

18733: Applied Cryptography

Human Computable Protocols: Password-based Authentication

Anupam Datta

With Jeremiah Blocki and Manuel Blum

Carnegie Mellon University

Memory Experiment 1



Person	Bill Clinton
Action	Tickling
Object	Peach

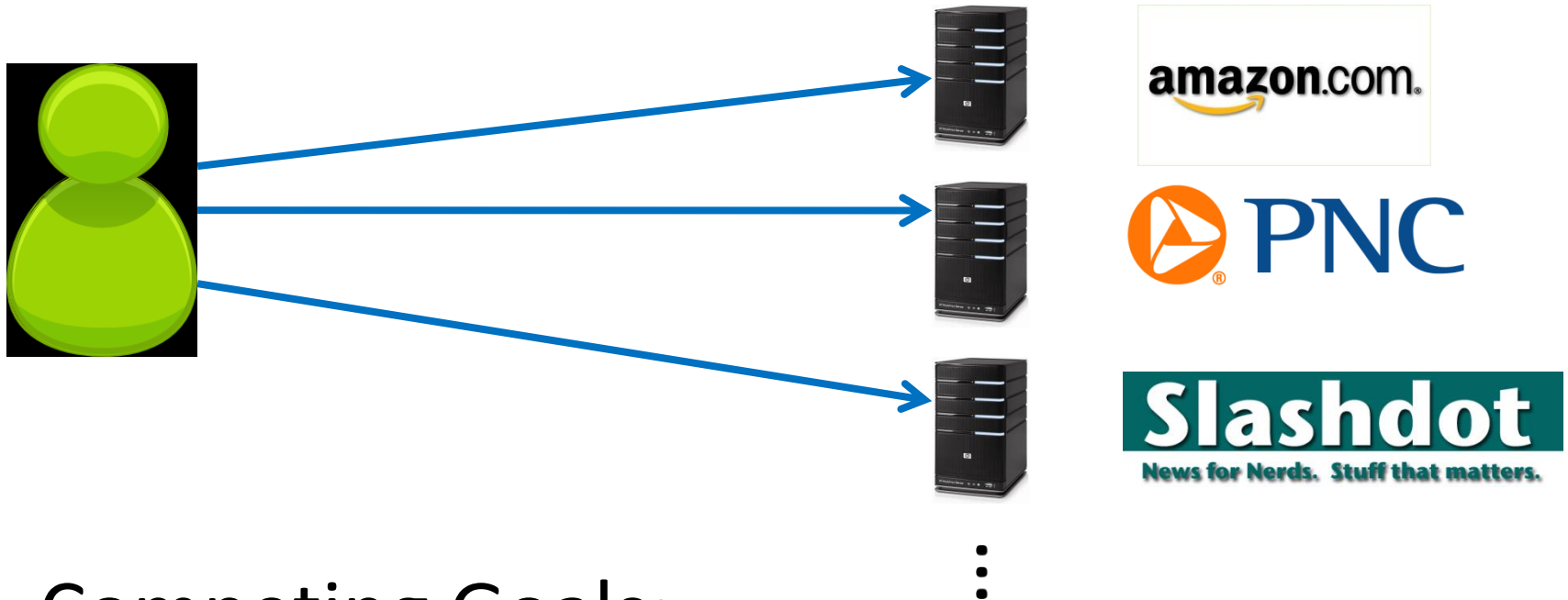


Memory Experiment 2

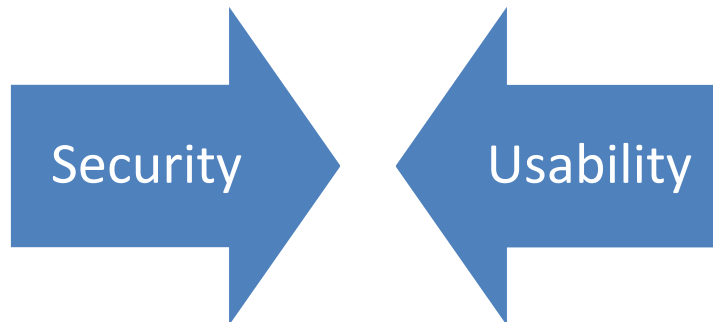


Person	Michelle Obama
Action	Bouncing
Object	Smore

Password Management



Competing Goals:



Security Problem

- Password breaches at major companies have affected millions of users.

livingsocial[®]

Linkedin[®]

YAHOO!

SONY

rockyou

Adobe

ebay[™]

Zappos[®]
the web's most popular shoe store!

GAWKER

Traditional Security Advice

Use numbers and letters

Don't Reuse Passwords

Special symbols

Don't use words/names Not too short

Don't Write it Down

Use mix of lower/upper case letters

Change your passwords every 90 days

Usability Problem



Fundamental Question

- How can we evaluate password management strategies?
 - Quantify Usability
 - Quantify Security

Outline

- **Introduction**
 - Motivation
 - **Our Approach**
 - Related Work
- Usability and Security Models
- Shared Cues
- Human Computable Passwords
- Conclusion and Future Vision

Traditional Approach

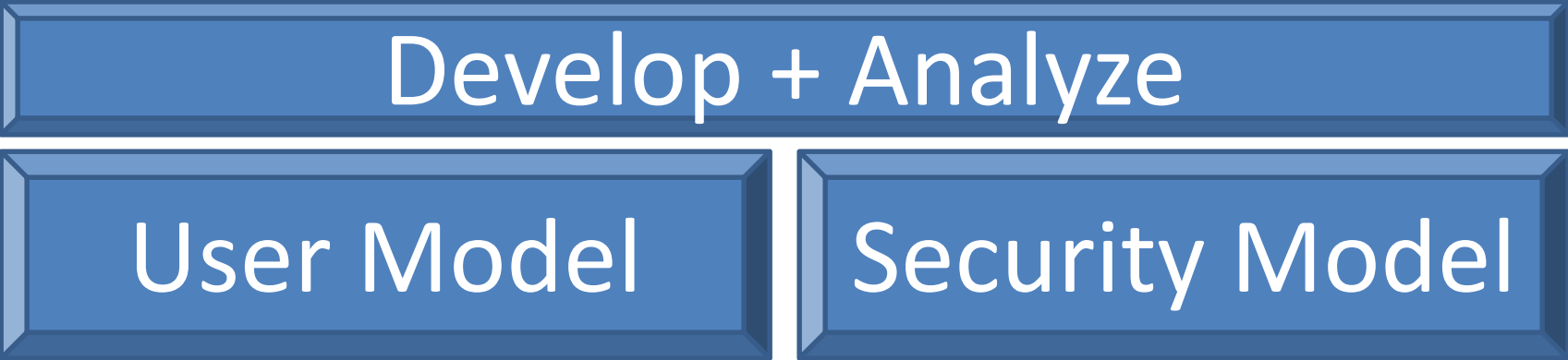
Propose New Password
Management Scheme

User Study: Evaluate New
Password Management Scheme



Our Thesis

User models and security models can guide the development of human authentication schemes with analyzable usability and security properties.



```
graph TD; A[Develop + Analyze] --- B[User Model]; A --- C[Security Model];
```

Develop + Analyze

User Model

Security Model

Our Approach: User Models



User Model

Capabilities + Behavior



Example Capability: Users can remember a random secret with enough rehearsal.

Example Behavior: How often a user visits each website on average.

Our Approach: User Models



User Model

Capabilities + Behavior

Develop + Analyze

User Model

Empirical Validation



Fast: Evaluation
does not require
expensive user
studies

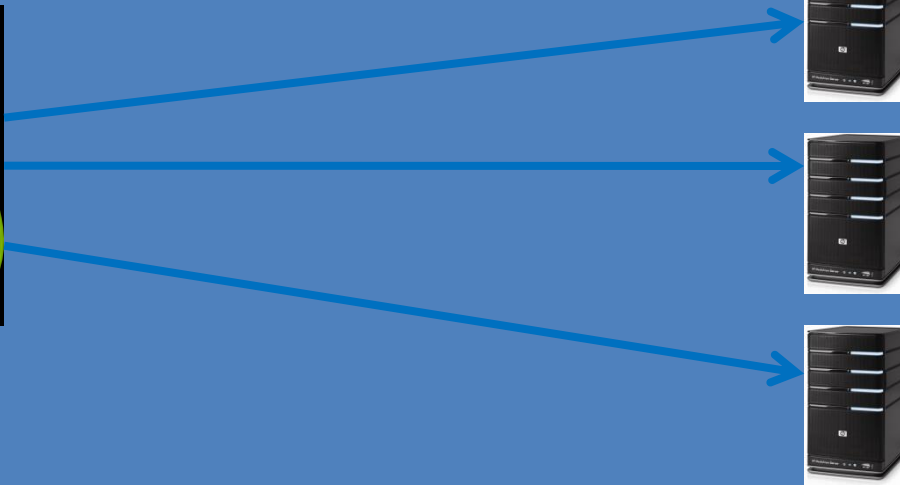
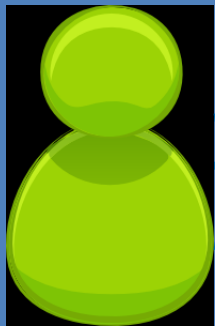
password
management
schemes

Outline

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Related Work

Challenge: Multiple Passwords



⋮

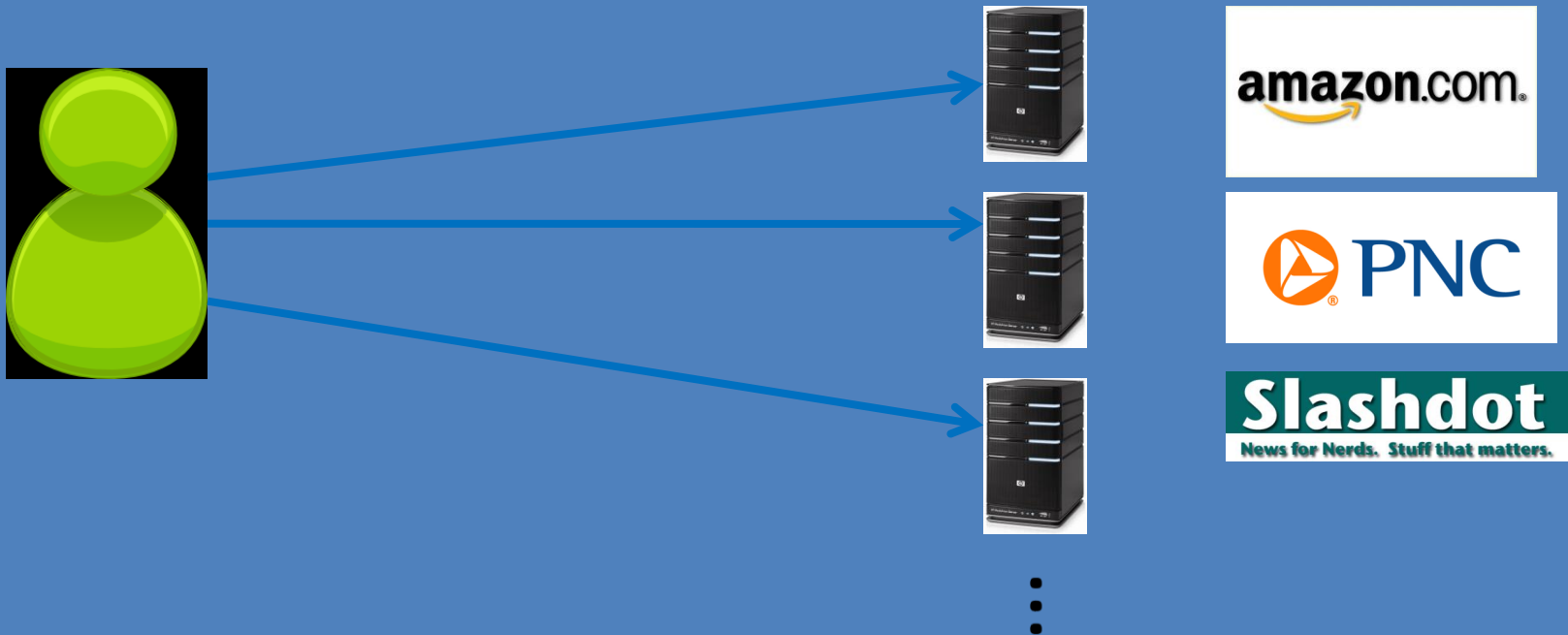
amazon.com.



