CS 3650 Computer Systems – Summer 2025

Security

Unit 14



* Acknowledgements: created based on Christo Wilson's lecture slides for the same course.

- Authentication
- Access Control



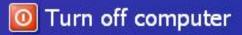


To begin, click your user name



Administrator

 \rightarrow



After you log on, you can add or change accounts. Just go to Control Panel and click User Accounts.

Authentication

- Authentication is the process of verifying an actor's identity
- Critical for security of systems
 - Permissions, capabilities, and access control are all contingent upon knowing the identity of the actor
- Typically parameterized as a username and a secret
 - The secret attempts to limit unauthorized access



Types of Secrets

- Actors provide their secret to log-in to a system
- Three classes of secrets:
 - 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



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Checking Passwords

- The system must validate passwords provided by users
- Thus, passwords must be stored somewhere
- Basic storage: plain text



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

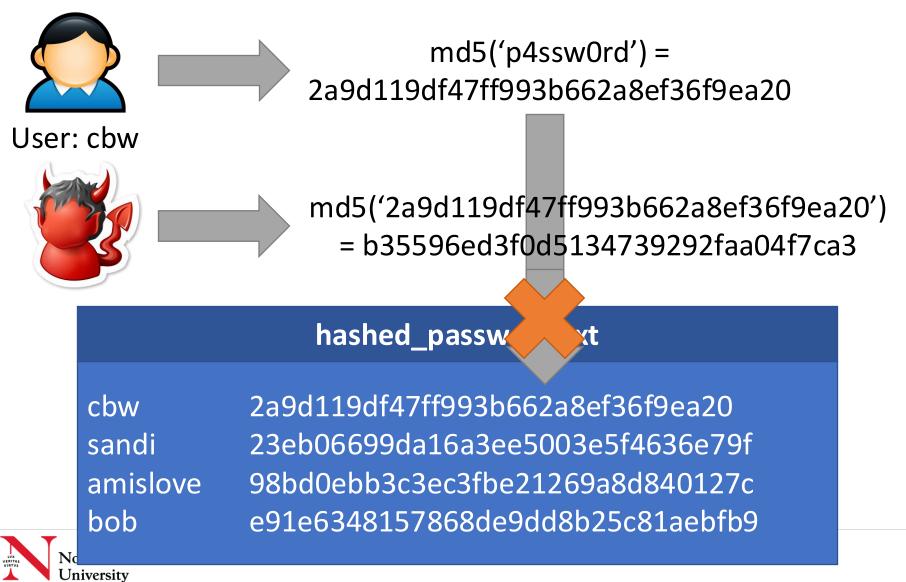


Hashed Passwords

- 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)
 - High entropy:
 - md5('security') = e91e6348157868de9dd8b25c81aebfb9
 - md5('security1') = 8632c375e9eba096df51844a5a43ae93
 - md5('Security') = 2fae32629d4ef4fc6341f1751b405e45
 - Collision resistant
 - Locating A' such that hash(A) = hash(A') takes a long time
 - Example: 2²¹ tries for md5



Hashed Password Example

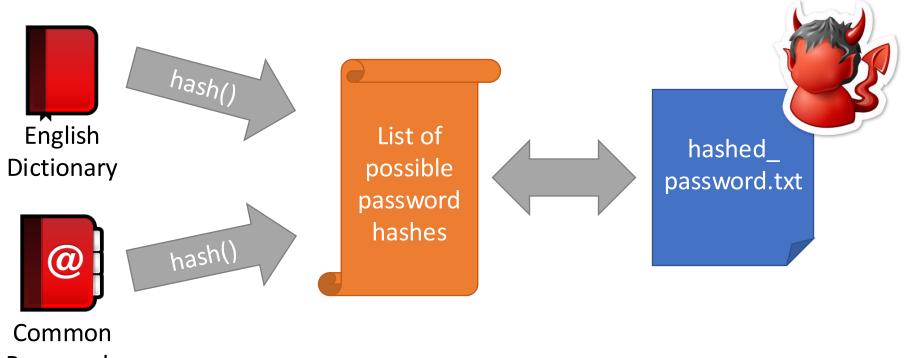


Attacking Password Hashes

- Recall: cryptographic hashes are collision resistant
 - Locating A' such that hash(A) = hash(A') takes a very long time
- Are hashed password secure from cracking?
 - No!
- Problem: users choose poor passwords
 - Most common passwords: 123456, password
 - Username: cbw, Password: cbw
- Weak passwords enable dictionary attacks



Dictionary Attacks



Passwords

 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('p4ssw0rd')
 - 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

a8

0X

hz

K@

hashed_password.txt

cbw	2a9d119df47ff993b662a8ef36f9ea20
sandi	23eb06699da16a3ee5003e5f4636e79f
amislove	98bd0ebb3c3ec3fbe21269a8d840127c
bob	e91e6348157868de9dd8b25c81aebfb9

hashe	ed and	salted	_password.txt

cbw sandi amislove bob af19c842f0c781ad726de7aba439b033 67710c2c2797441efb8501f063d42fb6 9d03e1f28d39ab373c59c7bb338d0095 479a6d9e59707af4bb2c618fed89c245



Password Storage on Linux

/etc/passwd

username:x:UID:GID:full_name:home_directory:shell

cbw:x:1001:1000:Christo Wilson:/home/cbw/:/bin/bash amislove:1002:2000:Alan Mislove:/home/amislove/:/bin/sh

