

Towards Protection, Detection, and Recovery from Windows-based Crypto Ransomware

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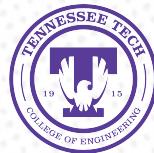
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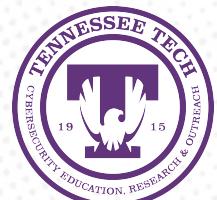


What is Ransomware?

- A type of malware that takes over the system by affecting the victim machine via email, remote desktop protocol, software vulnerability, etc.
- Mainly two kinds of ransomware –
 - Locker Ransomware
 - Crypto Ransomware

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Ransomware - An Ever Growing Menace (1/2)

- Fastest growing cybercrime
- From 2017 (US\$ 533m) to 2018 (US\$ 646m), ransomware attack has increased by 21% in the U.S. [a]
- Global ransomware damage predicted US\$ 20b in 2021. [b]
- A business will fall victim to a ransomware attack in every 11 seconds by 2021. [b]
- On average, a ransomware attack lasts for 7 days 8 hrs [c]
 - Causing extensive financial and reputational damage

[a] The Cost of Cybercrime by Accenture Security, published in 2019.

[b] 2019 Official Annual Cybercrime Report by Herjavec Group.

[c] Coveware's q1 ransomware marketplace report, published in 2019.

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Ransomware - An Ever Growing Menace (2/2)

Year	New Families
2016	247
2017	327
2018	222
2019 (Jan – Apr)	40

Source: "Narrowed Sights, Bigger Payoffs: Ransomware In 2019 - Security News - Trend Micro USA". 2020. TrendMicro.Com. Accessed April 6 2020
<https://www.trendmicro.com/vinfo/us/security/news/cybercrime-and-digital-threats/narrowed-sights-bigger-payoffs-ransomware-in-2019>

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Cryptographic Scheme Used in Ransomware

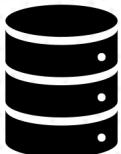
- Symmetric Encryption
 - AES is, for example, used for fast encryption of File System
- Asymmetric Encryption
 - RSA key pair is, for example, used for comparatively slower encryption of File System
- Hybrid Encryption Kolodenker et al. [2017]
 - Modern day ransomware authors use this scheme
 - Use of both asymmetric and symmetric encryption

