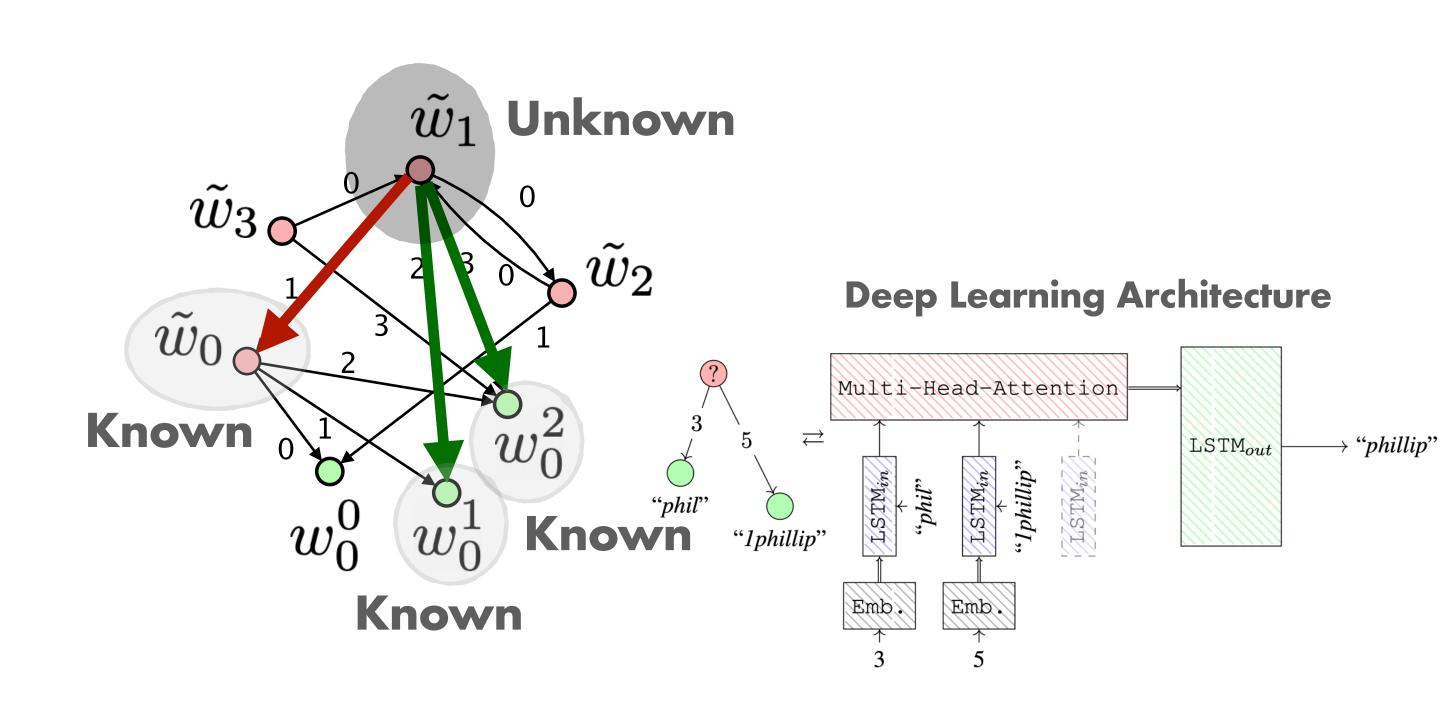
### Intuition Using the Collision Graph

Edge (u, v) from Known u to Unknown v