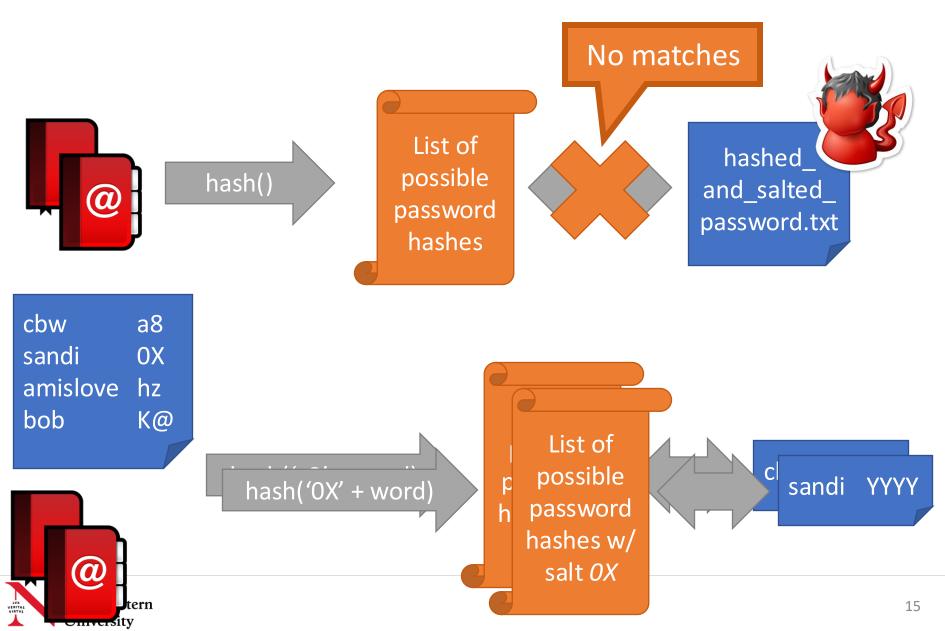
First two characters are the salt

/etc/shadow

ame:password:last:may:must:warn:expire:disable:reserved

cbw:a8ge08pfz4wuk:9479:0:10000:::: amislove:hz560s9vnalh1:8172:0:10000::::

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
 - 2x GPUs for \$0.65 per hour (2014 prices)



Examples of Hashing Speed (2014)

- 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 = 2B combinations



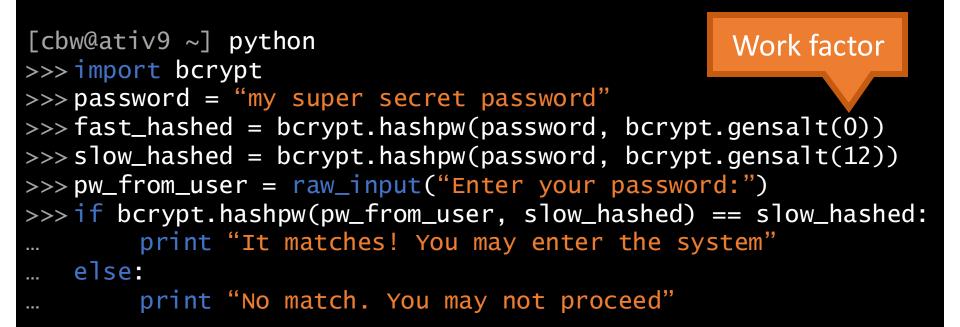
Hardening Salted Passwords

- 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





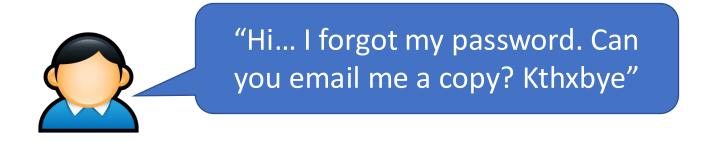
Password Storage Summary

- **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)



- Authentication
- Access Control



Status Check

- At this point, we can authenticate users
 - And we are securely storing their password
- How do we control what users can do, and what they can access?



Simple Access Control

- Basic security in an OS is based on access control
- Simple policies can be written as an access control matrix
 - Specifies actions that actors can take on objects
 - Unix actions: read, write and execute
 - For directories, $x \rightarrow$ traverse

	file 1	file 2	dir 1	file 3
user 1		r		rw-
user 2	r	r	rwx	r
user 3	r	r		
user 4	rw-	rwx		

Users and Groups on Unix

- Actors are users, each user has a unique ID
 - Users also belong to >=1 groups

/etc/passwd

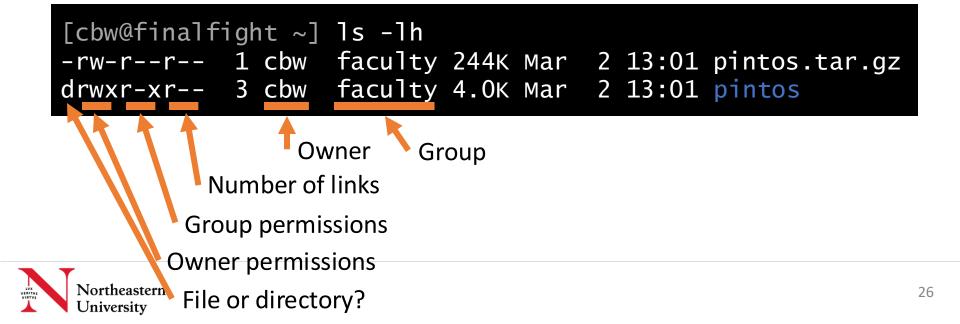
cbw:x:13273:65100:Christo Wilson:/home/cbw/:/bin/bash

[cbw@finalfight ~] id cbw uid=13273(cbw) gid=65100(faculty) groups=65100(faculty), 1314(cs5700f13),1316(cs5750f13),1328(cs5600sp13)