Slashdot
News for Nerds. Stuff that matters.

Related Work

Goal: Quantify Security for Multiple Passwords



Related Work

Goal: Minimize Trust Assumptions about User's Computational Devices



Related Work

Quest to Replace Passwords [BHOS2012]



Outline

- Introduction
- **Usability and Security Models**
 - **Example Password Management Schemes**
 - Usability Model
 - Security Model
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Scheme 1: Reuse Strong Password

- Pick four random words w_1, w_2, w_3, w_4

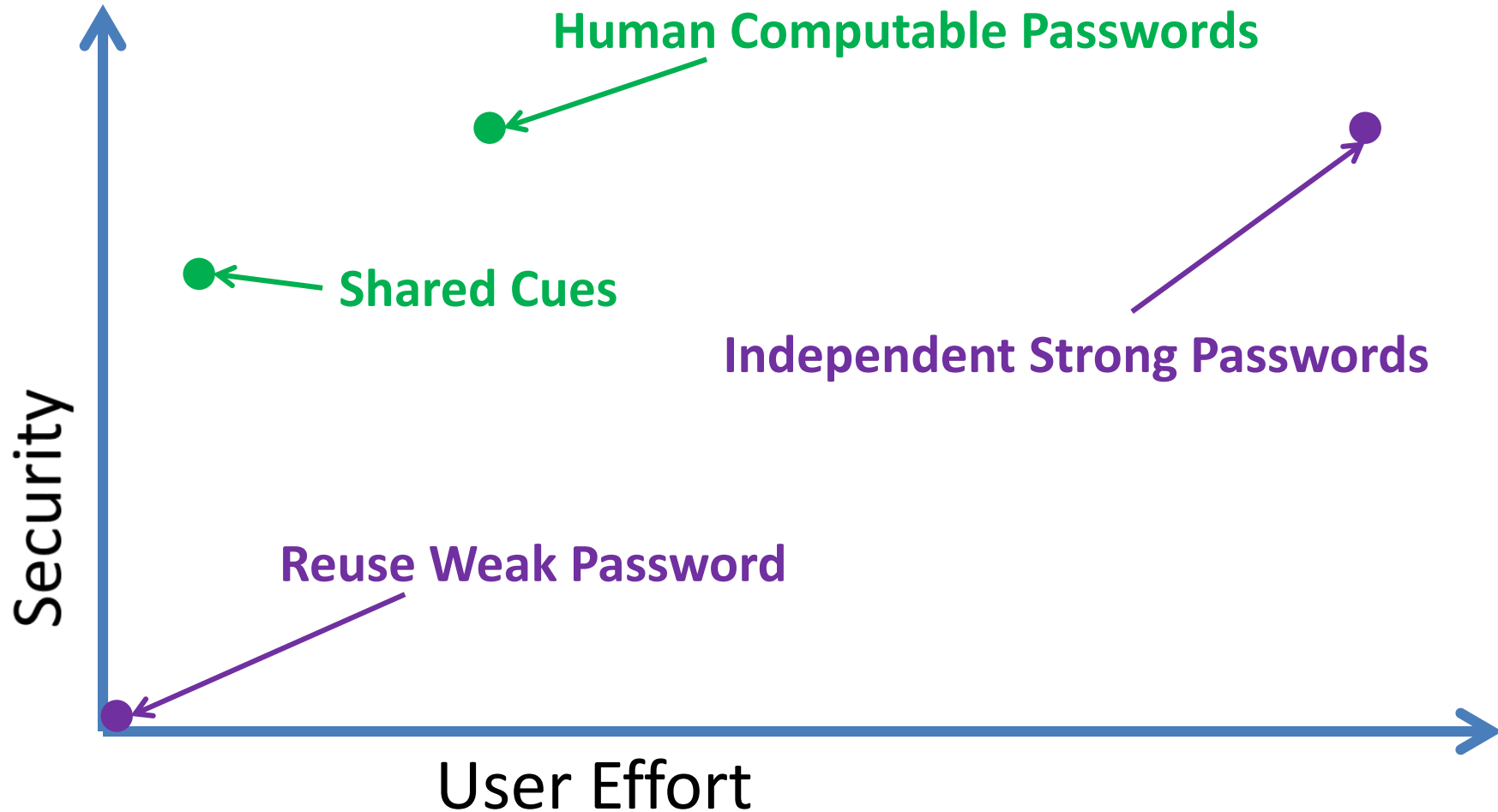
Account	Amazon	Ebay
Password	$w_1 w_2 w_3 w_4$	$w_1 w_2 w_3 w_4$

Scheme 2: Strong Random Independent

Four Independent Random Words per Account

Account	Amazon	Ebay
Password	$w_1w_2w_3w_4$	$x_1x_2x_3x_4$

Preview of Results



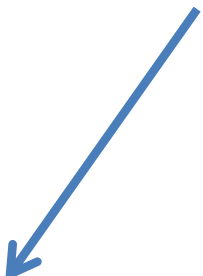
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First Attempt: Chunking

- Memorize: nbccbsabc
- Memorize: tkqizrlwp
- 3 Chunks vs. 9 Chunks!

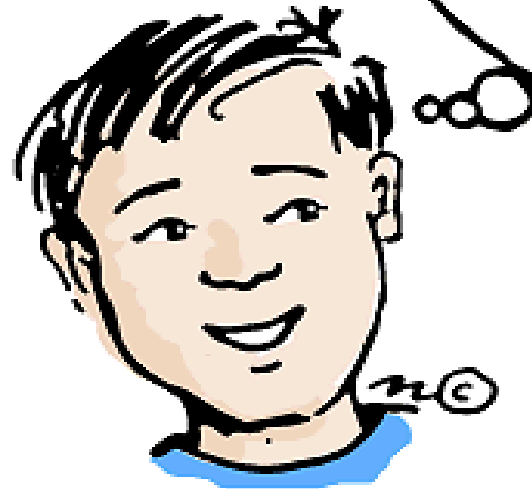
Incomplete



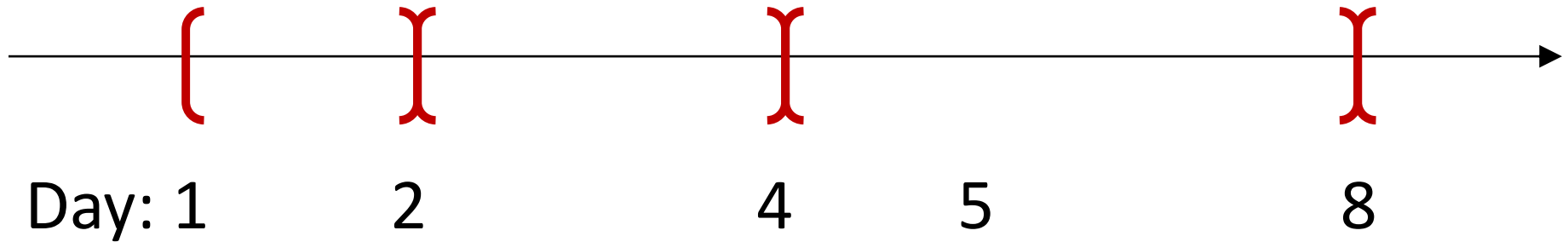
Usability Goal: Minimize Number of Chunks in Passwords

Human Memory: Vast, but Lossy

- Rehearse or Forget!
 - How much work?
- Quantify Usability
 - Rehearsal Assumption