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Hybrid Encryption



C&C Server



Victim Machine



RSA Key Pair



Session Key

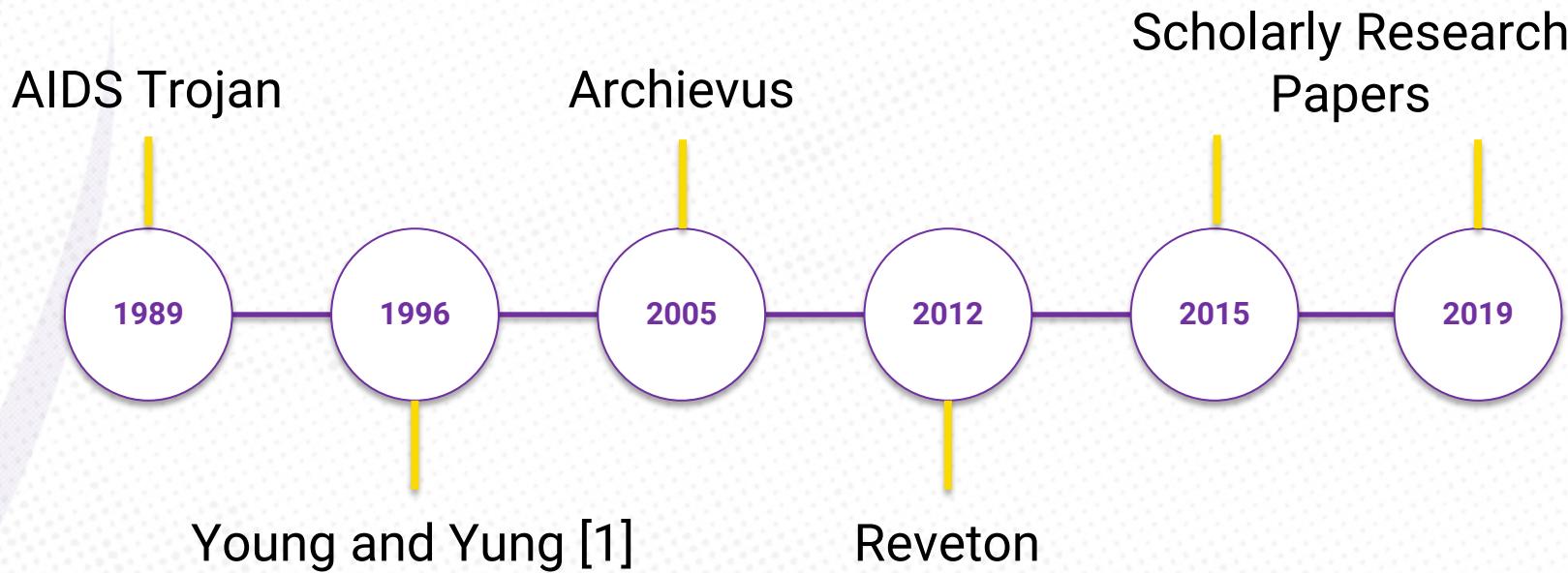


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Historical Timeline

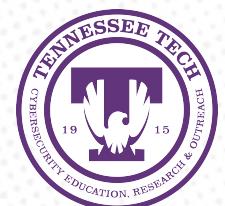


Preliminaries

- Methodologies for the prototype
 - I/O Request Packet (IRP) Logs: Default mechanism for requesting I/O operation
 - System calls: Request of service(s) from the kernel of the operating system it is executed on
 - File change: Computation of change of file w/ hash values
 - Decoy files: Honey files w/ user agreement
- Desired performance metrics
 - Data / File recovery and key recovery
 - Real-time detection
 - Isolating damage or terminate the malicious process

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State-of-the-Art Research (1/6)

Cutting the Gordian Knot: A Look Under the Hood of Ransomware Attacks

Amin Kharraz¹, William Robertson¹,
Davide Balzarotti³, Leyla Bilge⁴, and Engin Kirda^{1,2}

¹ Northeastern University, Boston, USA

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⁴ Symantec Research Labs, Sophia Antipolis, France

Venue: International Conference on Detection of Intrusions and Malware, and Vulnerability Assessment. Springer, 2015.

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State-of-the-Art Research (2/6)

- Explained how the core parts of ransomware engineered
 - Encryption mechanism
 - Deletion mechanism
 - Locking mechanism
- Proposed a general methodology to detect ransomware attacks w/o making any assumptions on how it affects user's file system
 - API Call Monitoring
 - Monitoring File System Activity
 - Using Decoy Resources

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State-of-the-Art Research (3/6)

UNVEIL: A Large-Scale, Automated Approach to Detecting Ransomware

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Engin Kirda

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Venue: 25th USENIX Security Symposium, 2016.

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State-of-the-Art Research (4/6)

ShieldFS: A Self-healing, Ransomware-aware Filesystem

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Federico Maggi
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DEIB, Politecnico di Milano, Milan, Italy

Venue: ACSAC (Annual Computer Security Applications Conference), 2016.

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State-of-the-Art Research (5/6)

Redemption: Real-time Protection Against Ransomware at End-Hosts

Amin Kharraz¹ and Engin Kirda¹
{mkharraz,ek}@ccs.neu.edu

Northeastern University, Boston, USA

Venue: RAID (International Symposium on Research in Attacks, Intrusions, and Defenses), 2017.

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State-of-the-Art Research (6/6)

RWGuard: A Real-Time Detection System Against Cryptographic Ransomware

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`{smehnaz, amudgeri, bertino}@purdue.edu`

Venue: RAID (International Symposium on Research in Attacks, Intrusions, and Defenses), 2018.