File Permissions on Unix

- Files and directories have an owner and a group
- Three sets of permissions:
 - 1. For the owner
 - 2. For members of the group
 - 3. For everybody else (other)



Permission Examples

[cbw@finalfight ~] ls -lh -rw-r--r-- 1 cbw faculty 244K Mar 2 13:01 pintos.tar.gz drwxr-xr-- 3 cbw faculty 4.0K Mar 2 13:01 pintos

cbw:faculty

- May read both objects
- May modify the file
- May not execute the file
- May enter the directory
- May add files to the directory
- May modify the permissions of both objects

Northeastern

University

amislove:faculty

- May read both objects
- May not modify the file
- May not execute the file
- May enter the directory
- May not add files to the directory
- May not modify permissions

bob:student

- May read both objects
- May not modify the file
- May not execute the file
- May not enter the directory
- May not add files to the directory
- May not modify permissions

Modifying Permissions

u – user g – group o - other

+ add permissions- remove permissions= set permissions

r – read w – write x - executable

```
[cbw@finalfight ~] ls lh
-rw----- 1 amislove ticul 5.1K an 23 11:25 alans_file
-rw----- 4 cbw facilt 3 JK Jan 23 11:25 christos_file
[cbw@finalfight ~] chmod ugo+rw alans_file
chmod: changing permissions of `alans_file': Operation not permitted
[cbw@finalfight ~] chmod go+r christos_file
[cbw@finalfight ~] chmod u+w christos_file
[cbw@finalfight ~] chmod u-r christos_file
[cbw@finalfight ~] ls -lh
-rw----- 1 amislove faculty 5.1K Jan 23 11:25 alans_file
--wxr--r-- 4 cbw faculty 3.5K Jan 23 11:25 christos_file
```



Modifying Users and Groups

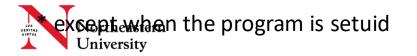
```
[cbw@finalfight ~] id cbw
uid=13273(cbw) gid=65100(faculty) groups=65100(faculty),
1314(cs5700f13),1316(cs5750f13),1328(cs5600sp13)
[cbw@finalfight ~] ls -lh
-rw----- 4 cbw faculty 3.5K Jan 23 11:25 christos_file
[cbw@finalfight ~] chown cbw:cs5600sp13 christos_file
[cbw@finalfight ~] ls -lh
-rw----- 4 cbw cs5600sp13 3.5K Jan 23 11:25 christos_file
```

- Users may not change the owner of a file*
 - Even if they own it
- Users may only change to a group they belong to



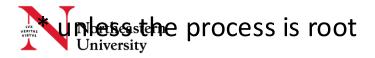
Permissions of Processes

- Processes also have permissions
 - They have to, since they read files, etc.
- What is the user:group of a process?
 - 1. The user:group of the executable file?
 - 2. The user:group of the user running the process?
- Processes inherit the credentials of the user who runs_{*}them
 - Child processes inherit their parent's credentials



Privileged Operations

- Other aspects of the OS may also require special privileges
- Fortunately, on Unix most aspects of the system are represented as files
 - E.g. /dev contains devices like disks
 - Formatting a disk requires permissions to /dev/sd*
- Processes may only signal other processes with the same user ID*
 - Otherwise, you could send SIGKILL to other user's processes



The Exception to Every Rule

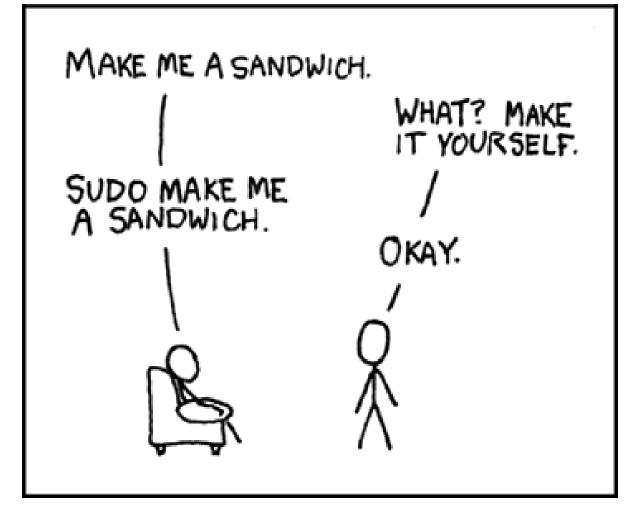
- On Unix, the root user (ID=0) can do whatever it wants
 - Access any file
 - Change any permission
- On Windows, called the Administrator account
- Your everyday user account should never be Admin/root



Ways to Access Root

- Suppose you need to run a privileged command
 - Example: \$ *apt-get install python*
- How can you get root privileges?
 - 1. Log in as root
 - \$ ssh root@mymachine.ccs.neu.edu
 - 2. The Switch User command (su)
 - \$ su
 - Opens a new shell with as root:root
 - 3. The Switch User Do Command (sudo)
 - \$ sudo apt-get install python
 - Runs the given command as root:root







Set Effective User ID

- In some cases, you may need a program to run as the file owner, not the invoking user
- Imagine a command-line guessing game
 - Users may input numbers as guesses
 - The user should not be able to read the file with the correct answers
 - Program must check if guesses are correct
 - The program must be able to read the file with correct answers



setuid example

Game executable is setuid

[cbw@finalfight game] ls -lh -rw----- 1 amislove faculty 180 Jan 23 11:25 secrets.txt -rwsr-sr-x 4 amislove faculty 8.5K Jan 23 11:25 guessinggame [cbw@finalfight game] cat secrets.txt cat: secrets.txt: Permission denied [cbw@finalfight game] ./guessinggame 4 8 15 16 23 42 Sorry, none of those number are correct :([cbw@finalfight game] ./guessinggame 37 Correct, 37 is one of the hidden numbers!