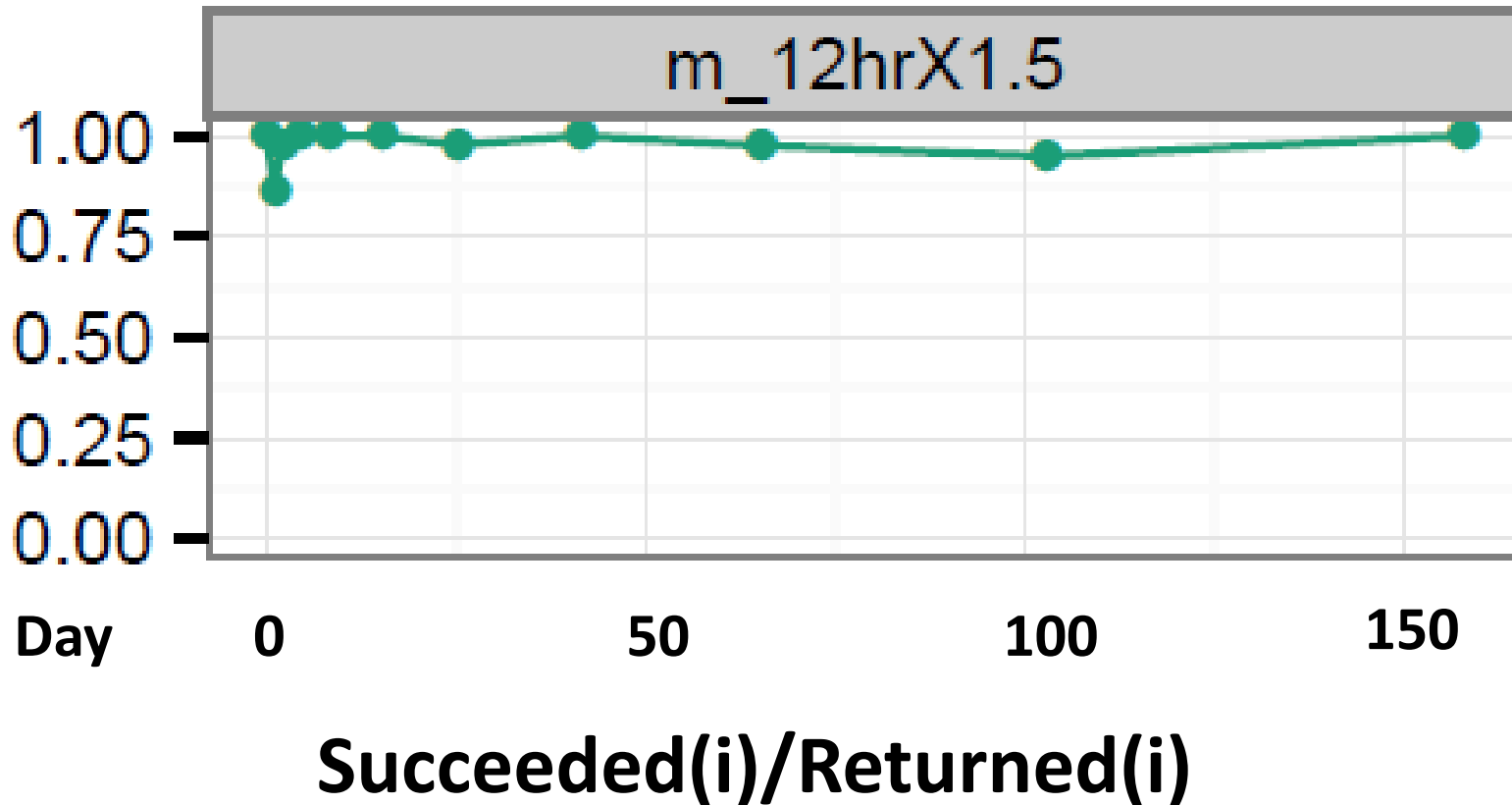


Memory Capability

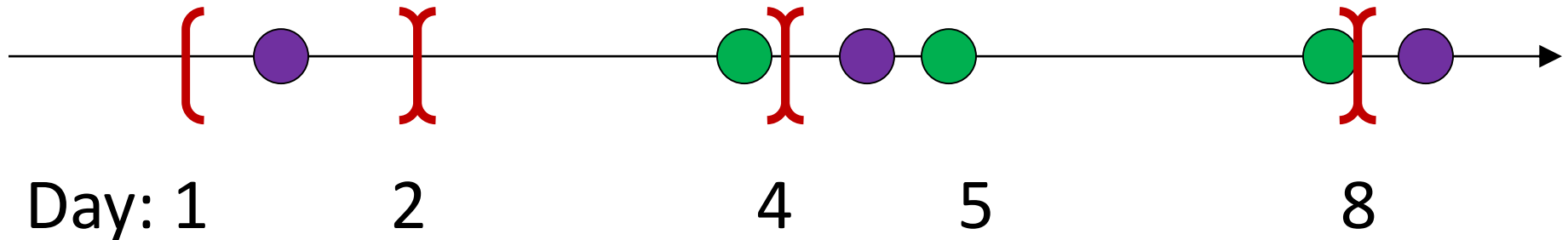


Expanding Rehearsal Assumption: user maintains cue-association pair by rehearsing during each interval $[s^i, s^{i+1}]$.

Memory Capability



Natural Rehearsal



Expanding Rehearsal Assumption: user maintains cue-association pair by rehearsing during each interval $[s^i, s^{i+1}]$.



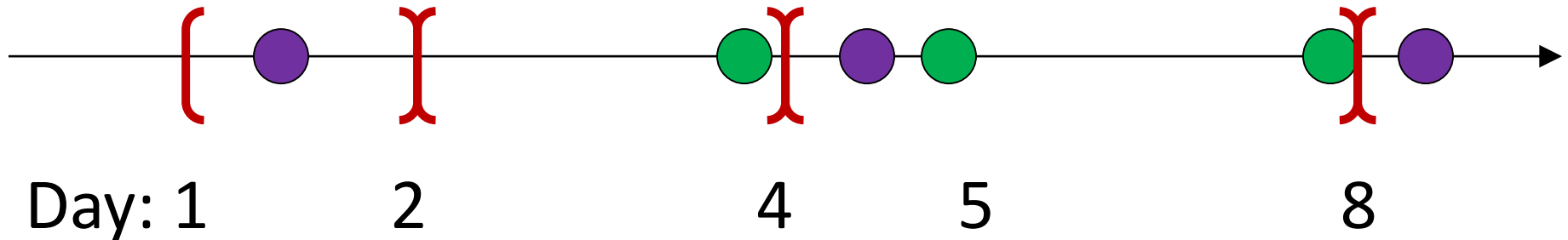
Visit Amazon: Natural Rehearsal



Google

X_t : extra rehearsals to maintain *all* passwords for t days.

Extra Rehearsals



X_t : extra rehearsals to maintain *all* passwords for t days.

Usability Measure: X_t	Reuse Password	Independent Passwords
X_0	0	2

Usability Goal: Minimize X_t

Usability Results

	Reuse Strong	Strong Random Independent
Active	0.002	2,938
Typical	0.023	2,974
Occasional	0.109	3,135
Infrequent	3.239	4,024

$E[X_\infty]$: Extra Rehearsals to maintain *all* passwords over lifetime.

$m = 75$ accounts, $s=1.5$

Usable

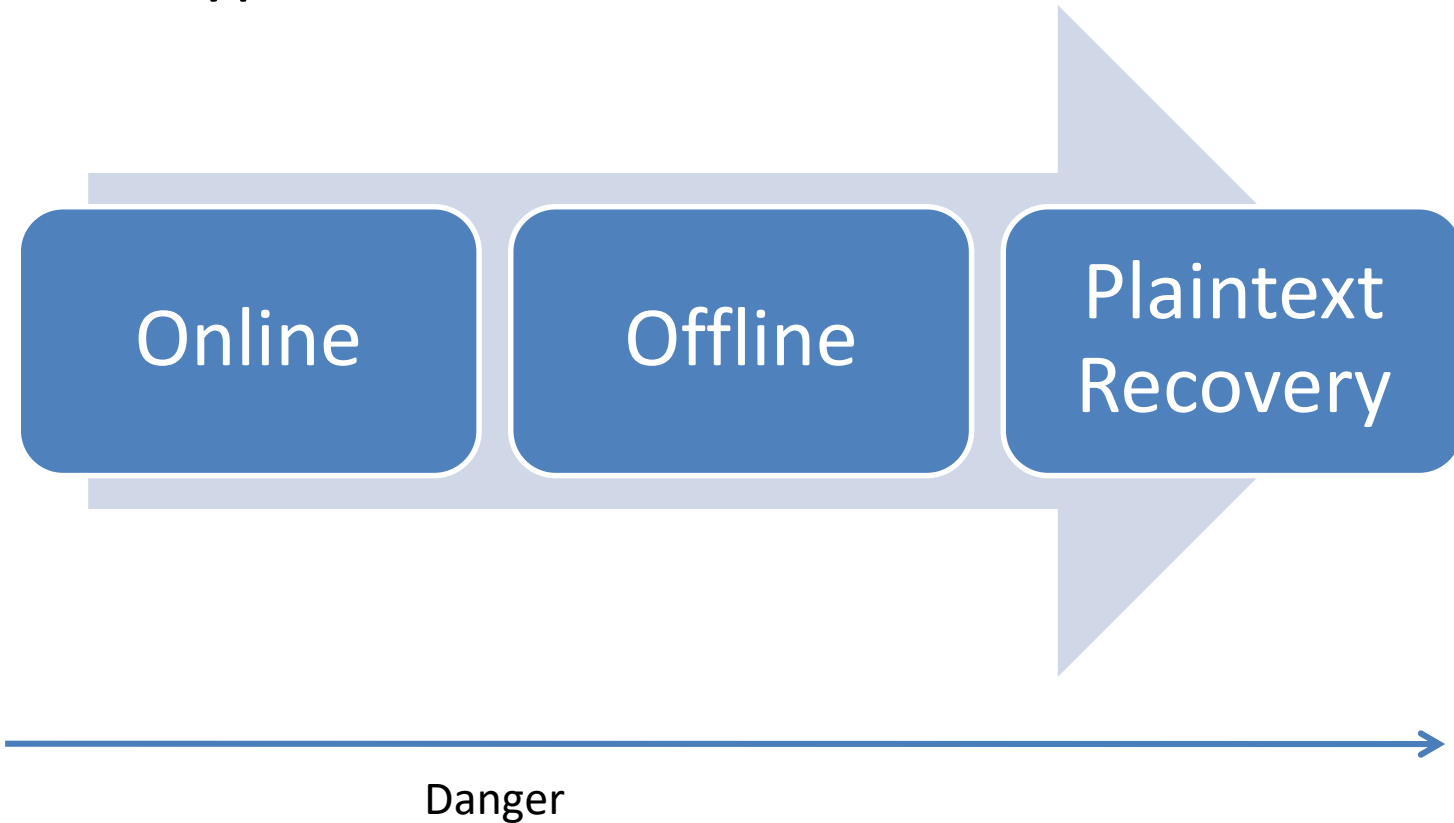
Unusable

Outline

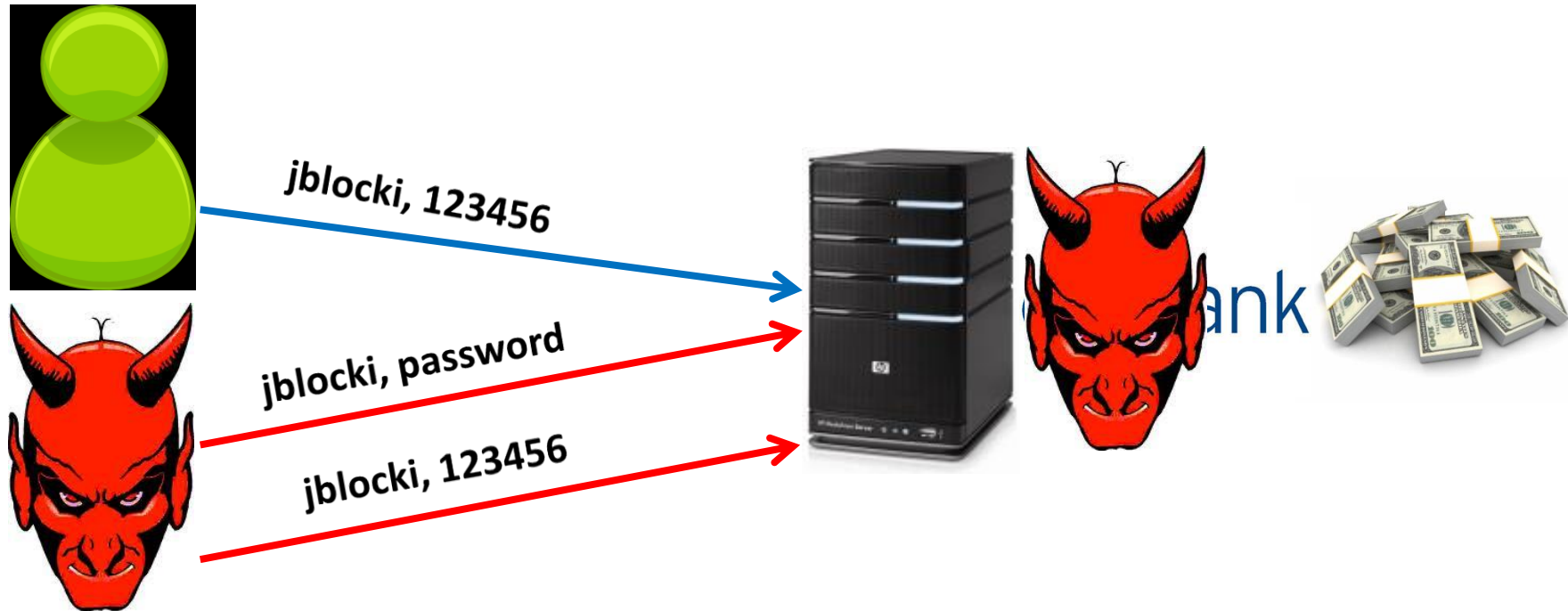
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Security (what could go wrong?)