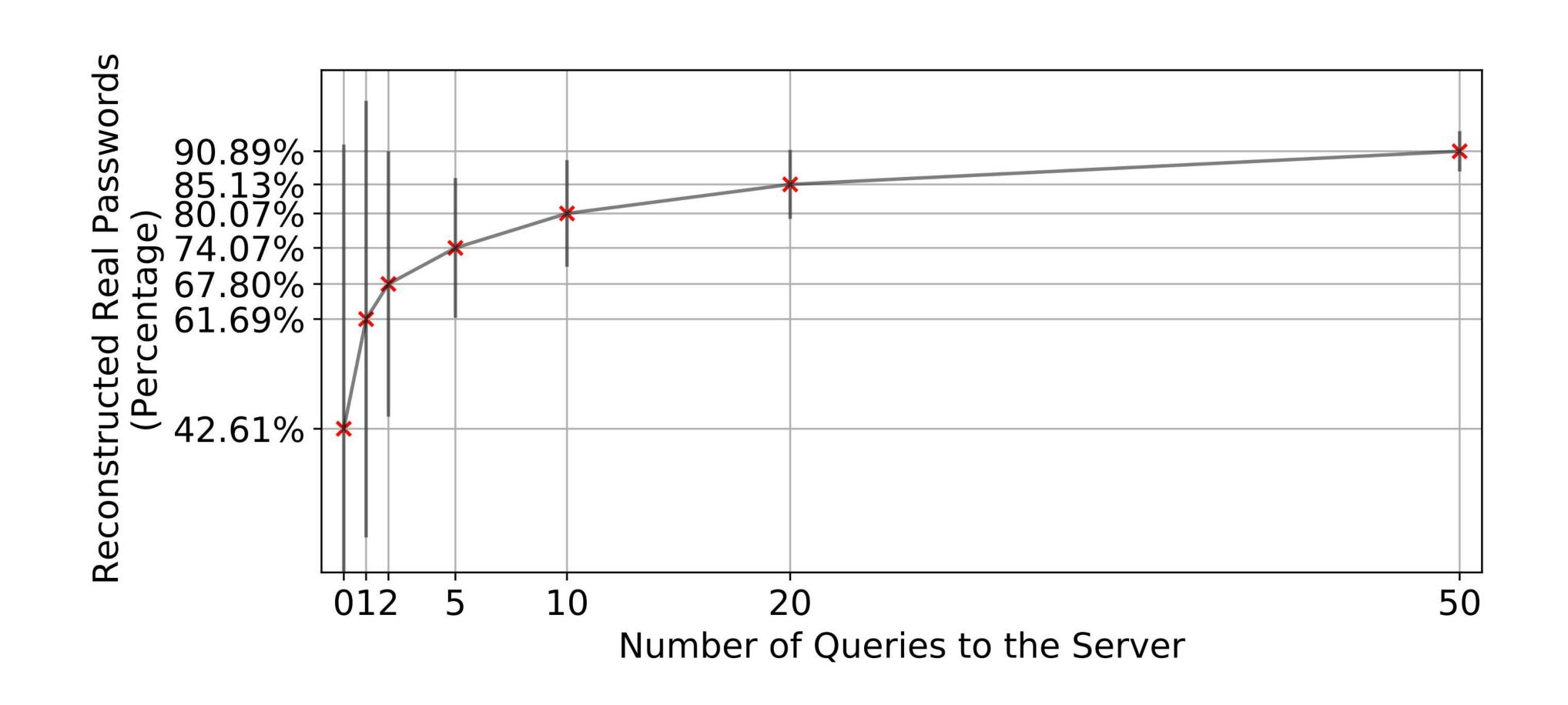
Apply T function (Das-r/P2P)

Edge ( u , v ) from Unknown u to Known v

Need to invert T function!