How to setuid

[cbw@finalfight tmp] gcc -o my_program my_program.c [cbw@finalfight tmp] ls -lh -rwxr-xr-x 1 cbw faculty 2.3K Jan 23 11:25 my_program [cbw@finalfight tmp] chmod u+s my_program [cbw@finalfight tmp] ls -lh -rwsr-xr-x 1 cbw faculty 2.3K Jan 23 11:25 my_program

- Be very careful with setuid
 - You are giving other users the ability to run a program as you, with your privileges
- Programs that are setuid=root should drop privileges
 - Google "setuid demystified" for more info



setuid and scripts

Cbwermannight cmpj

ortheastern

niversitv

IcbThis is known as a TOCTOU vulnerability:
Time-Of-Check, Time-of-Use

1:25 server.py

- Steps to run a setuid script
 - 1. Kernel checks setuid bit of the script
 - 2. Kernel loads the interpreter (i.e. python) with setuid permissions

Replace server.py with modified, evil script

- 3. Interpreter executes the script
- Never set a script as setuid

Limitations of the Unix Model

- The Unix model is very simple
 - Users and groups, read/write/execute
- Not all possible policies can be encoded

	file 1	file 2
user 1		rw-
user 2	r	r
user 3	rw-	rwx
user 4	rw-	

- file 1: two users have high privileges
 - If user 3 and user 4 are in a group, how to give user 2 read and user 1 nothing?
- file 2: four distinct privilege levels

Maximum of three levels (user, group, other)

Access Control Lists

- ACLs are explicit rules that grant or deny permissions to users and groups
 - Typically associated with files as meta-data

	file 1	file 2
user 1		rw-
user 2	r	r
user 3	rw-	rwx
user 4	rw-	

• file 1: own	er = user 4,
group = {u	ser 4, user 3}
owner: rw-	group: rw-
user 2: r	other:

file 2: owner = user 3, group = {user 3, user 1}
 owner: rwx group: rw Nerser 2: r-- other: ---

More ACLs

OSX and some versions of Linux also support ACLs

	sandwich.png	Propertie	es	
General Security	Details			
Object name:	D:\Classes\5600\a	ssets∖sandwi	ch.png	
Group or user n				
	d Users			
 SYSTEM Administrator Users (ativ9) 	rs (ativ9\Administrato	ors)		
To change perm	nissions, click Edit.		Edit	
Permissions for Users	Authenticated	Allov	w Deny	
Full control				
Modify		\checkmark		
Read & execu	ute	\checkmark		
Read		\checkmark		
Write		\checkmark		
Special permi	issions			
For special perr click Advanced.	nissions or advance	d settings,	Advanced	
	ОК	Cancel	Арр	ly



API Permissions

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Messenger

Do you want to install this application?

Allow this application to:

- Your personal information read call log, read your contacts, read your own contact card
- Services that cost you money directly call phone numbers, send SMS messages
- Your location

approximate (network-based) location, precise (GPS) location

Your messages

edit your text messages (SMS or MMS), read your text messages (SMS or MMS), receive text messages (MMS), receive text messages (SMS)

- Network communication full network access
- Storage

Cancel

University

modify or delete the contents of your USB storage

- On Android, apps need permission to access some sensitive API calls
- Android is based on Linux
- Behind the scenes, each app is given its own user and group
- Kernel enforces permission checks when system calls are made

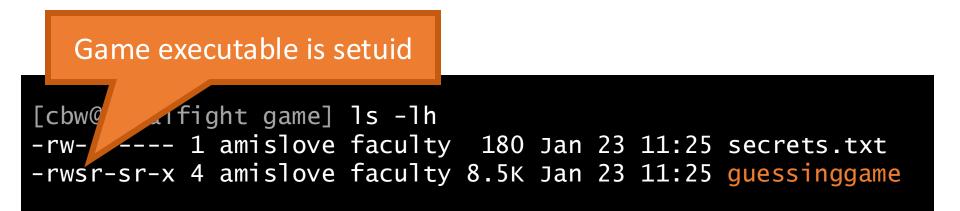
Exploits and Exploit Prevention



- Basic Program Exploitation
- Protecting the Stack
- Advanced Program Exploitation
- Defenses Against ROP



Setting the Stage



- Suppose I really want to see the secret answers
 - But I'm not willing to play the game
- How can I run arbitrary code as amislove?
 - If I could run code as amislove, I could read secrets.txt
 - Example: execvp("/bin/sh", 0);



Looking for Vulnerabilities

• Code snippet for *guessinggame*

```
char buf[8];
for (int x = 1; x < argc; ++x) {
   strcpy(buf, argv[x]);
   num = atoi(buf);
   check_for_secret(num);
}
         Stack buffer overflow
```



Confirmation

(gdb) bt

```
#1 0x41414141414141 in ?? ()
```

```
#2 0x41414141414141 in ?? ()
```

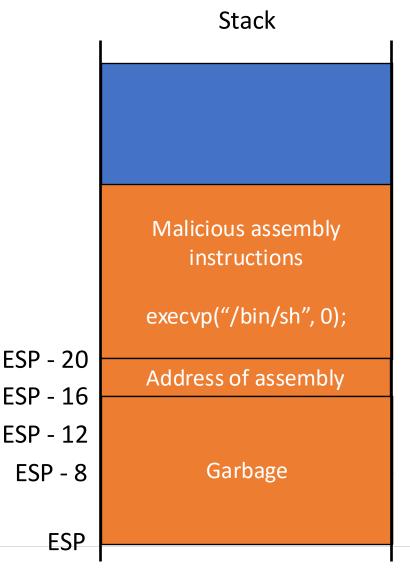
```
#3 0x41414141414141 in ?? ()
```

```
#4 0x0000041414141 in <u>?? ()</u>
```