Three Types of Attacks

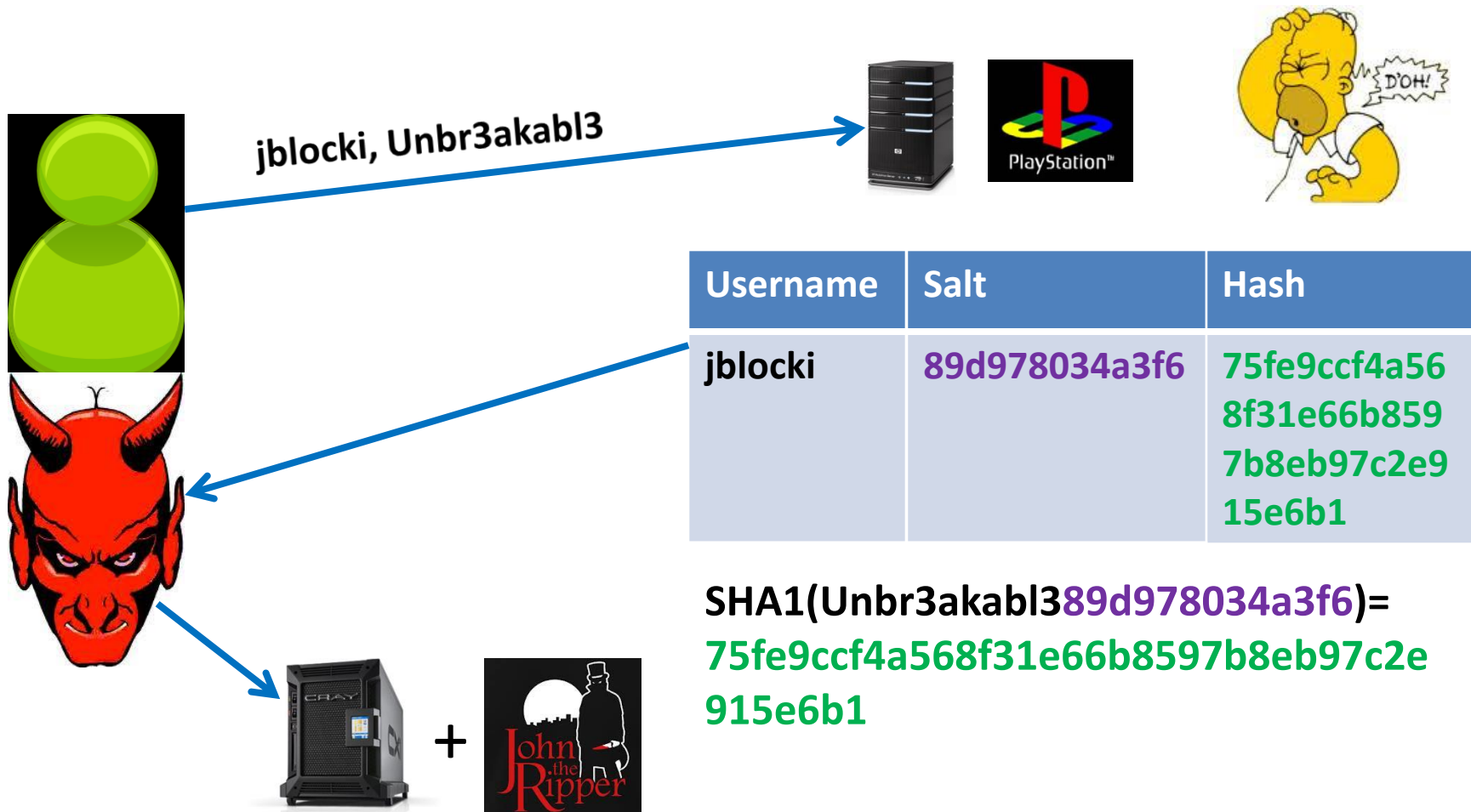


Online Attack

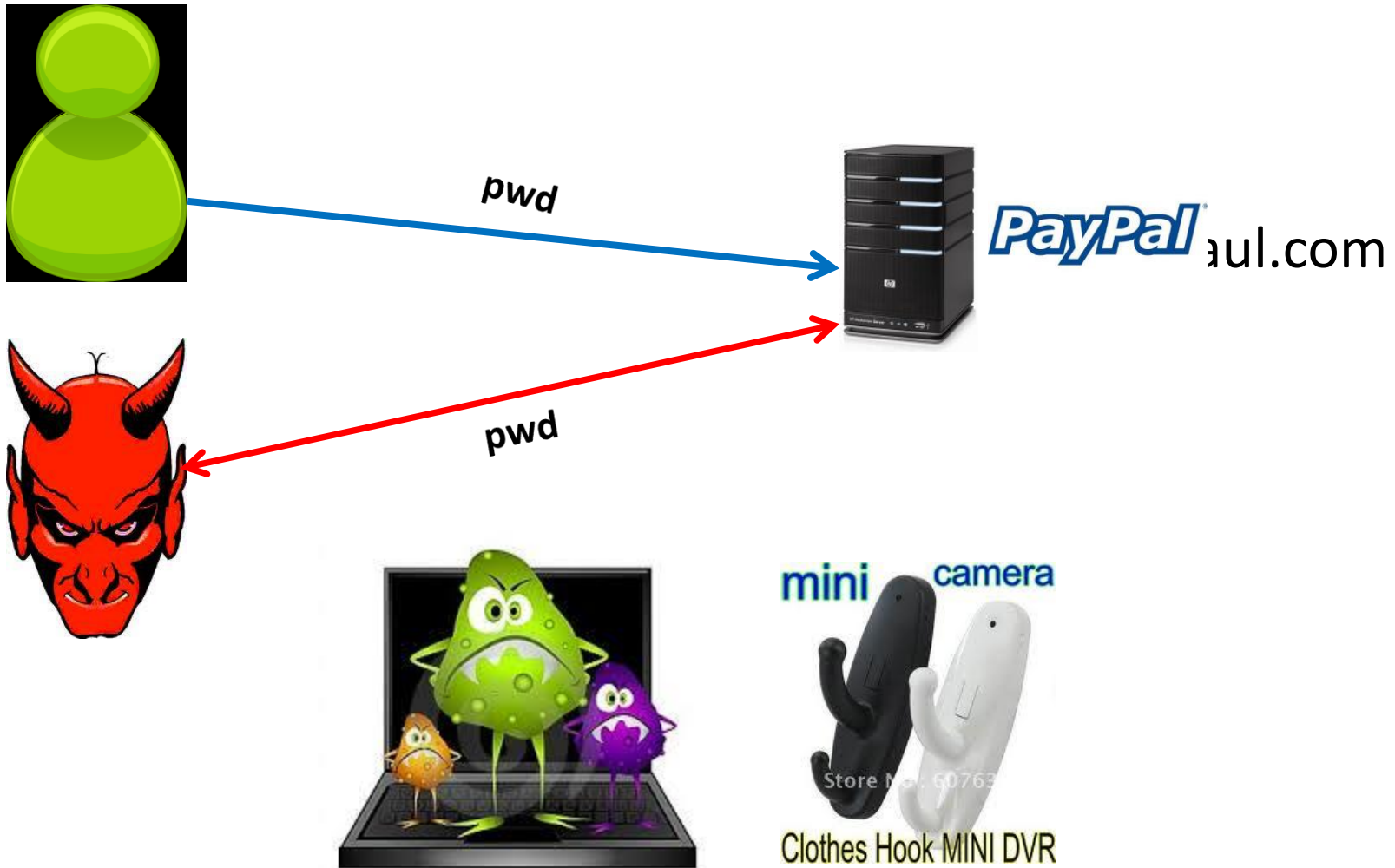


Guess Limit: k-strikes policy

Offline Dictionary Attack



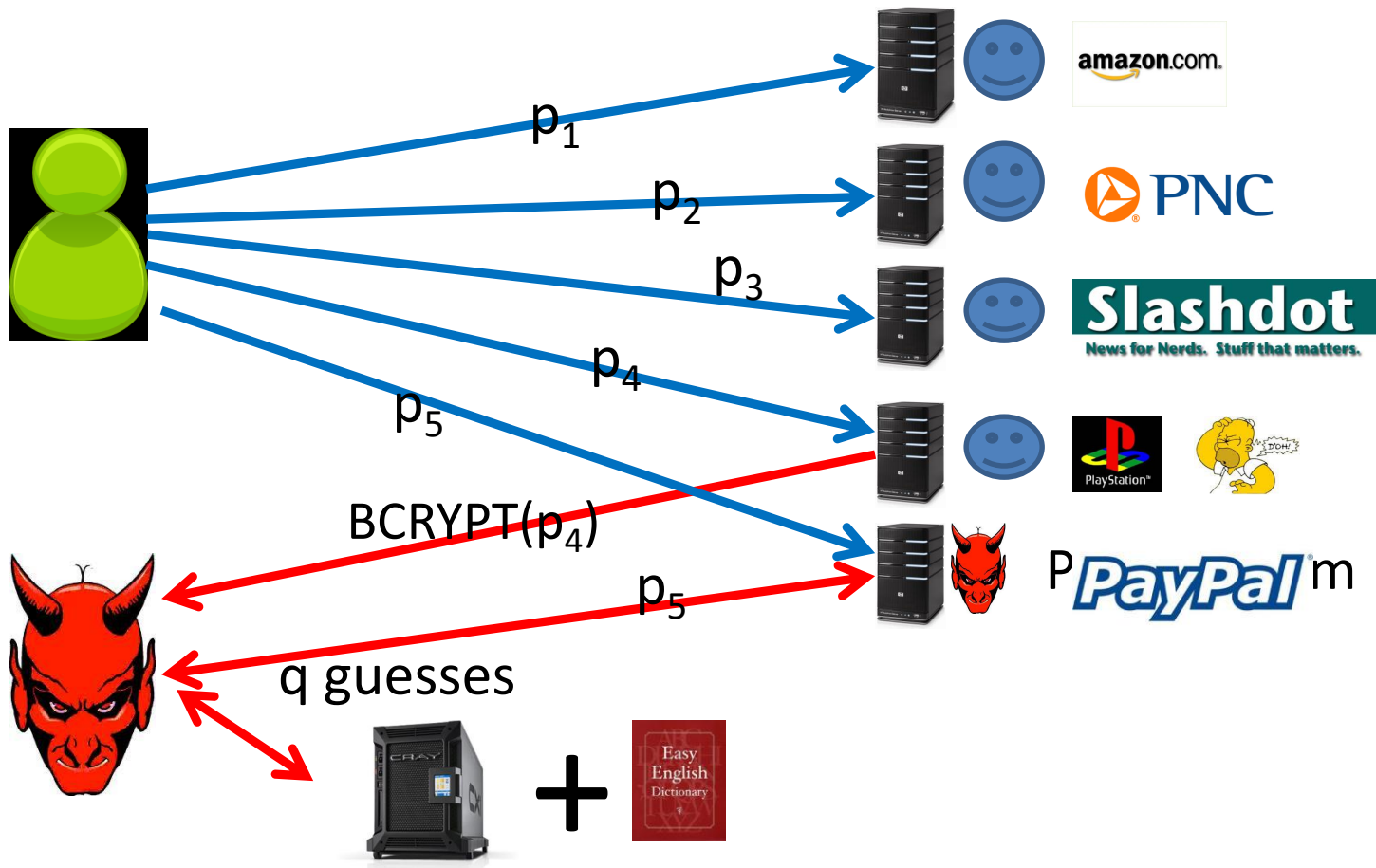
Plaintext Recovery Attack



Security Philosophy

- Dangerous World Assumption
 - Targeted adversary has background information about our user (e.g., Hobbies, Birthdate)
 - Adversary can adapt after learning the user's new password management strategy
- Limit Damage when something goes wrong
 - Offline attacks should fail with high probability
 - Contain damage of a successful phishing attack