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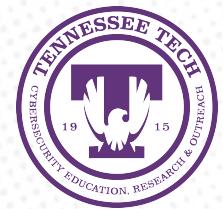


State-of-the-Art Research: Comparison

Prototype	IRP Logs	Sys Calls	File Change	Decoy Files	ML	File Rec	Key Rec	Real Det.	Isolatn	Data Sci.
RWGuard [2]										
Redemption [3]										
FlashGuard [4]										
PayBreak [5]										
CryptoDrop [6]										
EledeRan [7]										
Unveil [8]										
SheildFS [9]										

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Focus of Research

Machine Learning
for intelligent
detection

Data Science for
pattern or
sequence mining

Malware
Analysis

Intrusion Detection
System for
prevention

Parallel Processing
for faster
computation



Static Malware Analysis for Ransomware

- Limited work in this space for ransomware detection
- Analyze meta-data of the Portable Executable (PE) file of ransomware w/o executing it
 - Opcode sequence
 - Control flow graph
 - Function call graph
 - Machine activity
- Statistical / Characteristics analysis of the debugged code
 - # of jumps, # of bytes, etc.
- Natural language processing (NLP) based detection scheme

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Dynamic Malware Analysis for Ransomware

- I/O Request Packet (IRP) logs mining
 - Extract useful pieces of information