Exploiting Stack Buffer Overflows

- Preconditions for a successful exploit
- Overflow is able to overwrite the return address
- 2. Contents of the buffer are under the attackers control





Exploitation, Try #1

[cbw@finalfight game] ./guessinggame [16-bytes of garbage][4-byte stack pointer][evil shellcode assembly] Segmentation fault (core dumped)

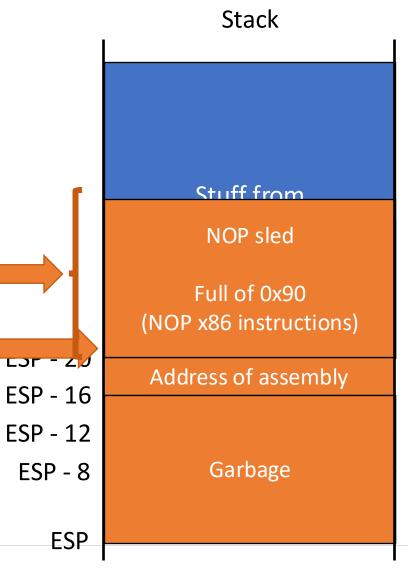
This is not what we want :(

- Problem: how do you know the address of the shellcode on the stack?
 - To execute the shellcode, you have to return to its exact start address
 - This is a small target



NOP Sled

- To execute the shellcode, you have to return to its exact start address
- You can increase the size of the target using a NOP sled (a.k.a. slide, ramp)





./guessinggame ran the shellcode, turned into /bin/sh

> age][4 byte stack pointer][2048 bytes of 0x90][evil ellcode assembly]

- There is a lot more to writing a successful exploits
 - Depending on the type of flaw, compiler countermeasures, and OS countermeasures
 - If you like this stuff, take a security course



g

y, \$

Types of Exploitable Flaws

- Stack overflow
- Heap overflow char * buf = malloc(100); strcpy(buf, argv[1]);
- Double free free(buf); free(buf);

- Format string printf(argv[1]);
- Off-by-one

 int vectors[100];
 for (i = 0; i <= 100; i++)
 vector[i] = x;
- ... and many more



Triggering Exploitable Flaws

- Local vulnerabilities:
 - Command line arguments
 - Environment variables
 - Data read from a file
 - Date from shared memory or pipes
- Remote vulnerabilities
 - Data read from a socket
- Basically, any place where an attacker can give input to your process

Attacker can inject code into your machine via the Internet



Leveraging an Exploit

- After a successful exploit, what can the attacker do?
 - Anything the exploited process could do
 - The shellcode has full API access
- Typical shellcode payload is to open a shell
 - Remote exploit: open a shell and bind STDIN/STDOUT to a socket (remote shell)
- If process is uid=root or setuid=root, exploitation results in privilege escalation
- If the process is the kernel, the exploit also results in privilege escalation



Basic Program Exploitation

- Protecting the Stack
- Advanced Program Exploitation
- Defenses Against ROP



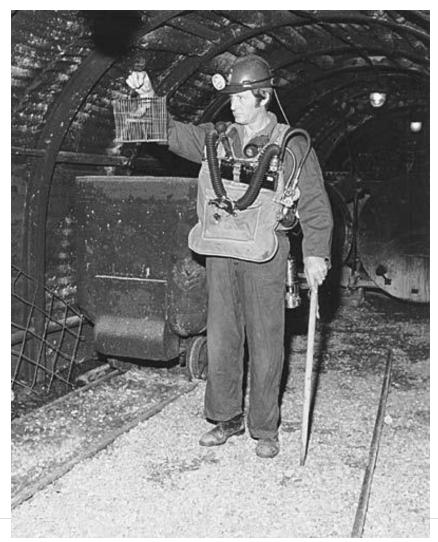
Defending Against Stack Exploits

- Exploits leverage programmer bugs
 - Programmers are never going to write code that is 100% bug-free
- What can the system do to help prevent processes from being exploited?
- Mechanisms that prevent stack-based exploits
 - Stack canaries
 - Non-executable stack pages (NX-bit)



The Canary in the Coal Mine

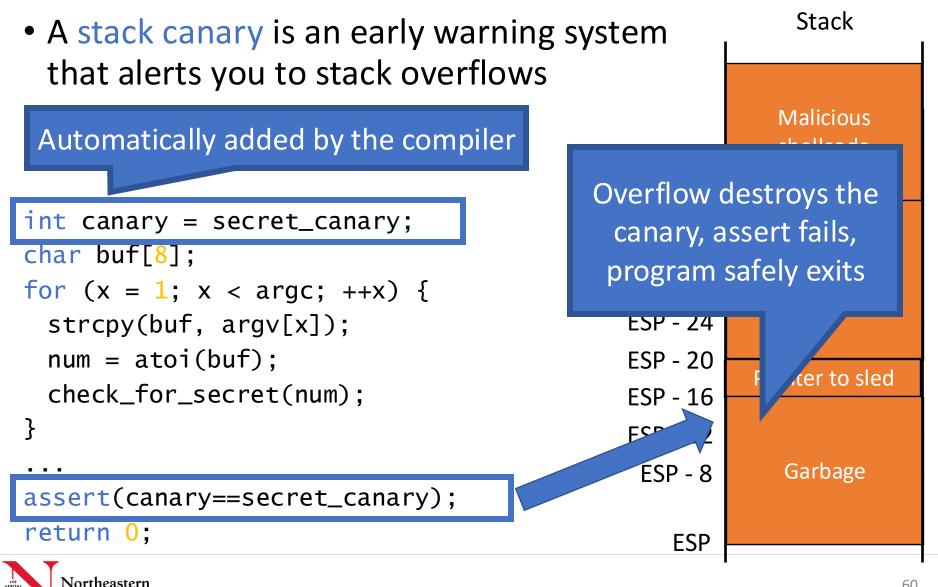
- Miners used to take canaries down into mines
- The birds are very sensitive to poisonous gases
- If the bird dies, it means something is very wrong!
- The bird is an early warning system