Security as a Game



(q, δ, m, s, r, h) -Security

For any adversary **Adv**

$$\Pr \left[\text{failing} \mid \text{Adv}, q, m, s, r, h \right] \leq \delta$$

$q = \#$ offline guesses



$s = \#$ online guesses

$r = \#$



Plaintext Recovery Accounts

$h = \#$



Offline Attack Accounts

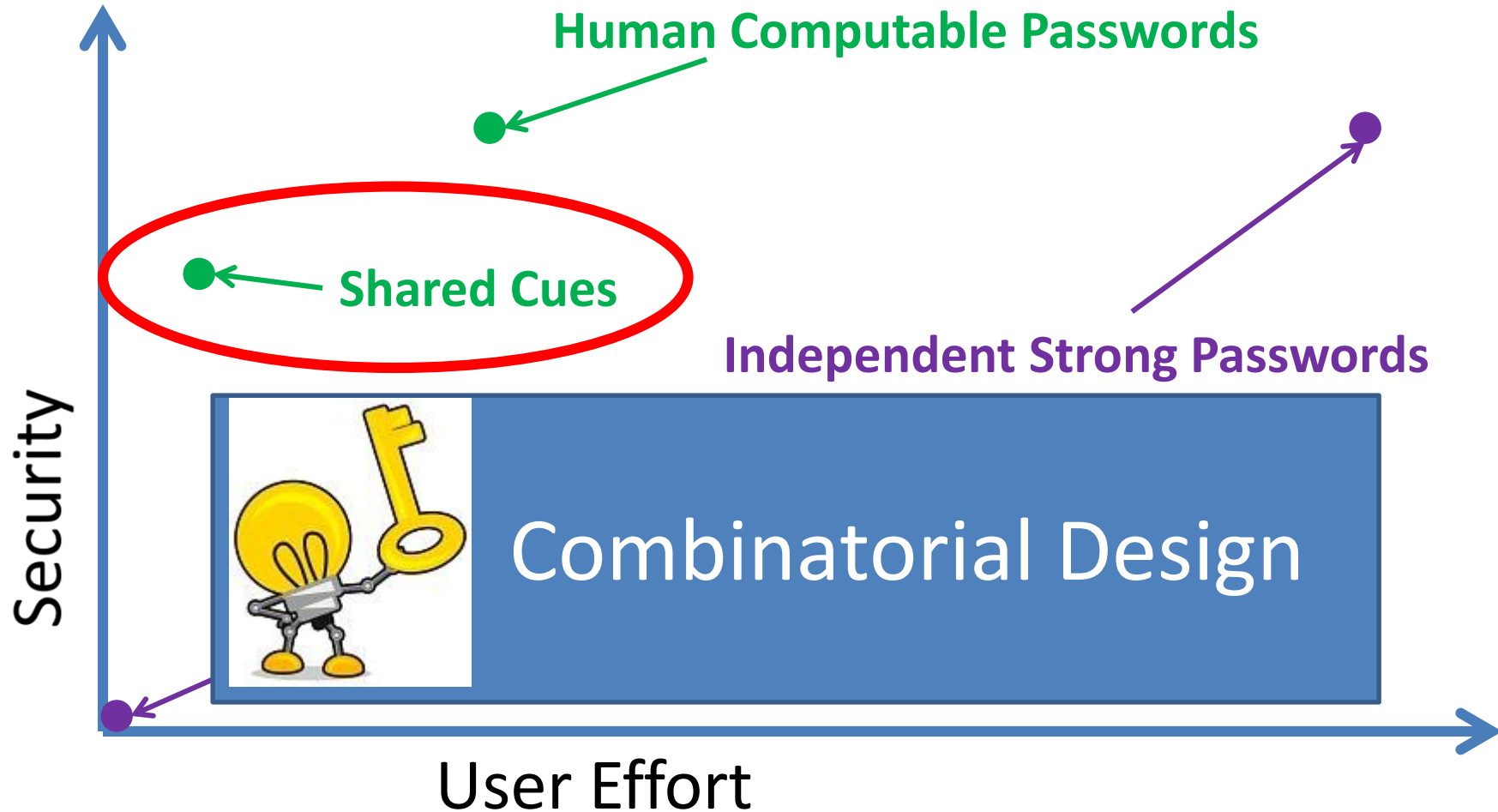
$m = \#$ of accounts

Security Results

Attacks	 r= 1	 r= 1  h=1	 r=2	 
Reuse	No	No	No	No
			Usable + Insecure	
Strong Random Independent	Yes	Yes	Yes	Yes
			Unusable + Secure	

$(10^{10}, \delta, m, 3, r, h)$ -security

Preview of Results



Outline

- Introduction
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- **Shared Cues**
- Human Computable Passwords
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Our Approach

Public Cue

Private



Action: kicking



Object: penguin



Login

amazon.com.



Action



Object

...



Object

Pwd

Kic + Pen + + Pir

Login

PayPal



Action



Object

...

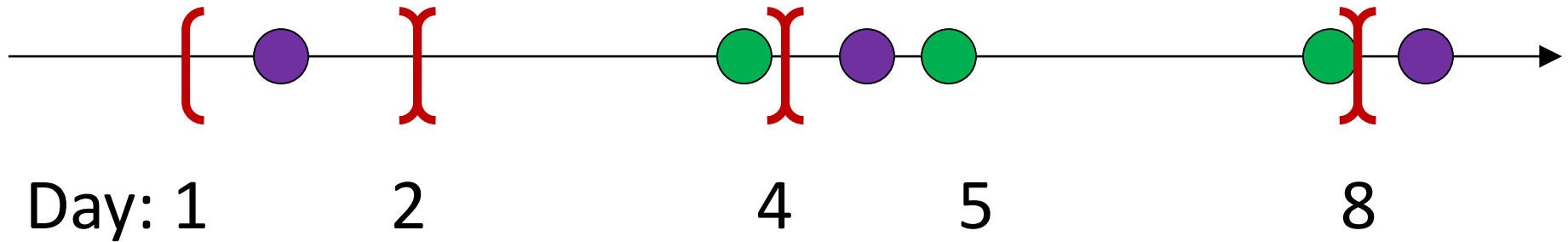


Action

Pwd

Kic + Lio + ... + Kis

Sharing Cues

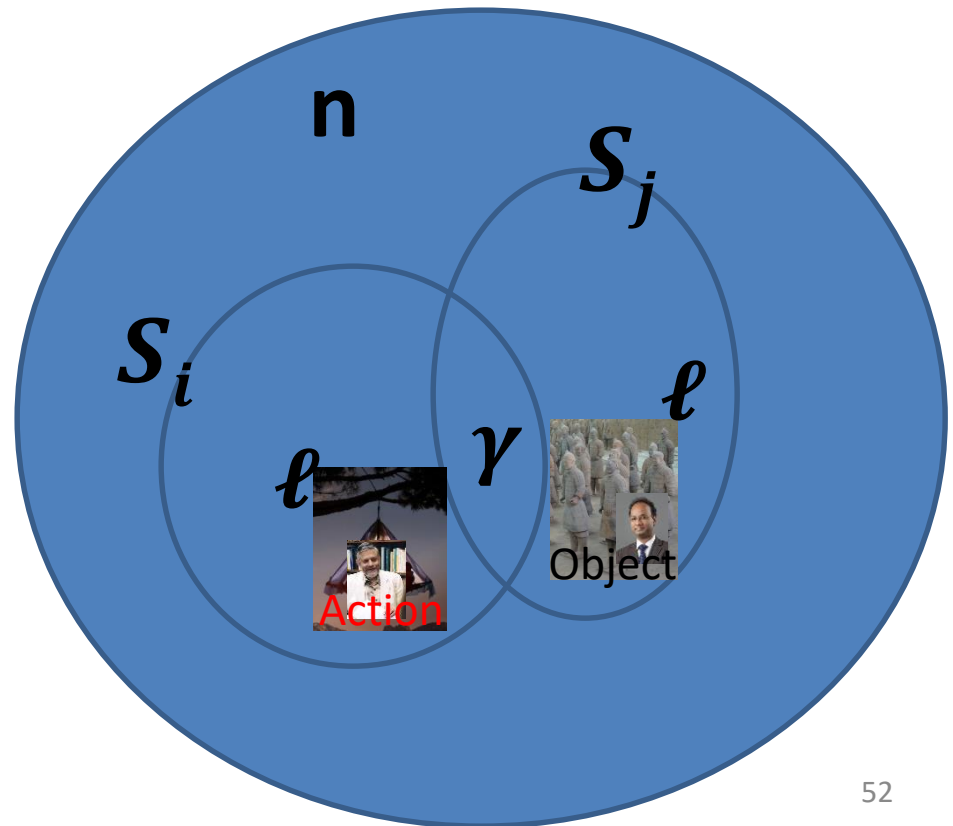


- Usability Advantages
 - Fewer stories to remember!
 - More Natural Rehearsals!
- Security?