 - Find sequence mining and automate the process
- Analysis of Command and Control (C&C) server communication for network isolation
 - Combat ransomware w/ Network-based Intrusion Detection System (NIDS)
- Machine / Deep learning based detection schemes
 - Time interval analysis for early detection

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IRP Logs Mining for Ransomware Detection

- Goal: Detecting early sign of ransomware infection by performing post-analysis of affected system
- Twofold phases in this research project
 - Understanding the affected system through 386 ransomware samples' datasets
 - Applying acquired knowledge from the affected system to detect early ransomware behavior
- Mentor: Dr. Andrea Continella (Post-Doc, UCSB)
- Status: Work on progress; planning to submit in SecureComm 2020

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Binary Analysis for Ransomware Detection

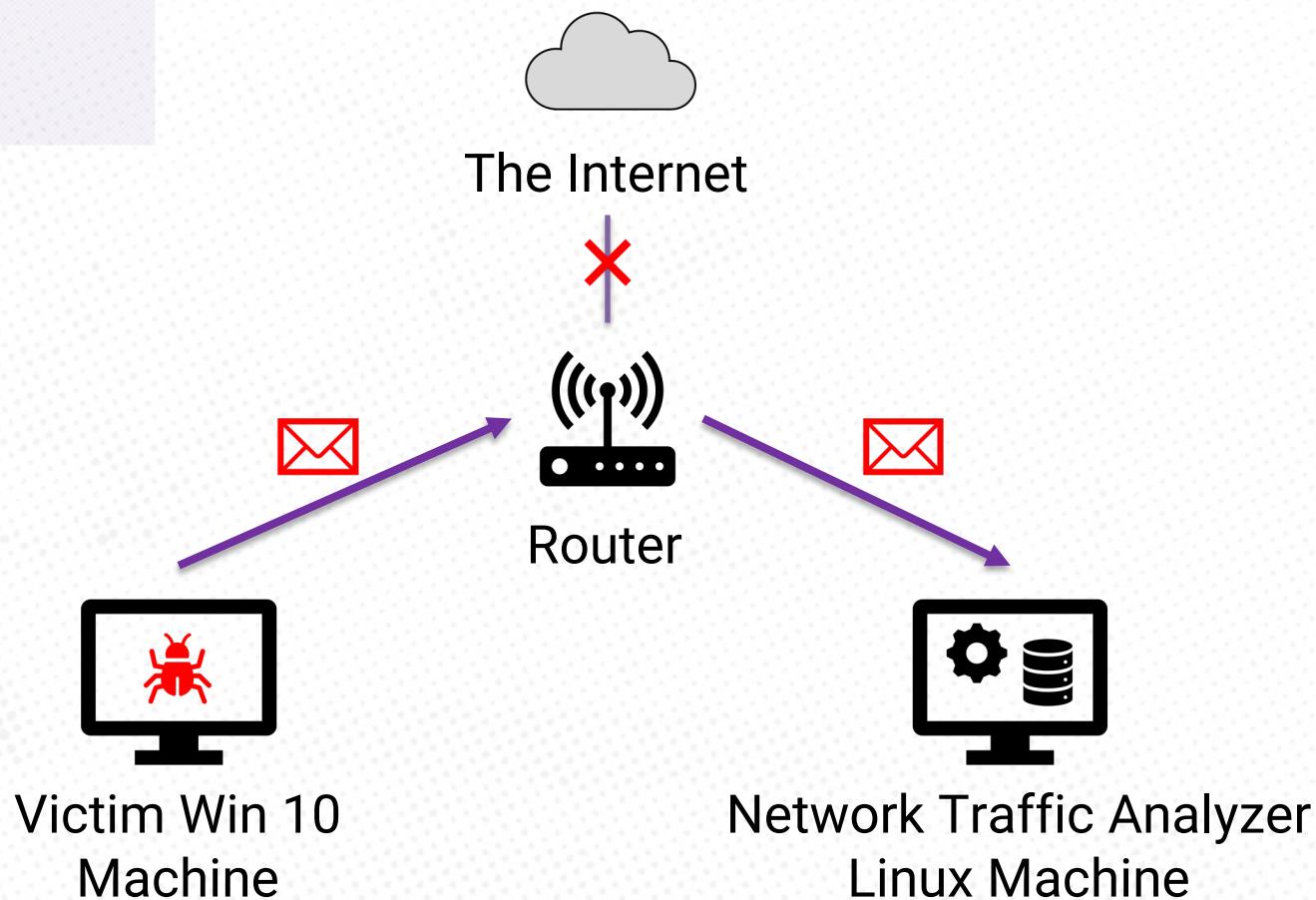
- Goal: Could we come up with a statistical set of attributes from the meta-data of the ransomware PE files to perform an efficient and unbiased detection?
- We have thus far parsed through approx. 450 ransomware samples to extract PE headers, along with other relevant piece of information.
- Mentor: Dr. Stacy Prowell (ORNL)
- Status: Work on progress