Stack Canaries

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Canary Implementation

- Canary code and data are inserted by the compiler
 - gcc supports canaries
 - Disable using the –fno-stack-protector argument
- Canary secret must be random
 - Otherwise the attacker could guess it
- Canary secret is stored on its own page at semi-random location in virtual memory
 - Makes it difficult to locate and read from memory

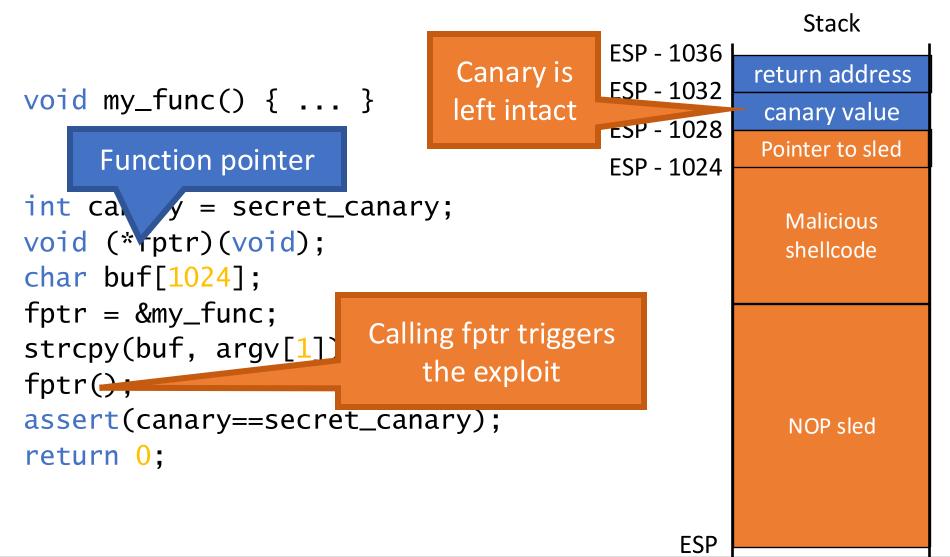


Canaries in Action

- Note: canaries do not prevent the buffer overflow
- The canary prevents the overflow from being exploited



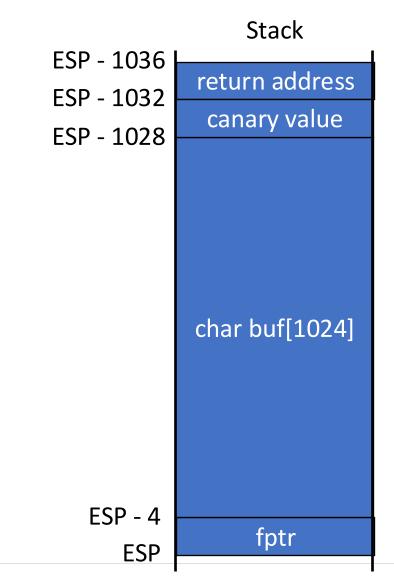
When Canaries Fail





ProPolice Compiler

- Security oriented compiler technique
- Attempts to place arrays above other local variables on the stack
- Integrated into gcc





When ProPolice Fails

```
void my_func() { ... }
```

```
struct my_stuff {
   void (*fptr)(void);
   char buf[1024];
}
```

```
};
```

```
int canary = secret_canary;
struct my_stuff stuff;
stuff.fptr = &my_func;
strcpy(stuff.buf, argv[1]);
stuff.fptr();
assert(canary==secret_canary);
return 0;
```

• The C specification states that the fields of a struct cannot be reordered by the compiler



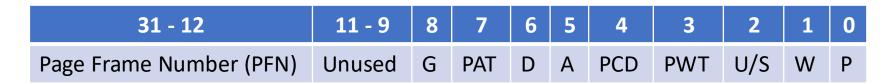
Non-Executable Stack

- Problem: compiler techniques cannot prevent all stack-based exploits
- Key insight: many exploits require placing code in the stack and executing it
 - Code doesn't typically go on stack pages
- Solution: make stack pages non-executable
 - Compiler marks stack segment as non-executable
 - Loader sets the corresponding page as non-executable



x86 Page Table Entry, Again

• On x86, page table entries (PTE) are 4 bytes



- W bit determines writeable status
- ... but there is no bit for executable/non-executable
- On x86-64, the most significant bit of each PTE (bit 63) determines if a page is executable
 - AMD calls it the NX bit: No-eXecute
 - Intel calls it the XD bit: eXecute Disable

