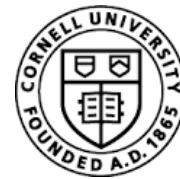


Making Password Checking Systems Better

Tom Ristenpart

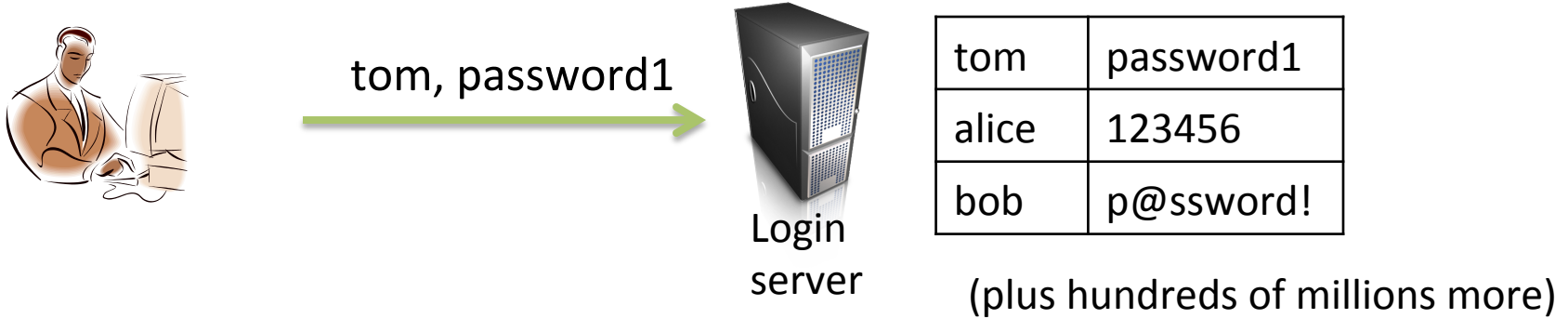


**CORNELL
TECH**

Covering joint work with:

Anish Athayle, Devdatta Akawhe, Joseph Bonneau, Rahul Chatterjee,
Adam Everspaugh, Ari Juels, Sam Scott

Password checking systems



Allow login if:

Attack detection mechanisms don't flag request

Password matches

Sometimes: second factor succeeds

Problems w/ password checking systems



tom, password1



Login
server

tom	password1
alice	123456
bob	p@ssword!

People often enter
wrong password:

- Typos
- Memory errors

Passwords databases must be protected:

- Server compromise
- Exfiltration attacks (e.g., SQL injection)

Widespread practice:

- Apply hashing w/ salts
- Hope slows down attacks enough

Today's talk

Pythia: moving beyond “hash & hope”

Harden hashes with off-system secret key using
partially oblivious pseudorandom function protocol

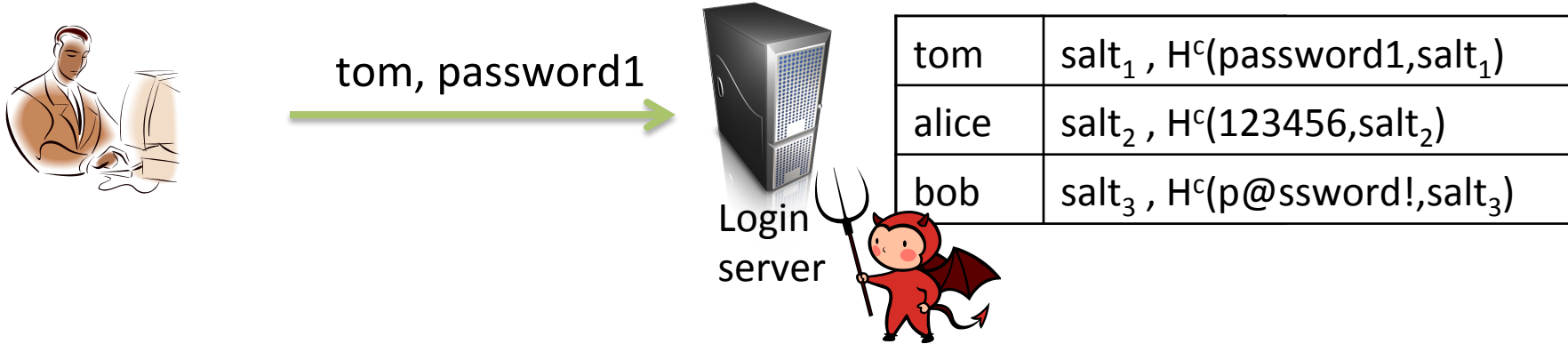
[Everspaugh, Chatterjee, Scott, Juels, R. – USENIX Security 2015]