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Monitor Network Logs for Ransomware Analysis



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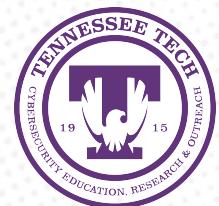


RWArmor: What is Our Plan?

- Devise an effective ransomware-aware solution based on the following attributes –
 - (Full) File recovery
 - Early detection
 - Taking back control of the affected system
 - Optimized solution: Less memory and computation overhead
 - Parallel computation
 - Kernel-level driver-based utility program
- Address “The Five Function” (NIST)
 - Identify, Protect, Detect, Respond, and Recover

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Summary

- Performed a detailed literature study to find research gaps in ransomware detection and create a bridge between academic and industry research
- Isolated promising avenues to do research on to make our study unique and impactful
- Designed the path towards the completion of Ph.D. program w/ goals and milestones along the way
- Mentored by the domain expert in every research project

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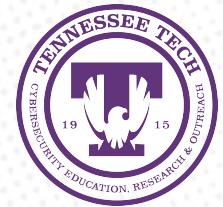


Aside from this Research Track

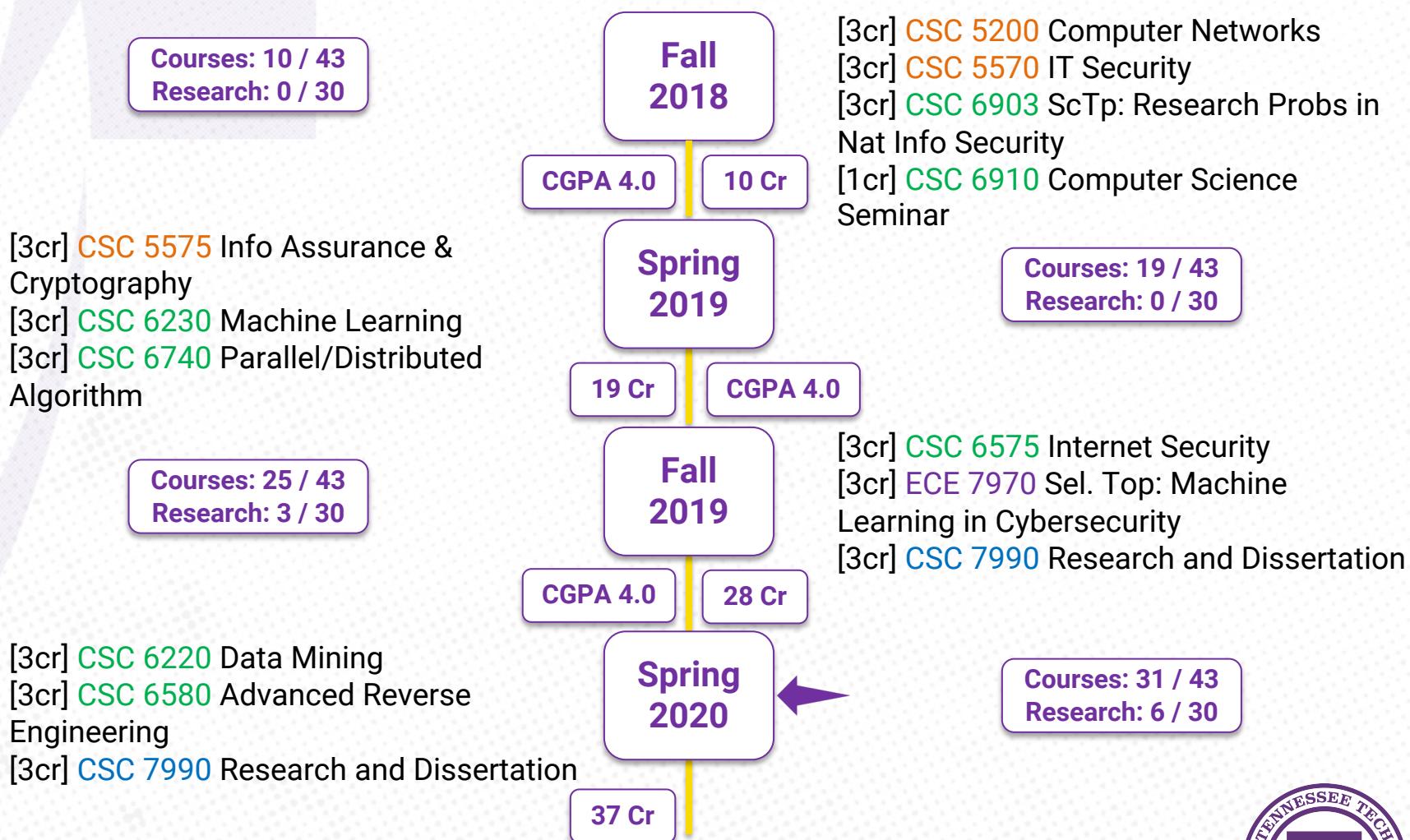
- **M. A. Ayub**, W. A. Johnson, D. A. Talbert, and A. Siraj, "Model Evasion Attack on Intrusion Detection Systems using Adversarial Machine Learning," IEEE 2020 52nd Annual Conference on Information Sciences and Systems (CISS).
- **M. A. Ayub**, Z. A. Onik, and S. Smith, "Parallelized RSA Algorithm: An Analysis with Performance Evaluation using OpenMP Library in High Performance Computing Environment," 2019 22nd International Conference of Computer and Information Technology (ICCIT), 18-20 December, 2019.
- **M. A. Ayub**, S. Smith, and A. Siraj, "A Protocol Independent Approach in Network Covert Channel Detection," 2019 IEEE International Conference on Computational Science and Engineering (CSE) and IEEE International Conference on Embedded and Ubiquitous Computing (EUC), New York, 2019, pp. 165-170.
- [Journal Review] **M. A. Ayub**, S. M. Smith, A. Siraj, and P. J. Tinker, "Towards Domain Generating Algorithm based Malicious Domains Detection."