(n, ℓ, γ) -Sharing Set Family

Definition: A (n, ℓ, γ) -Sharing Set Family of size m is a family of sets $\{S_1, \dots, S_m\}$ with the following properties

- $\forall i \neq j, |S_i \cap S_j| \leq \gamma$
- $\forall i |S_i| = \ell$
- $|\bigcup_{i=1}^m S_i| = n$



(n, ℓ, γ) -Sharing Set Family

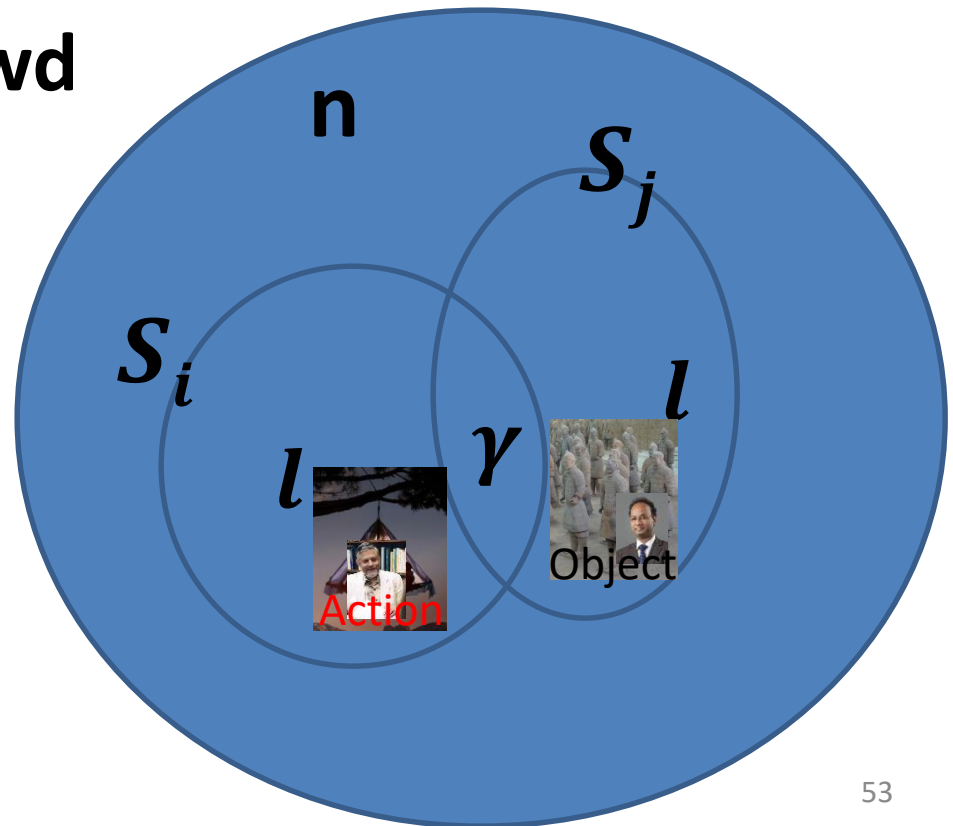
m – number of passwords $\{S_1, \dots, S_m\}$.

$n/2$ – total #PAO stories

ℓ – #words in each pwd

γ – max intersection

S_i – PAO stories for
account i .



Sharing Cues

Thm: There is a $(43,4,1)$ -Sharing Set Family of size $m=90$

- Proof?
 - Chinese Remainder Theorem!
 - Notice that $43 = 9+10+11+13$ where 9, 10, 11, 13 are pair wise coprime.
 - A_i uses cues: $\{i \bmod 9, i \bmod 10, i \bmod 11, i \bmod 13\}$

Chinese Remainder Theorem

By the Chinese Remainder Theorem there is a unique number x s.t

$$1) 1 \leq x \leq 90$$

$$2) x \equiv i \pmod{9}$$

$$3) x \equiv i \pmod{10}$$

Hence, for $i \neq j$ accounts A_i and A_j cannot use the same **red cue** and **blue cue**.

Usability Results

	Reuse	Strong Random Independent	[SC-1] 15 PAO Stories	[SC-0] 7 PAO Stories
Active	10	2,938	9.8	4.0
Typical	10	2,974	11.8	4.5
Occasional	10	3,135	15.2	5.5
Infrequent	3.2	4,024	93.2	25.7

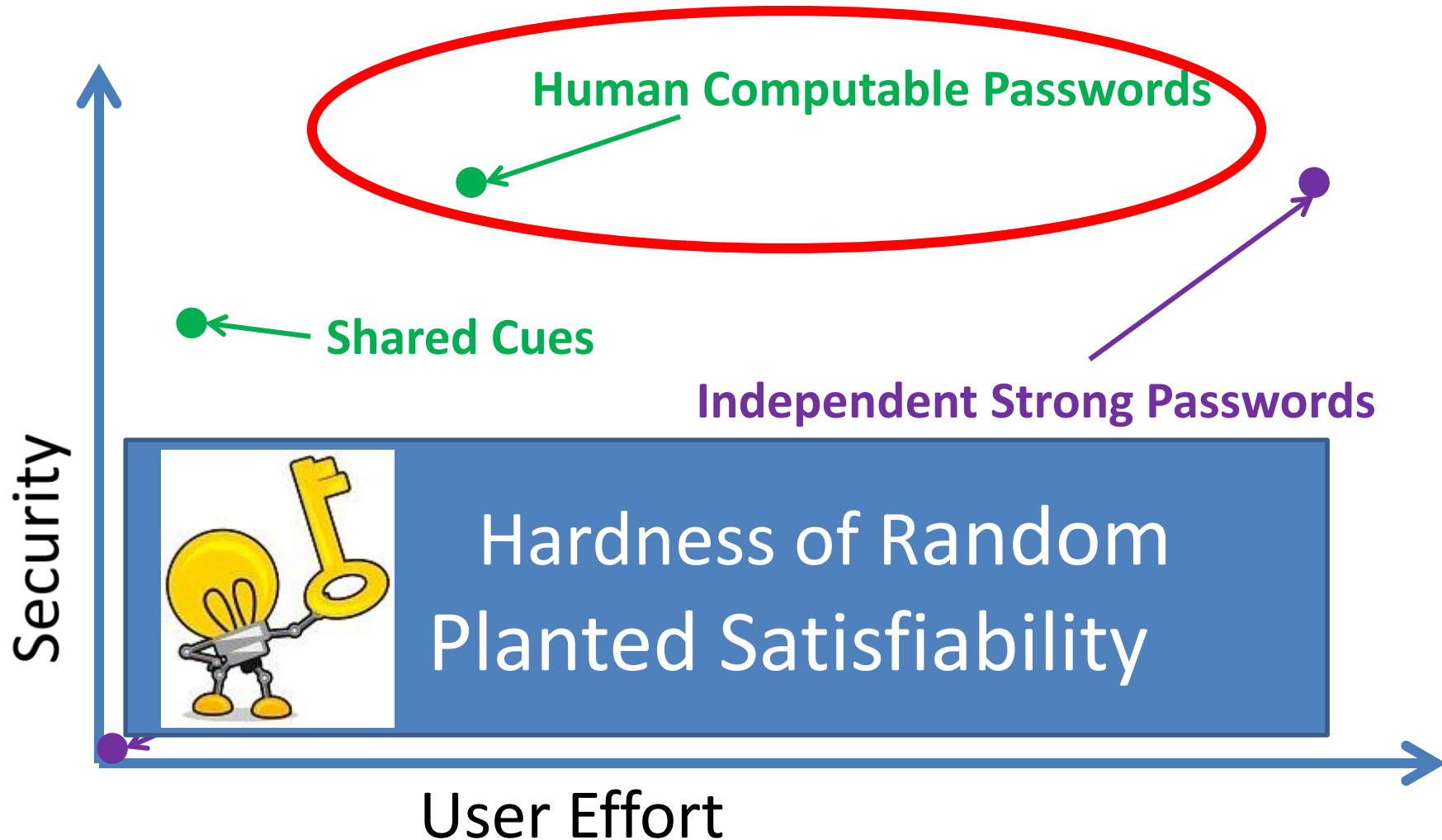
$E[X_\infty]$: Extra Rehearsals to maintain *all* passwords over lifetime.

Summary: Shared Cues

Attacks	 r=1	 r=1  h=1	 r=2	 r=2 
(n,ℓ,ℓ)-Sharing [Reuse]	No	No	No	No Usable + Insecure
(n,ℓ,0)-Sharing [Independent]	Yes	Yes	Yes	Yes Unusable + Secure
(n,8,3)-Sharing [SC-1]	Yes	Yes	Yes	No Usable + Secure
(n,5,3)-Sharing [SC-0]	Yes	No	No	No Usable + Secure

$(10^{10}, \delta, m, 3, r, h)$ -security

Preview of Results



Outline

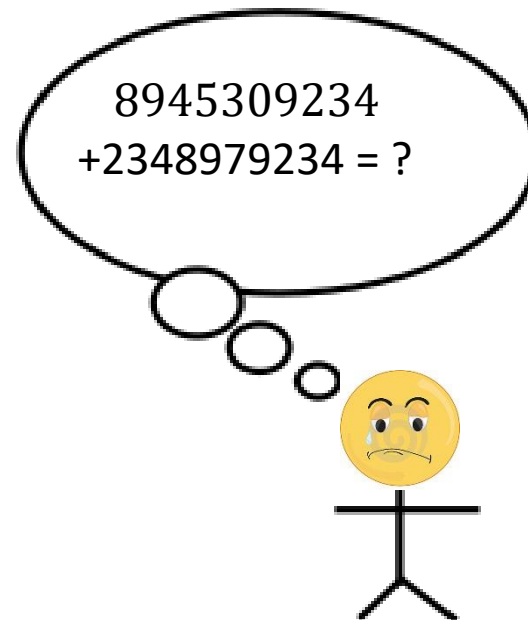
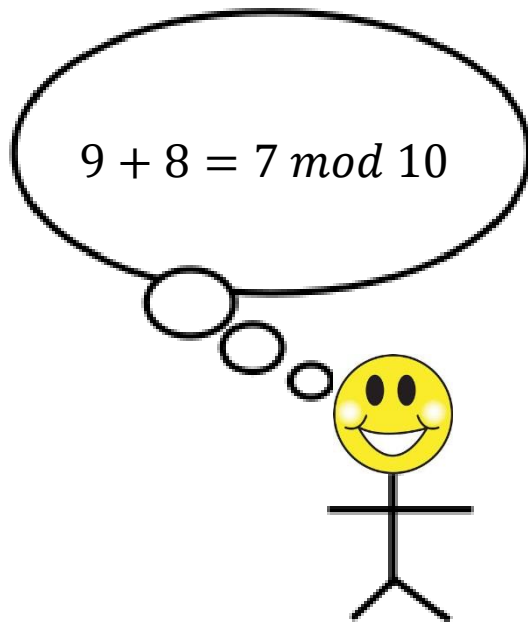
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Our Scheme: Human Computable Passwords

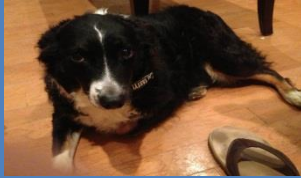
- Remains secure many breaches (e.g., 100)
 - Heartbleed
- Passwords computed by responding to public challenges
 - Computation done in user's head
- Required Operations
 - Addition modulo 10
 - Memorize a random mapping

Human Computation

- Restricted Capabilities
 - Simple operations (addition, lookup)
 - Operations performed in memory (limited space)



Random Mapping

Image I			...	
$\mathbb{Q}(I)$	9	3	...	6

Initialization:

User Memorizes Random Mapping

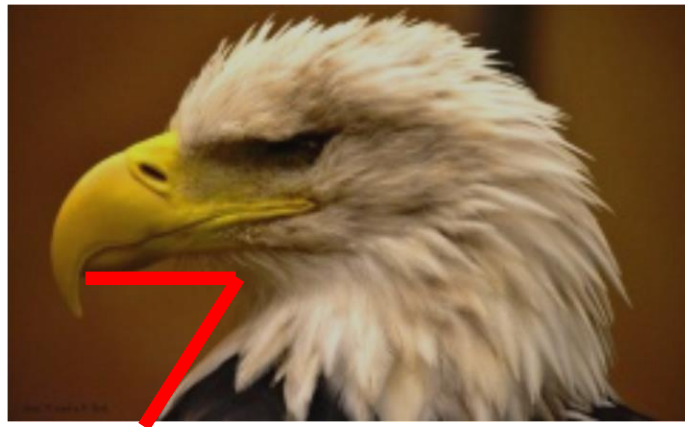
$$\mathbb{Q}: \{I_1, \dots, I_n\} \rightarrow \{0, 1, \dots, 9\}$$

Example: $n=30$ images

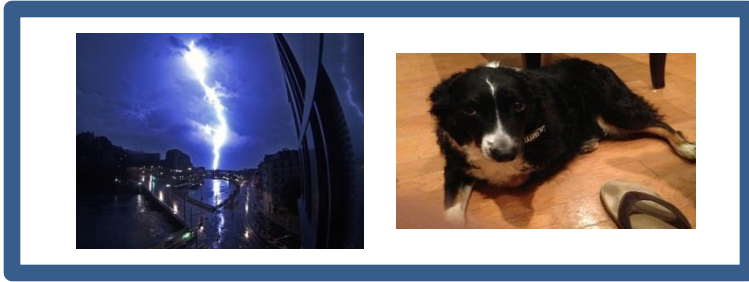
Mnemonics

$$\boxed{?} \left(\text{eagle} \right) = 7$$

Instruction: Trace the eagles body from the bottom of the eagle's beak down to the bottom of the picture. It looks like the number 7.



Single-Digit Challenge



Computing the Response:

$$\begin{aligned} & \boxed{?} \left(\left[\text{lightning bolt} \right] \right) + \boxed{?} \left(\left[\text{dog} \right] \right) \bmod 10 \\ & = 9 + 3 \bmod 10 = 2 \end{aligned}$$

0



5



1



6



2



7



3



8



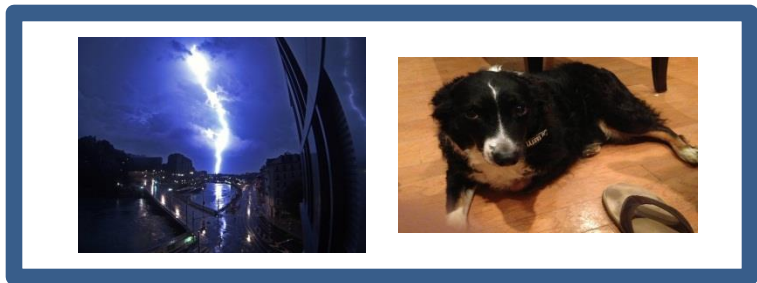
4



9



Single-Digit Challenge



Response:

$$[?] \left(\left[\text{lightning} \right] \right) + [?] \left(\left[\text{dog} \right] \right) \bmod 10$$

$$= 9 + 3 \bmod 10 = 2$$

0



5



1



6



2



7



3



8



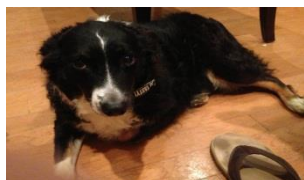
4



9



Single-Digit Challenge



Final Response:

$$\begin{aligned}
 & \boxed{?} \left(\text{Minions} \right) + \boxed{?} \left(\text{Planet} \right) + \boxed{?} \left(\text{Donkey} \right) \\
 & = 7 + 4 + 5 \bmod 10 = \mathbf{6}
 \end{aligned}$$

0



5



1



6



2



7



3



8



4



9



Passwords



Username:

jblocki

Password:

0



5



1



6



2



7



3



8



4



9



Passwords



Username:

jblocki

Password:

*

0



5



1



6



2



7



3



8



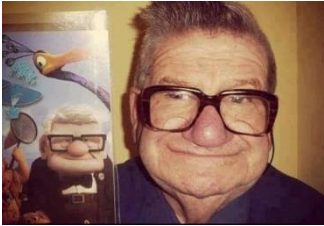
4



9



Passwords



Username:

jblocki

Password:

* *

0



5



1



6



2



7



3



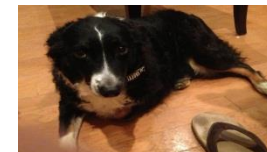
8



4



9



SAT Solver Attack

		#Leaked Challenge Response Pairs (M)					
		M=50	100	300	500	1000	10000
Secret Length (N)	N=26	23.5 hr	40 min	4.5 hr	29 min	10 min	2 min
	N=30	-----	UNSLV	2.3 hr	36 min	10 min	20 s
	N=50	-----	-----	-----	-----	UNSLV	7 hr
	N=100	-----	-----	-----	-----	-----	UNSLV

UNSLV – Solver did not find secret mapping in 2.5 days

----- – Instance is harder than unsolved instance

Usability

Example Authentication Time:

- 7.5 seconds/digit
- 30 seconds for a 4-digit password
- 1.25 minutes for a 10-digit password

Memorizing the Secret Mapping:

- Memorized 100 image/digit pairs in 2.5 hours
- One Time Cost

Usability (Memorization)

	Human Computable Passwords			Shared Cues	
	N = 100	N = 50	N=30	SC-1	SC-0
Active	0.40	0	0	3.93	0
Typical	2.14	0.04	0	10.89	0
Occasional	2.50	0.05	0	22.07	0
Infrequent	70.7	22.3	6.1	119.77	2.44

$E[X_{365}]$: Extra Rehearsals to maintain *all* passwords over the first year.

Theoretical Security Guarantees

Thm (Informal): Any statistical algorithm needs to see at least $m = \tilde{O}(n^{1.5})$ passwords before it can even approximately guess the secret mapping σ .

Example: $n=30$ images

Security

Thm (Informal): Any statistical algorithm needs to see at least $m = \tilde{O}(n^{1.5})$ passwords before it can even approximately guess the secret mapping σ .

Thm (Informal): Any polynomial time adversary needs to see $m = \tilde{O}(n^3)$ passwords before he can use Gaussian Elimination to approximately guess the secret mapping σ .

Thm (Informal): Any polynomial time adversary who can guess the user's passwords with accuracy much better than random guessing can also approximately recover the secret mapping σ .

Memory Experiment 1



Memory Experiment 2



Our Thesis

User models and security models can guide the development of human authentication schemes with analyzable usability and security properties.

```
graph TD; A[Develop + Analyze] --- B[User Model]; A --- C[Security Model];
```

Develop + Analyze

User Model

Security Model

Thanks for Listening!