Typo-tolerant password checking

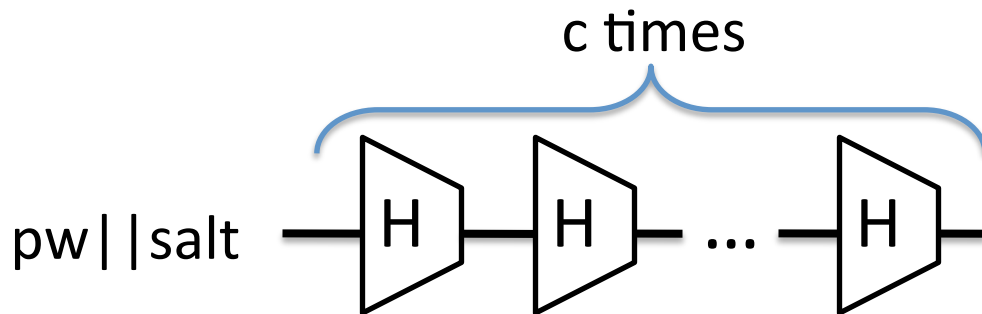
In-depth study of typos in user-chosen passwords
Show how to allow typos without harming security

[Chatterjee, Athayle, Akawhe, Juels, R. – Oakland 2016]

Password checking systems



Websites should **never** store passwords directly, they should be (at least) hashed with a salt (also stored)



Cryptographic hash function H
($H = \text{SHA-256}, \text{SHA-512}, \text{etc.}$)





Common choice is $c = 10,000$

Better: scrypt, argon2

UNIX password hashing scheme, PKCS #5

Formal analyses: [Wagner, Goldberg 2000] [Bellare, R., Tessaro 2012]

Password database compromises

	year	# stolen	% recovered	format
⋮ 	2012	32.6 million	100%	plaintext (!)
	2012	117 million	90%	Unsalted SHA-1
	2013	36 million	??	ECB encryption
	2015	36 million	33%	Salted bcrypt + MD5

⋮

(1) Password protections often implemented incorrectly in practice

(2) Even in best case, hashing slows down but does not prevent offline brute-force cracking

Facebook password onion



```
$cur = 'password'
```

```
$cur = md5($cur)
```

```
$salt = randbytes(20)
```

```
$cur = hmac_sha1($cur, $salt)
```

```
$cur = remote_hmac_sha256($cur, $secret)
```

```
$cur = scrypt($cur, $salt)
```

```
$cur = hmac_sha256($cur, $salt)
```


Strengthening password hash storage



tom, password1



h



$f = \text{HMAC}(K, h)$

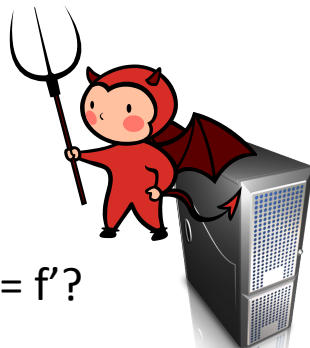


Back-end
crypto
service

$h = H^c(\text{password1} || \text{salt})$

Store salt, f

HMAC is pseudorandom function (PRF).

