How to (not) Share a Password: Privacy preserving protocols for finding heavy hitters with adversarial behavior

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Passwords

• First "modern" use in MIT's CTSS (1961)

"Passwords are dead"?

- User tend to choose passwords with low min-entropy
 - Easy to guess

Bad passwords do not only compromise the users

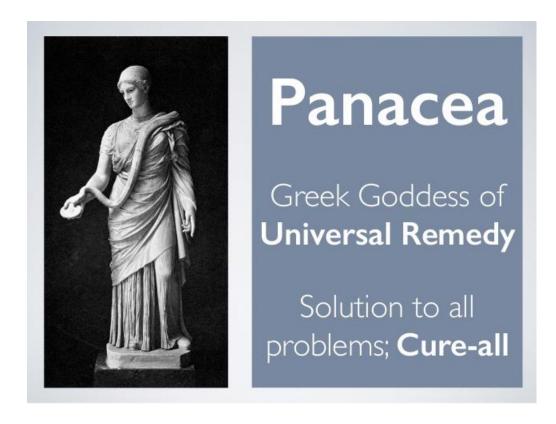
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- Service provider liability?

• It is hard to even decide the ideal guidelines for passwords





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- Blacklisting known popular passwords
 - From previous breaches
 - Known lists of popular passwords

password -> passw0rd -> p@assw0rd->password

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superman -> wonderwoman

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Different populations

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First do (almost) no harm

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 - One bit leakage doesn't hurt the user a lot (next slide)
 - Differential privacy can also help

The Password Game

- PGame(L): Attacker A wants to attack device D
 - Published a list with L guesses for passwords
 - Wins if the password of D is in the list
- Effect of one bit leakage on password:
 - If A wins PGame(L) w.p at least δ using a 1 bit leak implies
 - There is A' wins PGame(2L) w.p δ without a leak
- *∈*-DP
 - If A wins PGame(L) w.p at least δ using ϵ -DP information then
 - There is A' wins PGame(L) w.p $> \delta \cdot e^{-\epsilon}$ without a leak

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- Probability of False Positive (pFP) may be a small value
 - A legitimate password can be rejected with low probability

Previous work

- Finding heavy hitters in many settings -[DNP+10,DNPR10,CSS11,CLSX12, HKR12,DNRR15]
- Semi-honest version [BS15,BNST17]
- Non colluding mix servers [MS17]

- DP password list with trusted server [BDB16]
- Similar motivation, no DP [SHM10]

The Malicious World

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Both users and server might be malicious

A malicious server wants to learn the passwords

- Malicious users want to "hide" popular passwords
 - Adversary controls a coalition of users

MPC meets DP in the Malicious World

- Asymmetric security requirements from the parties in the protocol
 - Relatively easy to protect users' privacy from server
 - Harder to protect against colluding malicious users

 Use efficient 2PC protocol tailored to the system's correctness requirements

Correctness

- Password used by at least a $(1 + \delta)\tau$ fraction of the users: identified as a heavy hitter w.p at least (1-pFN)
 - Even at the presence of malicious user coalition

• Password used by at most a $(1 - \delta)\tau$ fraction of the users: identified as a heavy hitter w.p **at most** pFP

The semi honest solution

• Similar to the heavy hitters solution of [BNSTS17]

- We hash the passwords to ℓ bits values
 - "Naïve" hash function
 - We assume collisions
 - OK if $1/(1-\delta)\tau \ll 2^l$

• Server initializes to zero a **counter histogram** T of size 2^ℓ

The semi honest Protocol

For every user:

- Server iterates over all possible value of $x \in \{0,1\}^{\ell}$
 - If $v = \langle x, r \rangle$: T[x] += 1
 - Else: T[x] = 1

The semi honest solution

- T[x] = N * Prob(x) + Noise• $Noise \sim Bin(N * (1 - Prob(x)), 0.5)$
- $\bullet E[T[x]] = N * Prob(x)$

• Blacklist the hash value if $T[x] > \tau N$

• Define τ as a function of N and δ such that: $Prob[|Noise| > \tau N\delta] < pFN$

The undercount attack

A user wants to "hide" a popular password pass

• The user simply sends: $1 - \langle H(pass), r \rangle$

The required functionally

- Input
 - The server sends to the Trusted Third Party (TTP) an ℓ bit input r
 - The user sends to the TTP an ℓ bit input v
- Output
 - The TTP sends to the server $\langle v, r \rangle$
 - The user gets no output
- Two approaches:
 - QR based
 - Yao's garbled circuit based

A naïve QR based solution

- Based on the intractability of the quadratic residuosity (QR) assumption
- We encrypt the r vector as in the Goldwasser-Micali public encryption scheme
- The server generates an RSA modules N=pq, p and q primes
- We encode the bits of r into r^p, 0 as QR and 1 as nQR

$$e = d^2 \cdot \prod^{\ell} (r_i^p)^{V_i^s}$$
 where $d \stackrel{R}{\leftarrow} \mathbb{Z}_N$

Is it secure?