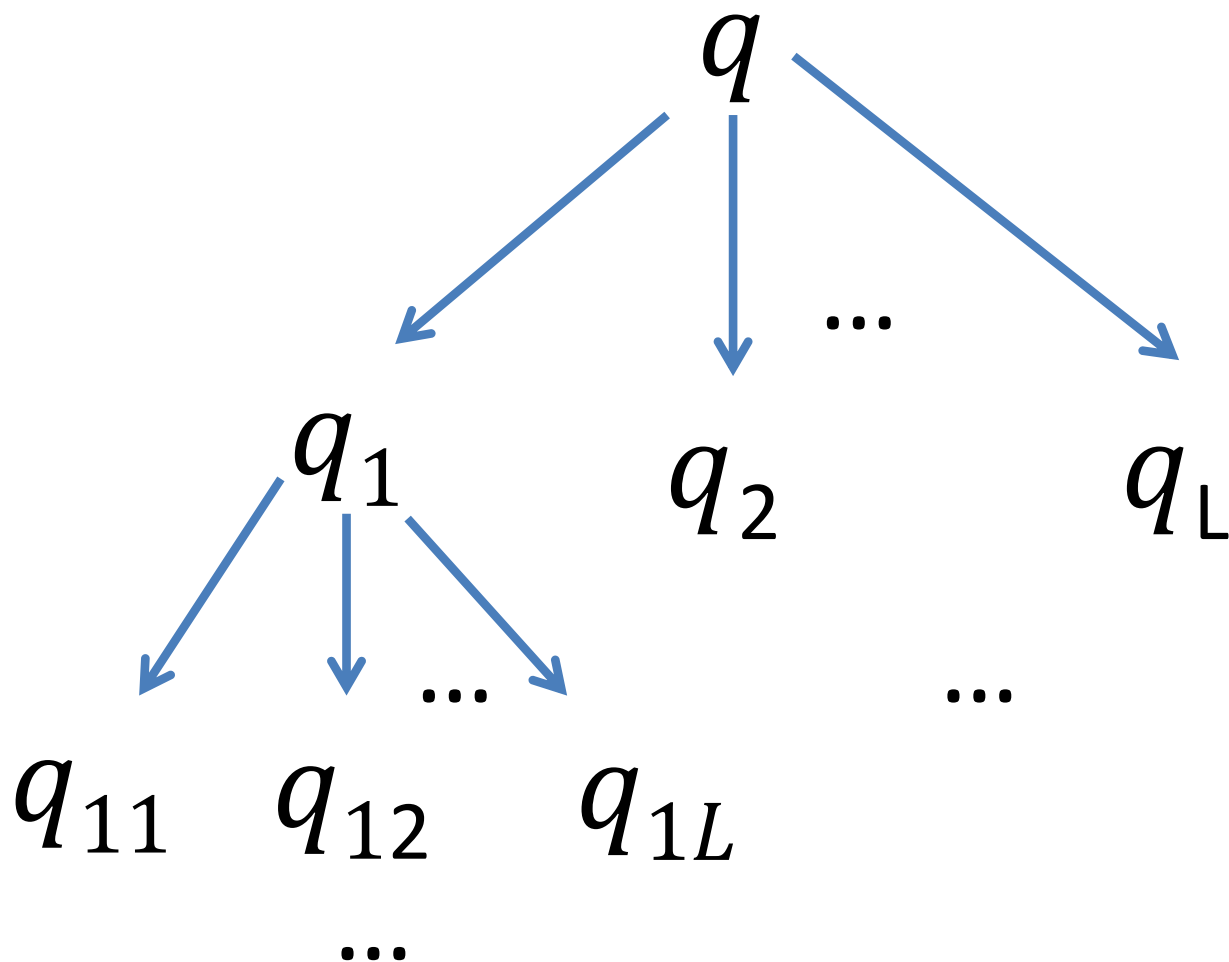


Technical Tools

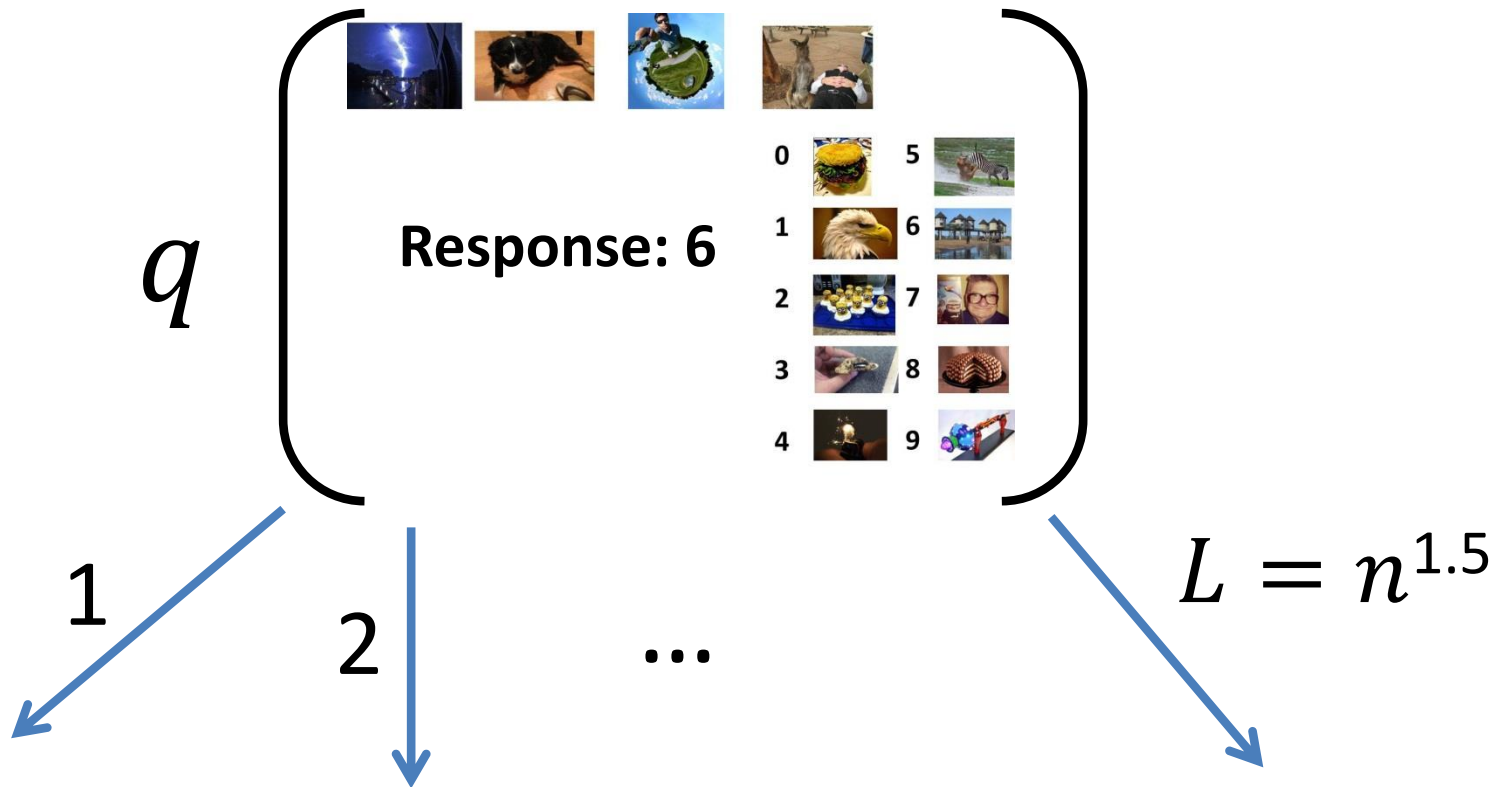


- Discrimination Norm
 - On average how much different would the answers to a query q be if we picked a random challenge and a random response?
 - Small discrimination norm $\Rightarrow$ Statistical Algorithm must use deep tree. [FPV13]
- Fourier Analysis
 - Express discrimination norm as a low degree function
- Generalized Hypercontractivity Theorem
 - Bounds the expected value of low degree functions

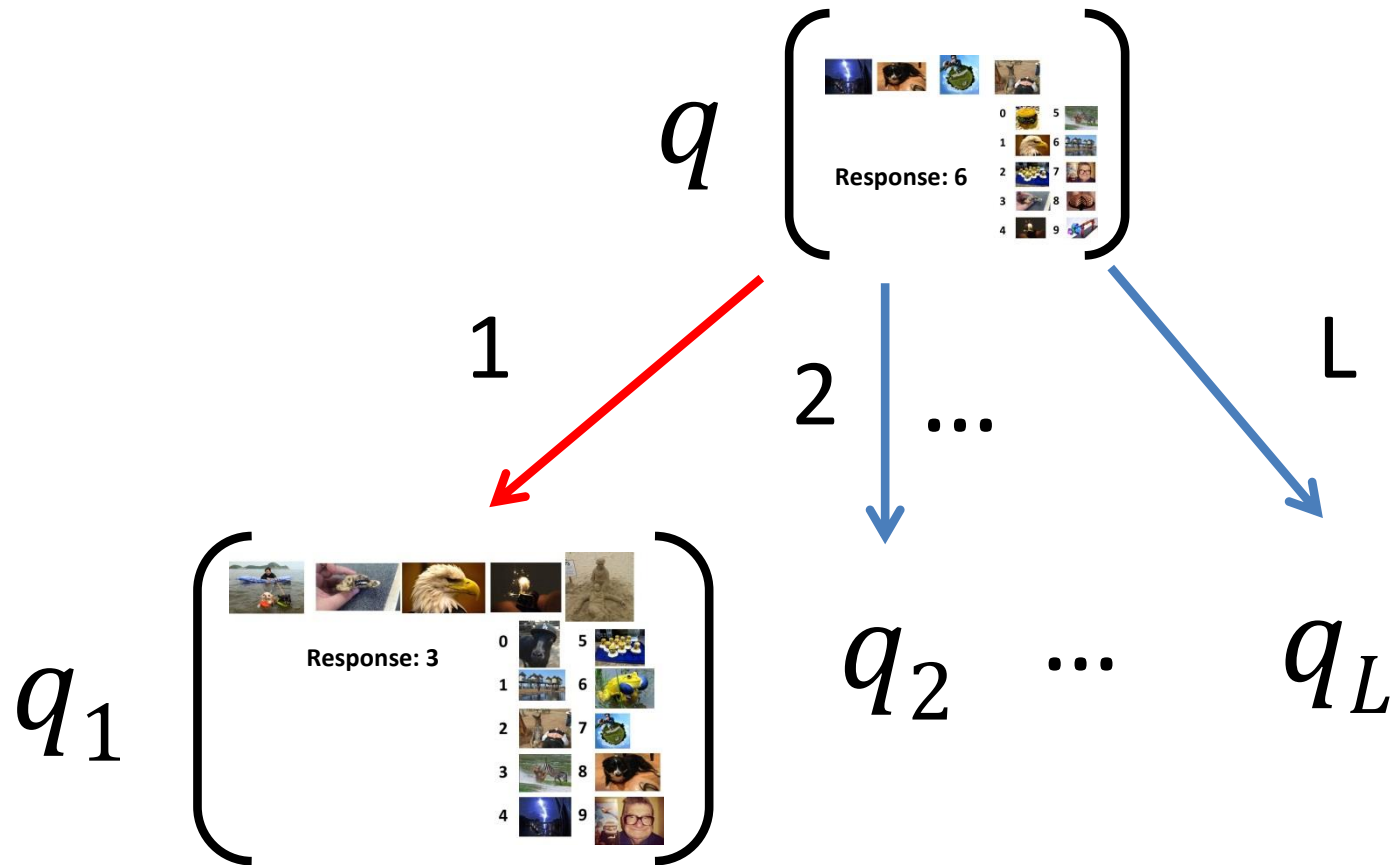
Statistical Algorithm



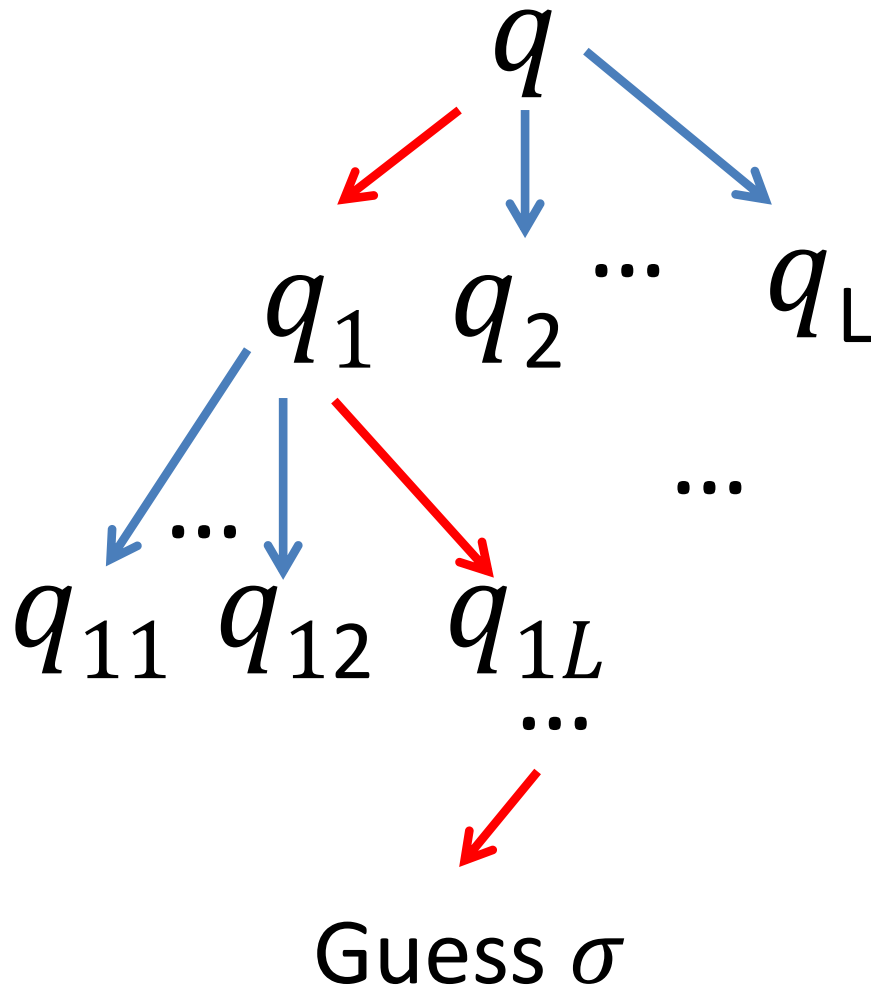
Statistical Algorithm



Statistical Algorithm



Statistical Algorithm



Security

Thm (Informal): Any statistical algorithm needs to see at least $m = \tilde{O}(n^{1.5})$ passwords before it can even approximately guess the secret mapping σ .

Almost all known algorithmic techniques
Example: $n=30$ Images

Spectral Methods

Local Search

Expectation Maximization

First and Second Order Methods for Convex

Optimization

~~Gaussian Elimination~~