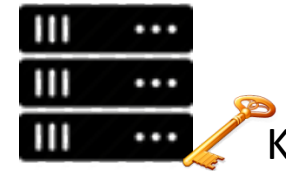


$f = f'?$

$f' = H^c(123456 || \text{salt})$



$f' = \text{HMAC}(K, h')$



Back-end
crypto
service

$H^c(1234567 || \text{salt})$



$H^c(12345 || \text{salt})$

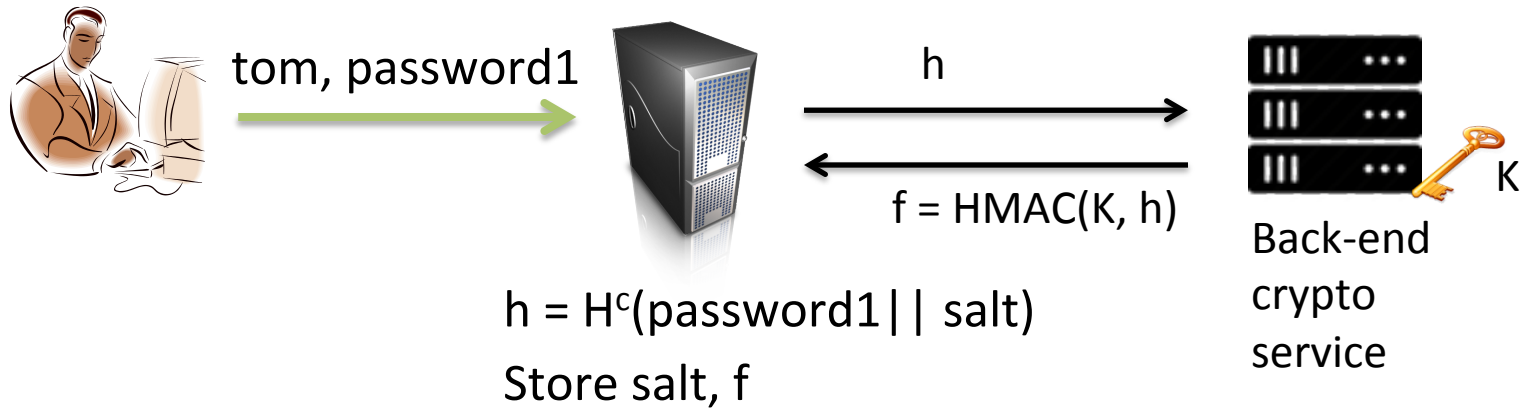


⋮

Must still perform online
brute-force attack

Exfiltration doesn't help

Strengthening password hash storage



Critical limitation: can't rotate K to a new secret K'

- Idea 1: Version database and update as users log in
 - *But doesn't update old hashes*
- Idea 2: Invalidate old hashes
 - *But requires password reset*
- Idea 3: Use secret-key encryption instead of PRF
 - *But requires sending keys to web server (or high bandwidth)*

The Pythia PRF Service

Blinding means service learns *nothing* about passwords



tom, password1



user id, blinded h

Blinded PRF output f



Back-end
crypto
service

$h = H^c(\text{password1} || \text{salt})$

Blind h, pick user ID

Unblind PRF output f

Store user ID, salt, f

User ID reveals fine-grained query patterns to service.

Compromise detection & rate limiting

Cryptographically erases f:
Useless to attacker in the future

Combine token and f
to generate $f' = F(K', h)$

Server learns nothing
about K or K'

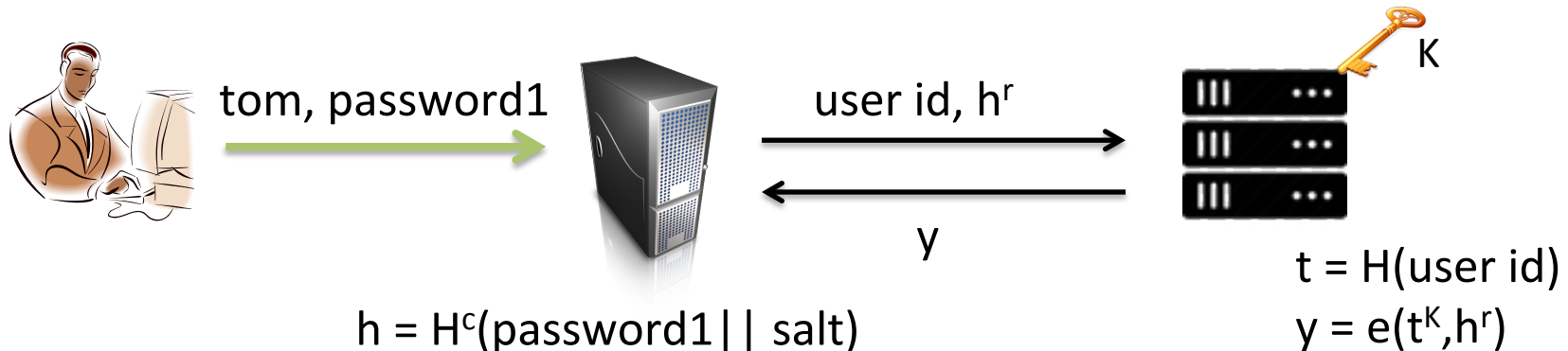
Token(K->K')