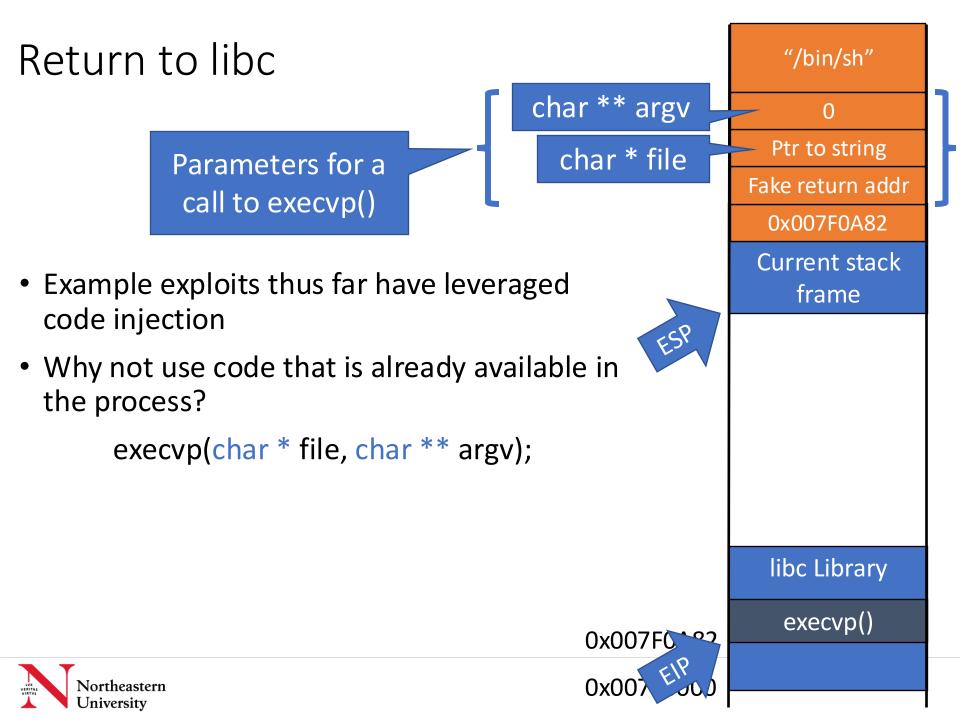
When NX bits Fail

- NX prevents shellcode from being placed on the stack
 - NX must be enabled by the process
 - NX must be supported by the OS
- Can exploit writers get around NX?
 - Of course ;)
 - Return-to-libc
 - Return-oriented programming (ROP)



- Basic Program Exploitation
- Protecting the Stack
- Advanced Program Exploitation
- Defenses Against ROP





Stack Control = Program Control

- Return to libc works by crafting special stack frames and using existing library code
 - No need to inject code, just data onto the stack
- Return-oriented programming (ROP) is a generalization of return to libc
 - Why only jump to existing functions?
 - You can jump to code **anywhere** in the program
 - Gadgets are snippets of assembly that form a Turing complete language
 - Gadgets + control of the stack = arbitrary code execution power



- Basic Program Exploitation
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Defending Against Return to libc

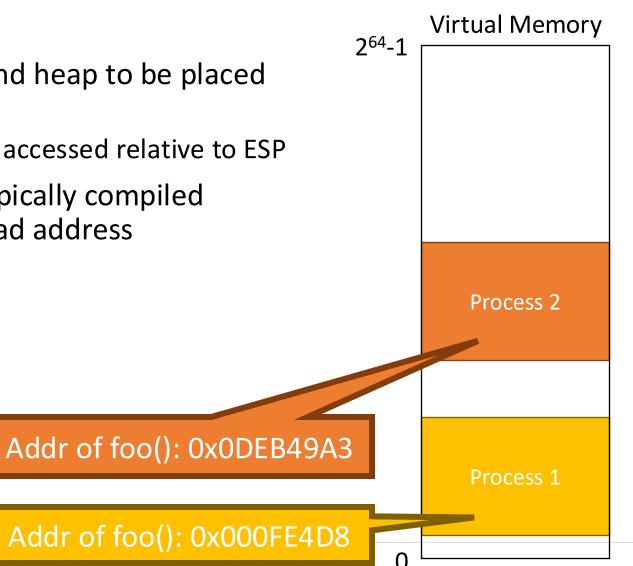
- Return to libc and ROP work by repeatedly returning to known pieces of code
 - This assumes the attacker knows the addresses of this code in memory
- Key idea: place code and data at **random** places in memory
 - Address Space Layout Randomization (ASLR)
 - Supported by all modern OSes

2 ⁶⁴ -1	Virtual Memory
	Stack
	Stack
	S таск
	Неар
	псар
	Code
	Code
	COUR
0	



Randomizing Code Placement

- It's okay for stack and heap to be placed randomly
 - Example: stack is accessed relative to ESP
- Problem: code is typically compiled assuming a fixed load address





Position Independent Code Example

 \frown

- Modern compil (PIC)
 - Also called P

- e8 is the opcode for a **relative** function call
- Address is calculated as EIP + given value
- Example: 0x4004c7 + 0xffffffe8 = 0x4004af

int global_var = 20;

```
int func() { return 30; }
```

int main() {
 int x = func();
 global_var = 10;
 return 0;

Jniversitv

```
Global data is accessed relative to EIP
```

4004bf:		p
4004c0:	4 8 9 e5	ebp, esp
4004c3·	48 83 ec 10	o esp 0x10
4004c7:	e8 e8 ff ff ff	call 4004b4 <func></func>
4004cc:	89 45 fc	mov [ebp-0x4], eax
4004cf:	c7 05 3f 0b 20 00	10 mov [eip+0x200b3f], 0x10
4004d6:	00 00 00	
4004d9:	b8 00 00 00 00	mov eax, 0x0
4004de:	c9	leave
4004df:	c3	ret 75

