# Quantitative Cyber-Security 

## Colorado State University Yashwant K Malaiya CS559

L18


CSU Cybersecurity Center Computer Science Dept

## Detectability Profile

- To test a potential fault, it needs to be triggered and error needs to be sensed.
- Some faults are easy to test, some are very hard to test.
- As testing and debugging progresses, the remaining faults are the ones that are harder to find.
- Corner cases: at extreme values for multiple variables.



## Software Reliability Growth models

- Time-based models:
- Defect discovery rate = f(calendar time)
- Cumulative number of defects discovered $=f$ (calendar time)
- Exponential and Logarithmic models
- Coverage based models
- Cumulative number of defects discovered =f(coverage achieved)


## Term Project

All submissions should follow the 2-column format for IEEE conference papers.

- Proposal and sources: Oct 10
- Semi-final report: Nov 7
- It should indicate that you have finished at least two-thirds of the work. It should include an abstract, discussion of background literature, a summary of the investigations/findings, any refinements of the proposal objectives as a result of the past study, what the final report will contain and the applicable references.
- Technical details, equations/tables/plots/screen-shots
- You must be aware of the current trends in research/industry.
- Slides: Due Nov 18
- Ten-minute oral presentation Nov 19-Dec 8


# Quantitative Cyber-Security 

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Paswords


CSU Cybersecurity Center Computer Science Dept

## Authentication

- Authentication: the process of verifying an actor's identity
- Needed for security of systems
- Permissions, capabilities, and access control are all contingent upon knowing the identity of the actor
- Parameterized as a username and a user's proprietary information
- The proprietary information attempts to limit unauthorized access


## Types of proprietary info

- Actors provide their proprietary information to login to a system
- Three classes of proprietary info:

1. Something you know

- Example: a password

2. Something you have

- Examples: a smart card or smart phone

3. Something you are

- Examples: fingerprint, voice scan, iris scan


## Checking Passwords

- The system must validate passwords provided by users
- Thus, passwords must be stored somewhere
- Simple scheme: plain text (is this good?)


## password.txt

| cbw | p4sswOrd |
| :--- | :--- |
| sandi | iheart doggies |
| amislove | 93Gd9\#jv*0x3N |
| bob | security |

## Problem: Password guessing

How easy it is to guess a password?

- If your keyboard has $\mathrm{R}=95$ unique characters,
- randomly constructing a password from that whole set, 12-character password, then $\mathrm{L}=12$.
- $95^{12}=540,360,087,662,636,962,890,625$ passwords

Entropy $=\log _{2}\left(\mathrm{R}^{\mathrm{L}}\right)=78.9$ bits assuming passwords are created randomly

Ascii is 8 bits. Thus about $2^{12 \times 8}$

- Non-randomness makes password guessing easier.
- Measures of password strength proposed and used

Password guessing at login? Can be defeated by

- Limited number of tries: 3-5
- Blocking attempts from unknown/suspected IP addresses


## Problem: Password File Theft

- Attackers often compromise systems
- They may be able to steal the password file
- Linux: /etc/shadow
- Windows: c:\windows\system32\config\sam
- If the passwords are plain text, what happens?
- The attacker can now log-in as any user, including root/administrator
- Passwords should never be stored in plain text


## Famous Password breaches

|  | Top 5 |  |
| :--- | :--- | :--- |
| Yahoo | $2013 ; 2014$ | 3 billion; 500 million |
| First American Financial Corp | 2019 | 885 million |
| Facebook | 2019 | 540 million |
| Marriott International | 2018 | 500 million |
| Friend Finder Networks | 2016 | 412.2 million |

According a Verizon Data Breach Investigations Report,

- over $70 \%$ of employees reuse passwords at work.
- " $81 \%$ of hacking-related breaches leveraged either stolen and/or weak passwords."


## Problem: Password File Theft

- Attackers often compromise systems
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- If the passwords are plain text, what happens?
- The attacker can now log-in as any user, including root/administrator
- Thus Passwords should never be stored in plain text, but using ..


## Encryption vs Hashing



- Impossible to reconstruct password from hash


## Hashed Passwords

- Key idea: store encrypted versions of passwords
- Use one-way cryptographic hash functions
- Examples: md5, sha1, sha256, sha512
- Cryptographic hash function transform input data into scrambled output data
- Deterministic: hash(A) = hash(A)

Md5: 128 bit

- High entropy:
- md5('security') = e91e6348157868de9dd8b25c81aebfb9
- md5('security1’) = 8632c375e9eba096df51844a5a43ae93
- md5('Security') = 2fae32629d4ef4fc6341f1751b405e45
- Collision resistant
- Locating $A^{\prime}$ such that hash $(A)=$ hash $\left(A^{\prime}\right)$ takes a long time
- Example: $2^{21}$ tries for md5


## Hashed Password Example

 md5('p4sswOrd') =
2a9d119df47ff993b662a8ef36f9ea20
User: cbw

md5('2a9d119df47ff993b662a8ef36f9ea20') = b35596ed3f0d5134739292faa04f7ca3
hashed_passw
cbw 2a9d119df47ff993b662a8ef36f9ea20
sandi 23eb06699da16a3ee5003e5f4636e79f
amislove 98bdOebb3c3ec3fbe21269a8d840127c
bob
e91e6348157868de9dd8b25c81aebfb9

## Attacking Password Hashes

- Problem: users choose poor passwords
- Most common passwords: 123456, password
- Username: cbw, Password: cbw
- Common password patterns
- Weak passwords enable dictionary attacks

> Default passwords (password, default, admin, guest etc) if not changed can be a security hazard.