Back-end
crypto
service

New crypto: partially-oblivious PRF

Groups G_1, G_2, G_T w/ bilinear pairing $e : G_1 \times G_2 \rightarrow G_T$ $e(a^x, b^y) = c^{xy}$



$$h = H^c(\text{password1} || \text{salt})$$

Choose random r

$$f = y^{1/r}$$

Store user ID, salt, f

$$f = e(t^K, h^r)^{1/r} = e(t, h)^{Kr \cdot 1/r} = e(t, h)^K$$

- Pairing cryptographically binds user id with password hash
- Can add verifiability (proof that PRF properly applied)
- Key rotation straightforward: $\text{Token}(K \rightarrow K') = K' / K$
- Interesting formal security analysis (see paper)

The Pythia PRF Service

- Queries are fast despite pairings
 - PRF query: 11.8 ms (LAN) 96 ms (WAN)
- Parallelizable password onions
 - H^c and PRF query made in parallel (hides latency)
- Multi-tenant (theoretically: scales to 100 million login servers)
- Easy to deploy
 - Open-source reference implementation at
<http://pages.cs.wisc.edu/~ace/pythia.html>



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Back to our big picture



tom, password1



Login server

tom	$G_k(\text{password1})$
alice	$G_k(123456)$
bob	$G_k(p@ssword!)$

People often enter wrong password:

- Typos
- Memory errors

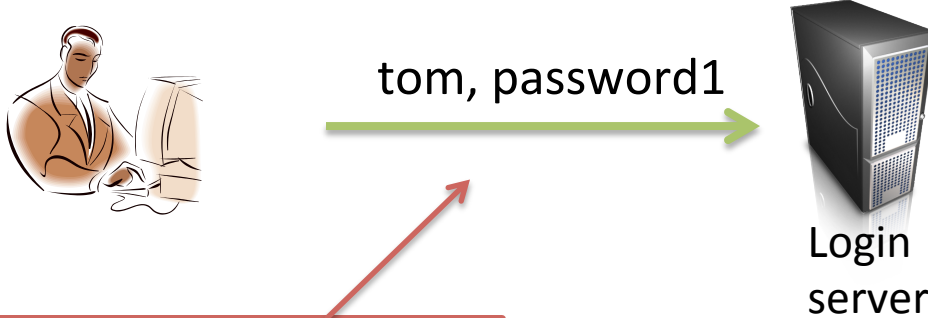
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People often enter wrong password:

- Typos
- Memory errors

Users have hard time remembering (complex) passwords

[Ur et al. 2012] [Shay et al. 2012] [Mazurek et al. 2013] [Shay et al. 2014]
[Bonneau, Schechter 2014]

Passwords can be difficult to enter without error (typo)

[Keith et al. 2007, 2009] [Shay et al. 2012]

Suggestions for error-correcting passphrases

[Bard 2007] [Jakobsson, Akavipat 2012] [Shay et al. 2012]

Facebook passwords are not case sensitive (update)

If you have characters in your Facebook password, there's a second password that you can log in to the social network with.



By [Emil Protalinski](#) for [Friending Facebook](#) | September 13, 2011 -- 12:26 GMT (05:26 PDT) | Topic: [Security](#)

password1

Password1

PASSWORD1

Typo-tolerant password checking:
Allow registered password or some typos of it

We focus on *relaxed* checkers



tom, Password1



tom	$G_K(\text{password1})$
alice	$G_K(123456)$
bob	$G_K(p@ssword!)$

Apply typo corrector functions to incorrect submitted password:

Slow to compute G_K

$G_K(\text{Password1})$



Apply caps lock corrector

$G_K(p\text{ASSWORD1})$



Apply first case flip corrector

$G_K(\text{password1})$



...

...

Can we find *small* but *useful* set of typo correctors?