Not if adversary

knows an nQR

The nQR generation assumption

- Is it hard to generate a nQR number w.h.p?
 - With probability better than $\frac{1}{2} + \epsilon$?

Remarks about Theorem 2. When the factorization of n is secret, no efficient algorithm for selecting a quadratic nonresidue mod n is known. Thus it may be that revealing, say, the smallest quadratic nonresidue in Z_n^1 may endanger the secrecy of the factorization of n or make deciding quadratic residuosity modulo n easy.

- Simple reduction from protocol security
 - Assuming Unique N for each device

Reduction to nQR generation assumption

- The honest algorithm $A(v, r^p)$ return $e=\langle v, r \rangle$
- The adversary algorithm $A'(v,r^p)$ return e=1- $\langle v,r\rangle$ w.p $\frac{1}{2}+\delta$
- ullet Generate r^p by random sample form \mathbb{Z}_N with Jacobi symbol 1
- Generate random v
- Return $A(v, r^p) \cdot A'(v, r^p)$, result nQR w.p $\frac{1}{2} + \delta$

Solution based only on QR assumption

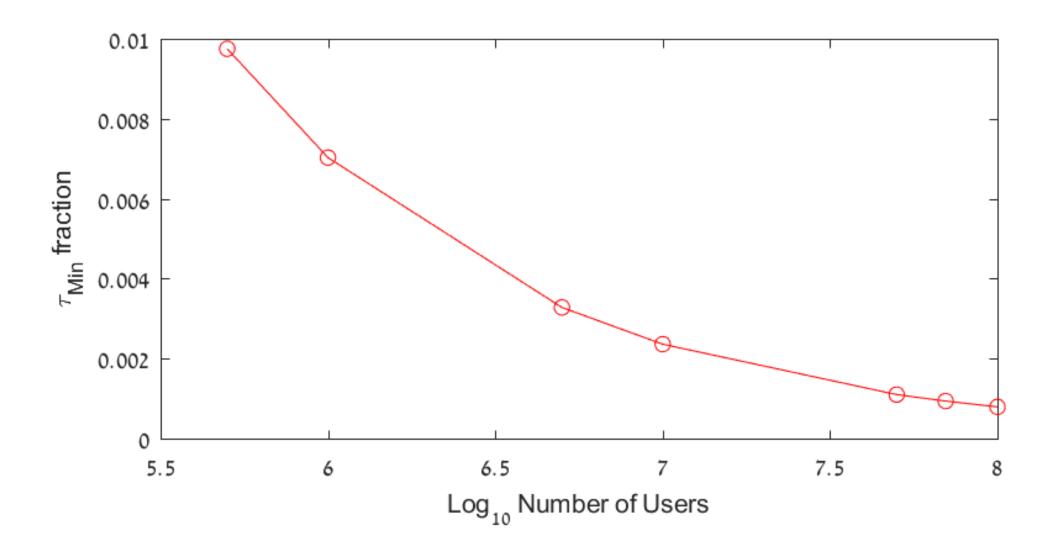
 Adding an Interactive zero knowledge proof that the inner product was computed correctly

Non interactive version based on Fiat-Shamir

Requires proof that N=pq where p and q are primes

Another garbled circuit solution

Malicious bounds on au



Implementation and other usages

- We implemented the full malicious QR protocol on a RPi
 - Non interactive version runs in about 15 seconds, can run in background
 - Server computer can verify in about 0.5 seconds
- Same solution can be used in any heavy hitters problem with possible malicious setting
 - TOR network statistics
 - Device PIN/Pattern
 - Large service providers dynamic passwords statistics

Open questions

- Do we need Crypto?
 - For non-malicious users no (computational based) crypto needed!

 Can the attacker really use the leaked information from the blacklist publications?