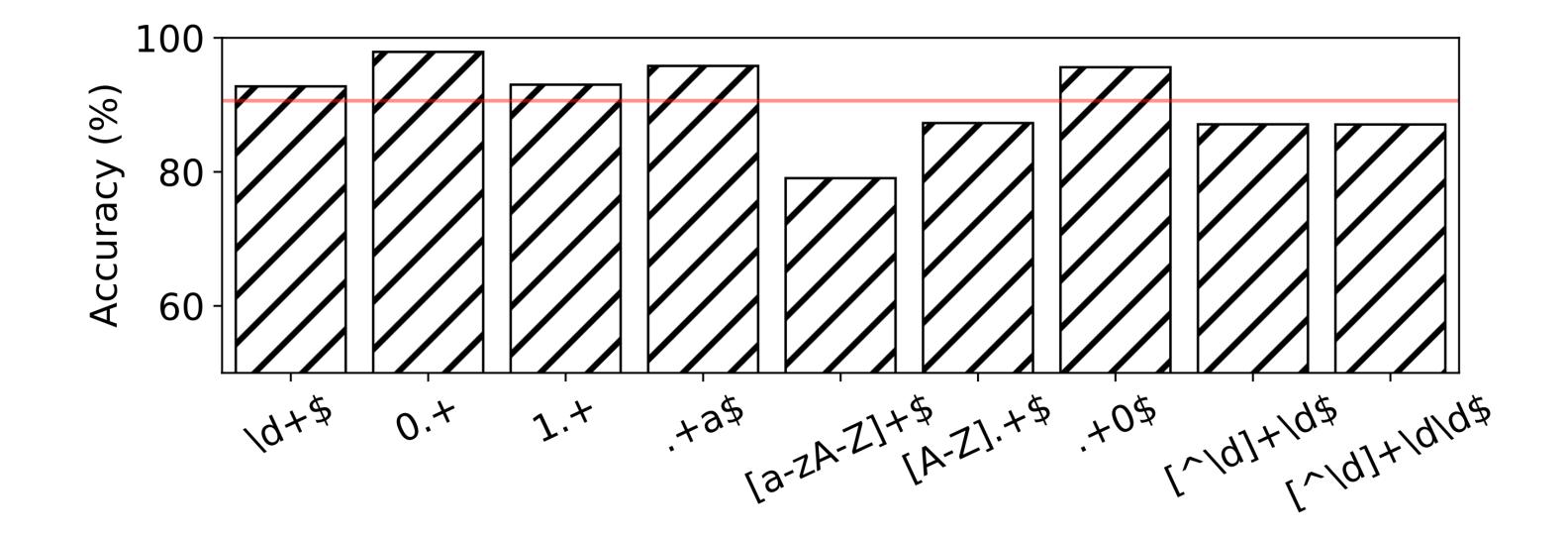
## BREACH EXTRACTION VIA COLLISION GRAPH EVALUATION: ONE KNOWN PASSWORD



## BREACH EXTRACTION VIA STRUCTURE OF GRAPH GRAPH NEURAL NETWORKS AND NO KNOWN PASSWORDS

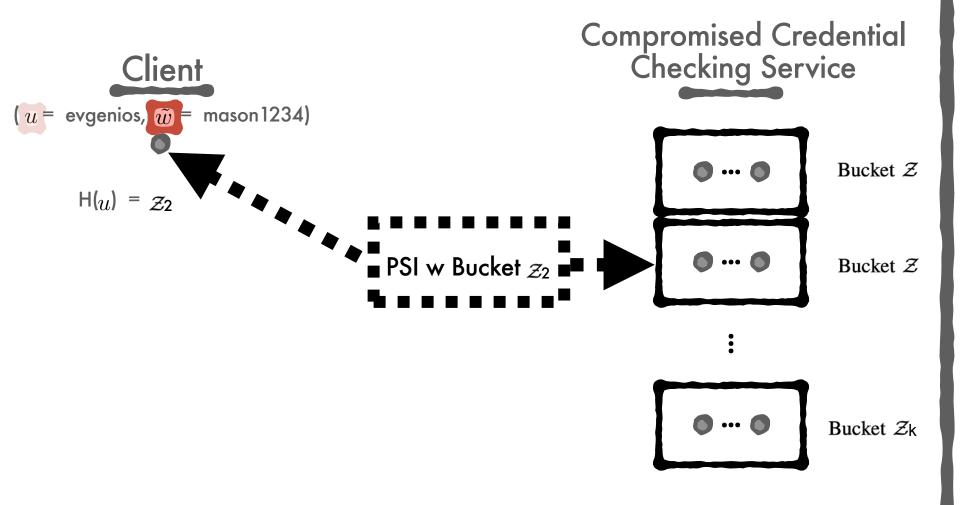
Regex:	(1) "\d+\$"	(2) "0.+"	<b>(2)</b> "1.+"	(4) ".+ <i>a</i> \$"	(5) "[a-zA-Z]+\$"	(6) "[A-Z].+\$"	(7) ".+0\$"	(8) "[^\d]+\d\$"	$  (9) "[^\d]+\d^{3"}$
Description:	It consists solely of digits.	It starts with "0"	It starts with "1"	It ends with "a"	It consists solely of alphabetic characters	It starts with a capital letter	It ends with "0"	It ends with a digit	It ends with two digits