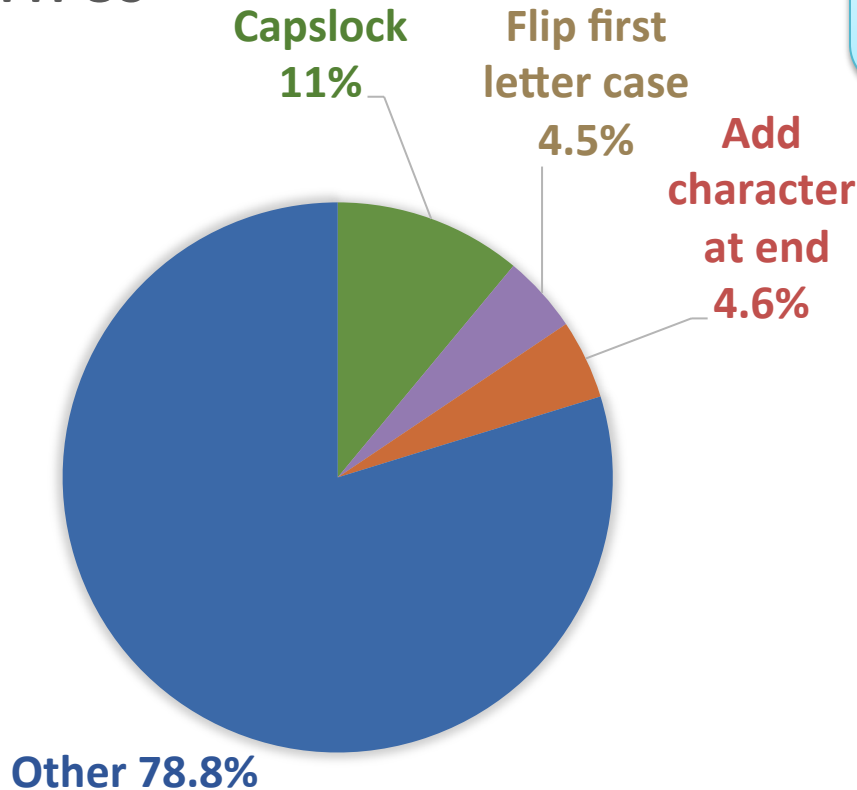
Works with existing password hardening schemes
No change in what is stored

Mechanical Turk transcription study

100,000+ passwords typed by 4,300 workers



% OF TYPOS



Top 3 account for 20% of typos



Impact of Top 3 typos in real world



Instrumented production login of Dropbox to quantify typos

NOTE: We did not admit login based on relaxed checker

24 hour period:

- **3%** of all users failed to login because one of top 3 typos
- **20%** of users who made a typo would have saved at least 1 minute in logging into Dropbox if top 3 typos are corrected.

Allowing typos in password will add several person-months of login time every day.

Typo-tolerance would significantly improve usability of password-based login

Can it be secure?

Threat #1: Server compromise



tom	$G_k(\text{password1})$
alice	$G_k(123456)$
bob	$G_k(p@ssword!)$

No change to
password DB

No change in security after compromise

Threat #2: Remote guessing attacks



tom, password



tom	$G_K(\text{password1})$
alice	$G_K(123456)$
bob	$G_K(p@ssword!)$

Apply caps lock corrector

Apply first case flip corrector

Apply extra char corrector

$G_K(\text{password})$



$G_K(\text{PASSWORD})$



$G_K(\text{Password})$



$G_K(\text{passwor})$



Threat #2: Remote guessing attacks



tom, password



tom, iloveyou



⋮



tom	$G_K(\text{password1})$
alice	$G_K(123456)$
bob	$G_K(p@ssword!)$

Server locks account after q failed attempts (e.g., $q=10$)

$G_K(\text{iloveyou})$



$G_K(\text{ILOVEYOU})$



$G_K(\text{lloveyou})$



$G_K(\text{iloveyo})$



Apply caps lock corrector

Apply first case flip corrector

Apply extra char corrector

Up to 4 passwords checked at cost of 1 query

=>

~~Attack success increases by 4x~~

Attack simulation using password leaks

Adversary knows:

Distribution of passwords, and the set of correctors (\mathcal{C})