Tradeoffs with PIC/PIE

- Pro
 - Enables the OS to place the code and data segments at a random place in memory (ASLR)
- Con
 - Code is slightly less efficient
 - Some addresses must be calculated
- In general, the security benefits of ASLR far outweigh the cost



When ASLR Fails

- ASLR is much less effective on 32-bit architectures
 - Less ability to move pages around randomly
 - May allow the attacker to brute-force the exploit
- Use a huge NOP sled
 - If the sled is enormous, even a random jump will hit it
- Use heap spraying
 - Technique that creates many, many, many copies of shellcode in memory
 - Attempts to fill all available heap memory
 - Jump to a random address is likely to hit a copy



Exploitation Prevention Wrap-up

- Modern OSes and compilers implement many strategies to prevent exploitation
 - More advanced techniques exist and are under development
- Exploitation strategies are also becoming more sophisticated
 - Just scratched the surface of attack strategies
- Bottom line: don't write buggy code
 - Compiler and OS techniques don't fix bugs, they just try to prevent exploitation
 - Even minor flaws can be exploited



Strategies for Writing Secure Code

- Assume all external data is under the control of an attacker
- Avoid unsafe library calls
 - strcpy(), memcpy(), gets(), etc.
 - Use bounded versions instead, i.e. strncpy()
- Use static analysis tools, e.g. Valgrind
- Use a fuzzer
 - Runs your program repeatedly with crafted inputs
 - Designed to trigger flaws
- Use security best-practices
 - Drop privileges, use chroot jails, etc.



- Basic Program Exploitation
- Protecting the Stack
- Advanced Program Exploitation
- Defenses Against ROP



Cybersecurity and Ethics

- Many laws govern cybersecurity
 - Designed to help prosecute criminals
 - Discourage destructive or fraudulent activities
- However, these laws are broad and often vague
 - Easy to violate these laws accidentally
 - Security professionals must be cautious and protect themselves

- Cybersecurity raises complex ethical questions
 - When and how to disclose vulnerabilities
 - How to handle leaked data
 - Line between observing and enabling crime
 - Balancing security vs. autonomy
- Ethical norms must be respected
 - Rights and expectations of individuals and companies
 - Community best-practices



Other Topics in Security

- Attacks we have not studied
- Secure Hardware Technologies (TPM, TXT)
- Distributed System Security and Resilience
- Cryptocurrencies and smart contracts
- Protocol Security (wireless, SDN)
- Privacy and regulations
- Post-quantum cryptography
- Program analysis, fuzzing, and software testing
- Formal verification
- Mobile and IoT security
- Machine Learning for Security
- Adversarial Machine Learning



Five Things to Remember



1) Be Morally Ambitious

- There are many tech jobs out there
- Do something meaningful
 - You'll have to work to find that thing

https://public-interest-tech.com/



2) Focus on the Problems

- You can't improve the world unless you are solving a problem
- Identifying the problem is the hard part
 - This is most of research
- Specific technologies are just means to an end, not an end themselves



3) Stay Optimistic

- A lot of uncertainty in the world right now
- Nonetheless, it is a time for hope and action
- Great progress only happens in times of great need

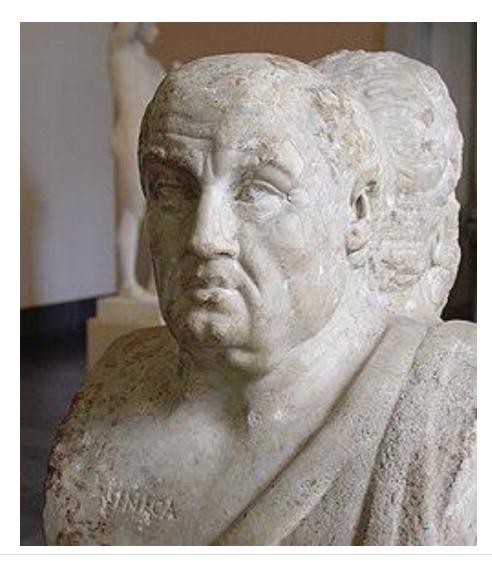


4) Time is Life

How you spend your time *is* your life

"The time that passes belongs to death."

-- Seneca

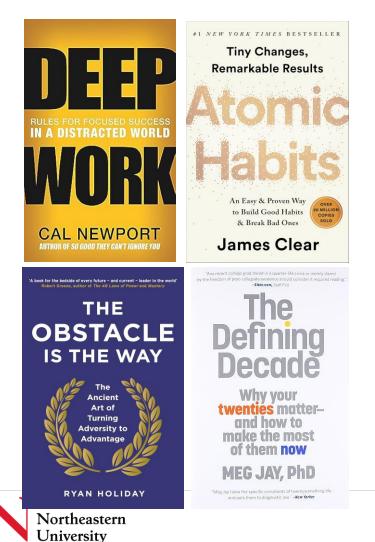




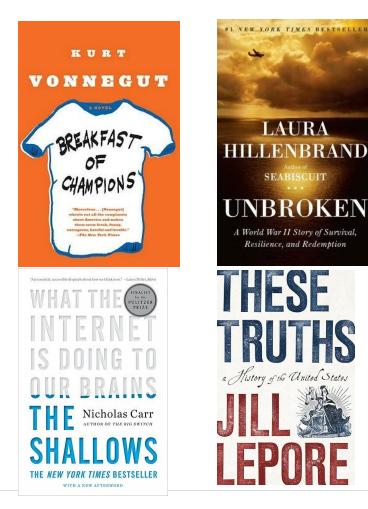
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5) Read Books

Productivity



Broadening Horizons



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