E.g., "Password 10" would have template [0,0,0,0,0,1,1,0,1]



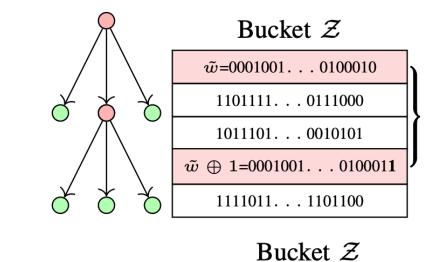
# IN SUMMARY DISCOVERED LEAKAGE IN ASYMMETRIC PSI

## Intended Leakage to Speed Up Computation

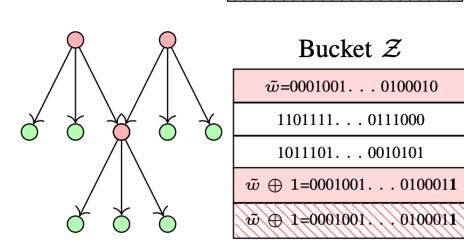


Infer the Username

## \*Unintended Leakage Due to Synthetic Passwords

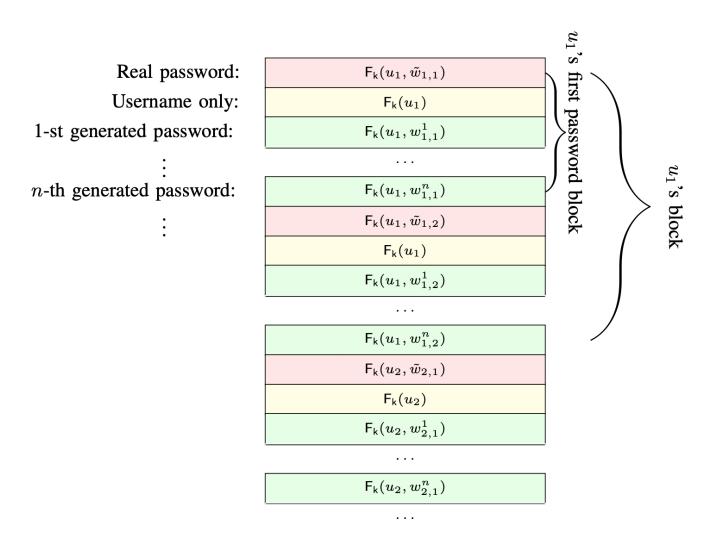


### 0001001...0100010 0101111...0111000 0011101...0010101 0101001...0100000



Infer Collisions from τ-function

## \*Unintended Leakage from the Implementation



**Construct Edges in Collision Graph** 



# PRIORITIZING PRACTICALITY MAY LEAD TO POORLY UNDERSTOOD TRADE-OFF BETWEEN PRIVACY AND EFFICIENCY



# PRIORITIZING PRACTICALITY MAY LEAD TO POORLY UNDERSTOOD TRADE-OFF BETWEEN PRIVACY AND EFFICIENCY

### Other Takeaways:

- 1. Leakage might be the only (practical) option when scalability is a must
- 2. The impact of leakage depends on the context (no one-size-fits-all analysis)
- 3. Some leakage <u>can be fixed</u> given insightful cryptanalysis

#### Breach Extraction Attacks: Exposing and Addressing the Leakage in **Second Generation Compromised Credential Checking Services**

Dario Pasquini\* SPRING lab, EPFL

dario.pasquini@epfl.ch

Danilo Francati\* Aarhus University

dfrancati@cs.au.dk

George Mason University

Giuseppe Ateniese Evgenios M. Kornaropoulos George Mason University

ateniese@gmu.edu

Abstract—Credential tweaking attacks use breached passwords ensuring that the queried password of the user (which may to generate semantically similar passwords and gain access to not be breached) is not disclosed to the server and the victims' services. These attacks sidestep the first generation sensitive breached credentials are not shared with the client.