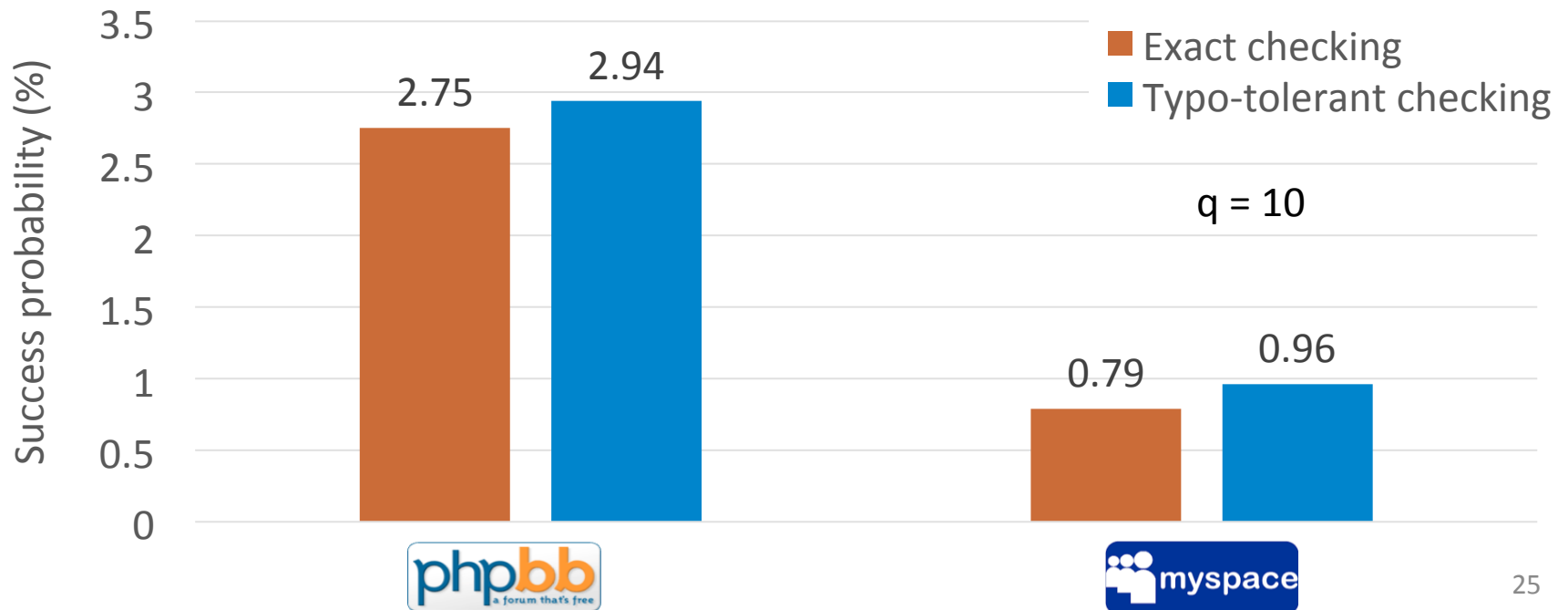
Exact checking

Query most probable q passwords

Typo-tolerant checking

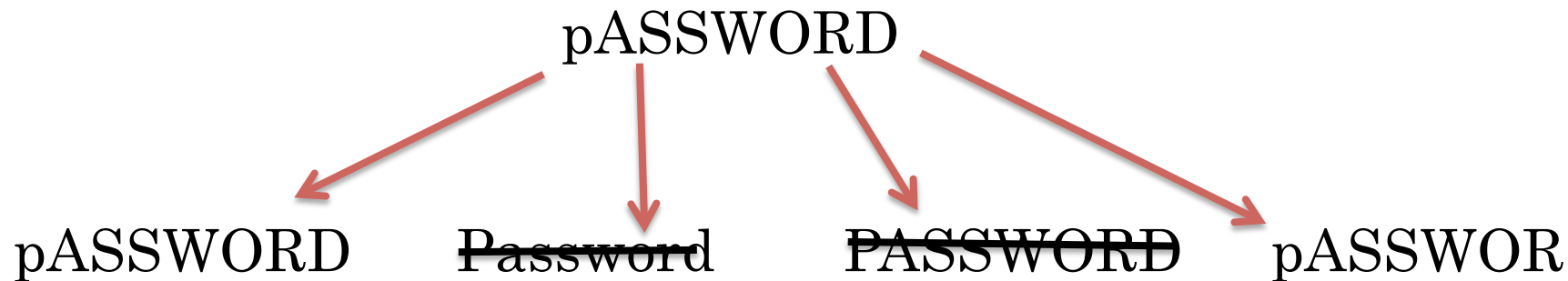
Query q passwords that maximizes success
NP-complete problem.

Compute using greedy approximation



Security-sensitive typo tolerance

Don't check a correction if the resulting password is too popular.