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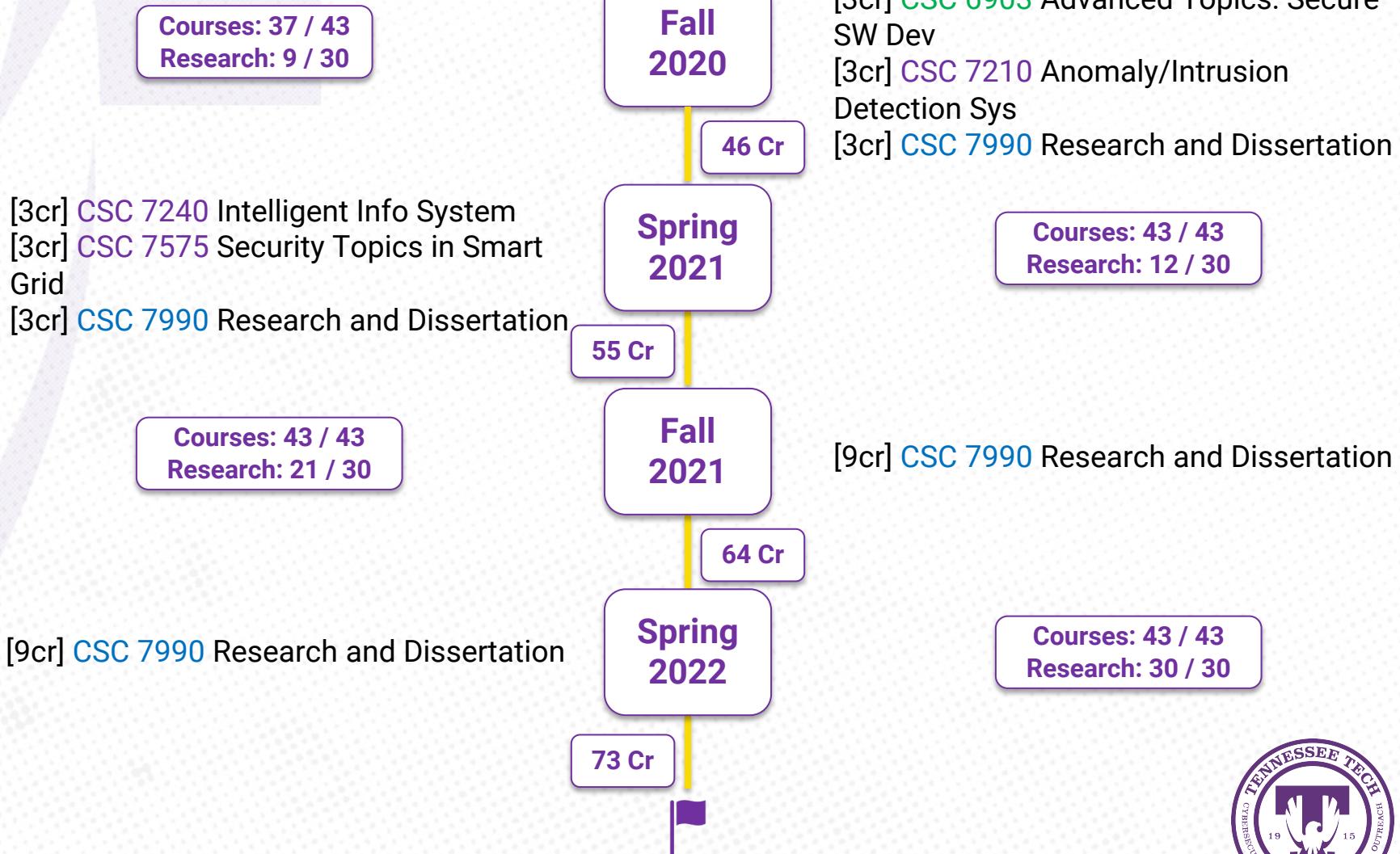
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Program of Study: Direct Ph.D. (1/2)



Program of Study: Direct Ph.D. (2/2)



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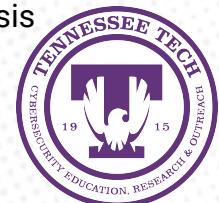


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Inspiration Note

To succeed you have to produce the absolute best stuff you're capable of producing—a task that requires depth.

— Quoted from the book
Deep Work by Cal Newport



THANK YOU!

Happy to take any questions you may have...

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