> However, these services cannot cover an increasingly common type of attack: credential tweaking attacks [2], [9], [10]. In these attacks, cybercriminals employ sophisticated techniques to generate slight variants of known breached passwords, enabling them to make distinct educated password guesses towards unauthorized access to the target's services. Unfortunately, credential tweaking attacks are not covered by C3 services since they only check for an exact match against the breached credentials. To address these shortcomings, Pal et al. [11] proposed Might I Get Pwned (MIGP), a second-generation C3 service. MIGP extends the capabilities of conventional C3 by checking not only for exact password matches but also for semantic similarity with breached credentials. To achieve this, MIGP uses a password-generating function called au to generate semantically similar passwords during the initialization phase.

> The Role of Cryptographic Leakage in MIGP. It is important to note that the privacy-preserving design of MIGP serves (in part) the purpose of safeguarding the collection of breached credential data from being exposed to MIGP query issuers. Paradoxically, despite the MIGP server's data collection being labeled as "breached credentials," it can contain credentials that have been breached but are not publicly available. In April 2023 [12], the FBI took down a stolen identity marketplace that was selling non-publicly available breached credentials. To combat credential stuffing attacks, the FBI shared in confidence millions of non-publicly available compromised credentials with HIBP. Thus, real-world C3 services work with breached credentials that should not be exposed under any circumstances.<sup>1</sup>

> Our work sheds light on an unexplored aspect of the MIGP protocol: the existence of *cryptographic leakage* over the stored credentials. This leakage is a controlled disclosure intentionally designed into the protocol. The term breach extraction attack describes the attack vector in which

> 1. We note that if the breached credentials of the server are all considered public, then there is no point in deploying a privacy-preserving C3; the server can simply return a subset (i.e., a bucket) of the credentials in plaintext. This change enhances efficiency by forgoing cryptographic operations for non-interactive queries. Additionally, it fortifies defenses against tweaking attacks, allowing users to apply arbitrary similarity functions to

In this work, we formalize the cryptographic leakage of the MIGP protocol and perform a security analysis to assess its impact on the credentials held by the server. We focus on how this leakage aids breach extraction attacks, where an honest-but-curious client interacts with the server to extract information about the stored credentials. Furthermore, we discover additional leakage that arises from the implementation of Cloudflare's deployment of MIGP. We evaluate how the discovered leakage affects the guessing capability of an attacker in relation to breach extraction attacks. Finally, we propose MIGP 2.0, a new iteration of the MIGP protocol designed to minimize data leakage and prevent the introduced attacks.

of compromised credential checking (C3) services. The second generation of compromised credential checking services, called

"Might I Get Pwned" (MIGP), is a privacy-preserving protocol that defends against credential tweaking attacks by allowing

clients to query whether a password or a semantically similar

variation is present in the server's compromised credentials

dataset. The desired privacy requirements include not revealing

the user's entered password to the server and ensuring that

no compromised credentials are disclosed to the client.

#### 1. Introduction

In the evolving cyber threat landscape, attackers target user credentials, particularly those stored in plaintext, exploiting system vulnerabilities to compromise and post them online, thereby breaching user privacy and enabling *creden*tial stuffing attacks [1]. In these attacks, adversaries exploit widespread password reuse [2], [3], [4], [5] by using credentials exposed from a data breach to attempt unauthorized access to another unrelated domain. Services like "Have I Been Pwned" [6], Google Password Checkup [7], and Microsoft Password Monitor [8]—known as Compromised Credential Checking (C3) services— aim to alert users about the possibility of a credential stuffing attack. Specifically, they allow users to check if their active credentials appear in breach datasets. To accomplish this, C3 services use cryptographic tools to create a privacy-preserving protocol,

BREACH EXTRACTION ATTACKS: Exposing and Addressing the Leakage in Second-Generation Compromised Credential Checking Services

PASQUINI, FRANCATI, ATENIESE, E.M.K.

Proc. IEEE SECURITY & PRIVACY (Oakland), 2024

#### Our Contributions:

- 1. Formalizing the Leakage in MIGP
- 2. Taxonomy of T-collisions
- 3. Breach Extraction Attacks via Leakage
- 4. MIGP 2.0



2024

https://eprint.iacr.org/2023/1848

<sup>\*</sup>Equal contribution.