Free Corrections Theorem:

For any password distribution, set of correctors, and query budget q , there exists a typo-tolerant checking scheme with no loss in security

Security-sensitive typo tolerance

Assume distribution over passwords and order them in decreasing probability:

$pw_1 \quad pw_2 \quad \dots \quad pw_q \quad pw_{q+1} \quad pw_{q+2} \quad pw_{q+3} \quad \dots$

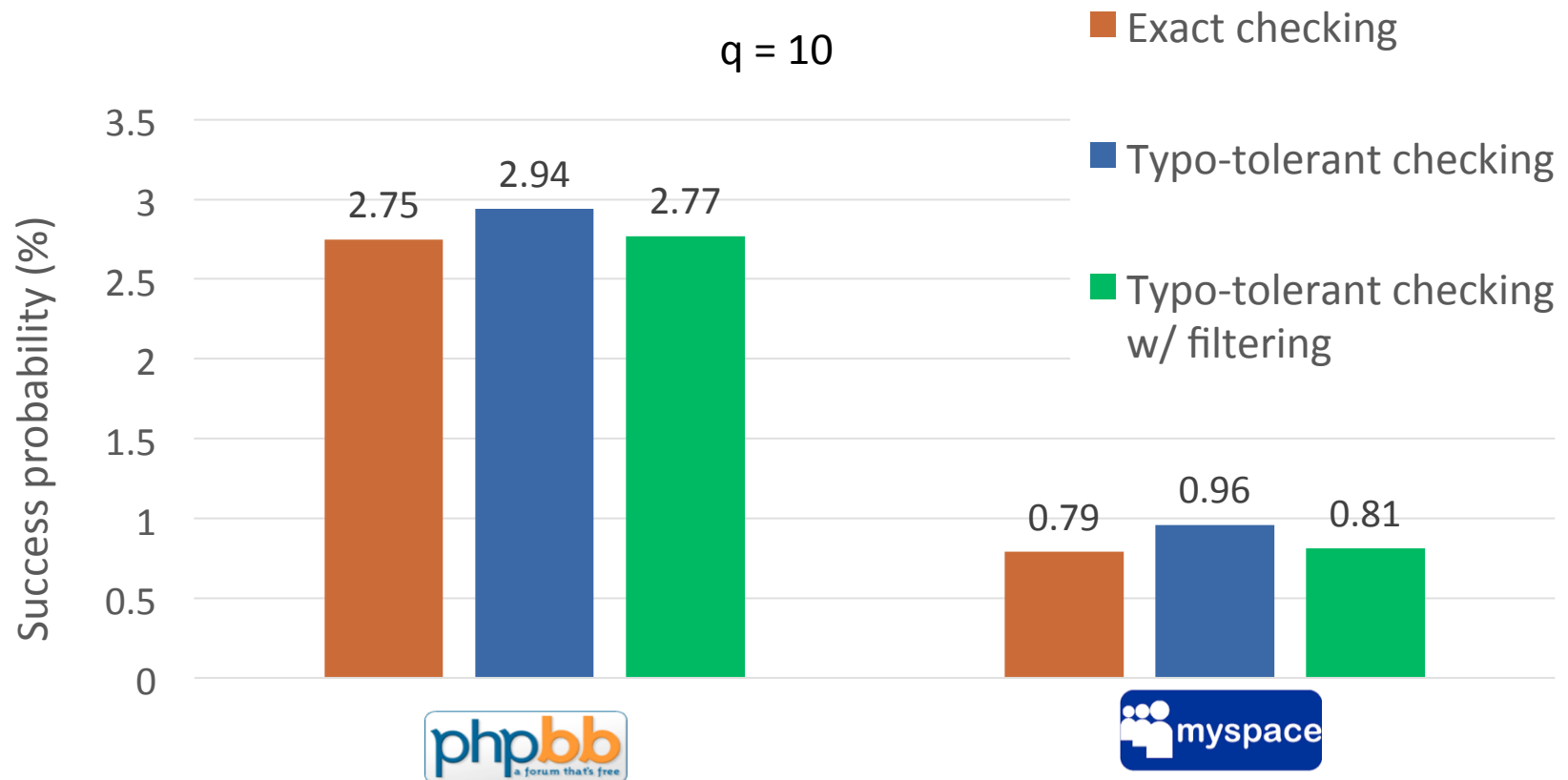
Construction:

For any password, check as many typos as one can while ensuring correctness and that $\sum_{pw \text{ corrected}} \Pr[pw] \leq \Pr[pw_q]$

Ensures optimal adversarial strategy is to query pw_1, \dots, pw_q against typo-tolerant checker. Same as for strict checker

Checkers w/ heuristic filtering

Use password leak **rockyou** to estimate distribution



Typo-tolerance can enhance user experience
without degrading security in practice

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