## Most Common passwords

- Most common passwords unscrambled from the 2012 leaked LinkedIn.com dataset as of 2016 (in 1,000s)

https://www.statista.com/statistics/271098/most-common-passwords/ co tate unvencivy


## Dictionary Attacks



- Common for 60-70\% of hashed passwords to be cracked in <24 hours


## Hardening Password Hashes

- Key problem: cryptographic hashes are deterministic
- hash('p4ssw0rd') = hash('p4sswOrd')
- This enables attackers to build lists of hashes
- Solution: make each password hash unique
- Add a salt to each password before hashing
- hash(salt + password) = password hash
- Each user has a unique, random salt
- Salts can be stores in plain text


## Example Salted Hashes

## hashed_password.txt

| cbw | 2a9d119df47ff993b662a8ef36f9ea20 |
| :--- | :--- |
| sandi | 23eb06699da16a3ee5003e5f4636e79f |
| amislove | 98bd0ebb3c3ec3fbe21269a8d840127c |
| bob | e91e6348157868de9dd8b25c81aebfb9 |

hashed_and_salted_password.txt
cbw
sandi OX
amislove
bob
a8
hz
K@
af19c842f0c781ad726de7aba439b033
67710c2c2797441efb8501f063d42fb6 9d03e1f28d39ab373c59c7bb338d0095
479a6d9e59707af4bb2c618fed89c245

## Attacking Salted Passwords



## Breaking Hashed Passwords

- Stored passwords should always be salted
- Forces the attacker to brute-force each password individually
- Problem: it is now possible to compute cryptographic hashes very quickly
- GPU computing: hundreds of small CPU cores
- nVidia GeForce GTX Titan Z: 5,760 cores
- GPUs can be rented from the cloud very cheaply
- $2 x$ GPUs for $\$ 0.65$ per hour (2014 prices)


## Examples of Hashing Speed

- A modern x86 server can hash all possible 6 character long passwords in 3.5 hours
- Upper and lowercase letters, numbers, symbols
$-(26+26+10+32)^{6}=690$ billion combinations
- A modern GPU can do the same thing in 16 minutes
- Most users use (slightly permuted) dictionary words, no symbols
- Predictability makes cracking much faster
- Lowercase + numbers $\rightarrow(26+10)^{6}=2 B$ combinations


## Hardening Salted Passwords

- Problem: typical hashing algorithms are too fast
- Enables GPUs to brute-force passwords
- Solution: use hash functions that are designed to be slow
- Examples: bcrypt, scrypt, PBKDF2
- These algorithms include a work factor that increases the time complexity of the calculation
- scrypt also requires a large amount of memory to compute, further complicating brute-force attacks


## bcrypt Example

- Python example; install the bcrypt package
[cbw@ativ9 ~] python >>> import bcrypt
>>> password = "my super secret password"
>>> fast_hashed = bcrypt.hashpw(password, bcrypt.gensalt(0))
>>> slow_hashed = bcrypt.hashpw(password, bcrypt.gensalt(12))
>>>pw_from_user = raw_input("Enter your password:")
>>> if bcrypt.hashpw(pw_from_user, slow_hashed) == slow_hashed: print "It matches! You may enter the system" else:
print "No match. You may not proceed"


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## Password Storage Summary

1. Never store passwords in plain text
2. Always salt and hash passwords before storing them
3. Use hash functions with a high work factor

- These rules apply to any system that needs to authenticate users
- Operating systems, websites, etc.


## Password Recovery/Reset

- Problem: hashed passwords cannot be recovered

- This is why systems typically implement password reset
- Use out-of-band info to authenticate the user
- Overwrite hash(old_pw) with hash(new_pw)
- Be careful: its possible to crack password reset


## Password crackers

## Forgotten passwords

- Too many passwords to remember
- "Strong" passwords can be hard to remember
- Traditional approach: user physically requests password reset
- Using phone numbers or email addresses on record
- Showing IDs
- Danger: fraudulently obtaining password using social engineering. May represent the weakest link in the password system.


## Good passwords are bad



| ~ 28 BITS Of ENTROP |  |
| :---: | :---: |
|  |  |
| 口 |  |
| - |  |
| $22^{29}=3$ DA 1000 GUESSES | /SEC $A T$ |
|  |  |
| $E$ |  |

WAS IT TROMBONE? NO, TROUBADOR. AND ONE OF THE OS WAS A ZERD? AND THERE WAS SOME SYMBOL...


DIFFICULTY TO REMEMBER: HARD

~44 BITS OF ENTROPY
a
a
$2^{44}=550$ YEARS AT
1000 GUESSES/SEC
DIFFICULTY TO GUESS:
HARD


THROUGH 20 YEARS OF EFFORT, WE'VE SUCCESSFULLY TRAINED EVERYONE TO USE PASSWORDS THIRT ARE HARD FOR HUMANS TO REMEMBER, BUT EASY FOR COMPUTERS TO GUESS.

## Security Questions

- Security Questions are used to authenticate when
- Suspicious attempts
- Forgotten passwords
- 33-39\% may be guessed by family members. Friends or those with access to personal information
- $20 \%$ of users could not remember their own answers.
- Possible solution: Multiple questions with a minimum threshold of right answers


## Multifactor Authentication

- Smartphone with number xxx-xxx-xxxx: one in $10^{10}$
- About 33 bits of entropy
- Fingerprints might be unique. However information my be lost when 25-80 minutiae are used for comparison. Uniqueness still being researched.
- Face recognition: 97.25\% accuracy?


## Password managers

- Can record username, password, form information etc. for automatic filling.
- Locally on a device
- On the web
- Can generate good passwords
- The master password may be kept locally. If you forget it, you may have to extract it yourself.
- Some browsers may include password management capabilities
- Can protect against keyloggers

Disadvantages:

- May have vulnerabilities
- May be blocked by some websites

