



Artificial Intelligence-Enabled Cyber Training

An Approach to Accelerated Training Development

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3rd Multi Domain Task Force, U.S. Army Pacific

The overall classification of this brief is: **UNCLASSIFIED**

Version: **9.0**



Agenda & Purpose

- Title Slide
- **Agenda & Purpose**
- Cyber Training and Certification Pipeline
- Manual to AI-Enabled to AI-Driven Training Development
- Accelerated Training Development Process
- AI- Versus Human-Generated Training Material
- Questions, Comments, & Closing

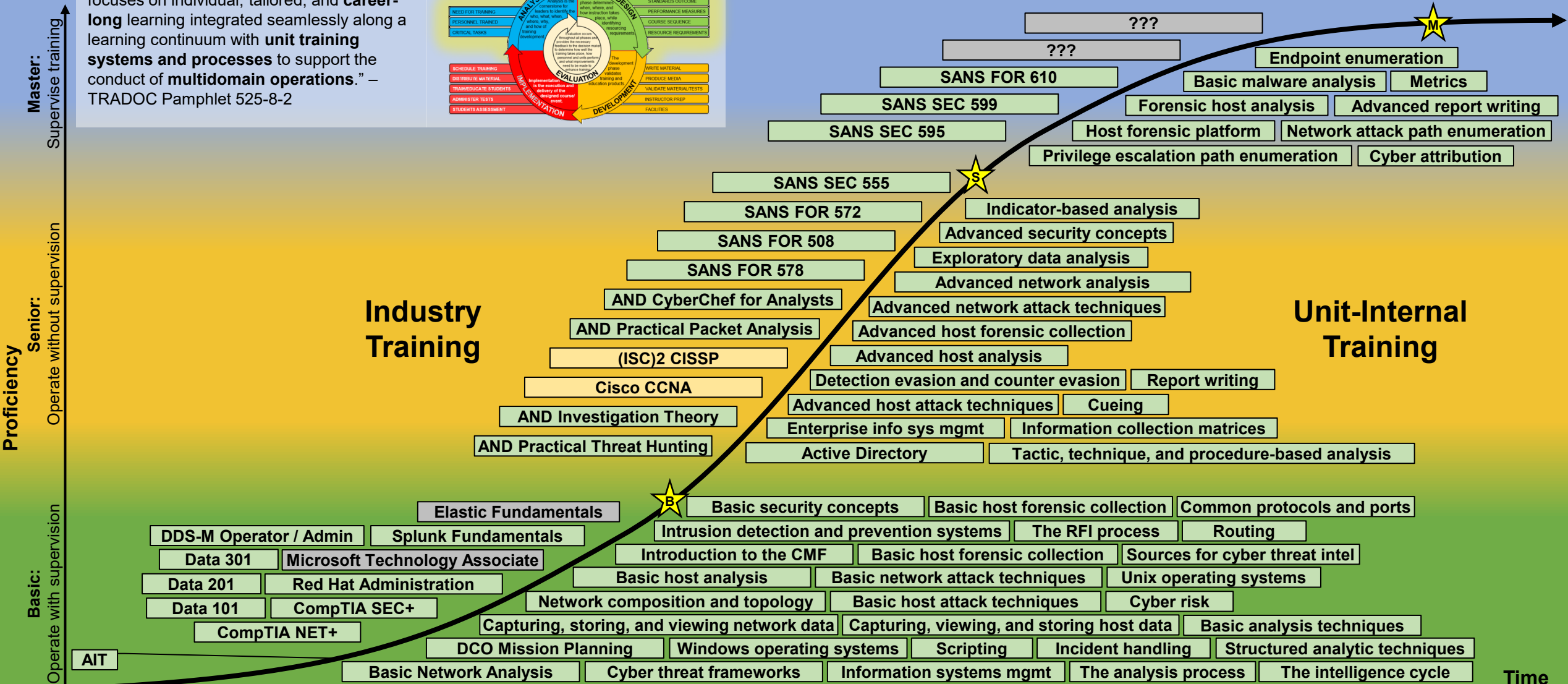
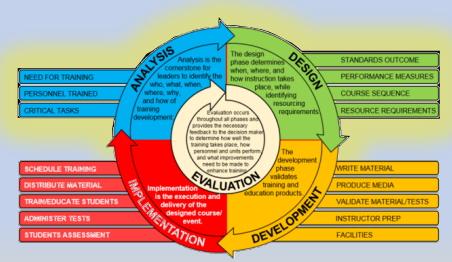
The purpose of today's brief is to explain how artificial intelligence (AI) has accelerated the development of defensive cyber analyst training. I'll briefly frame the problem, then delve into the process, key inputs and outputs at each stage, and close with a look at the final products of this initiative.



LEGEND	
Resourced / Completed	
Resourcing / In Progress	
Not Available / Not Started	

Cyber Training and Certification Pipeline

"The Army learning Concept for 2030- 2040 focuses on individual, tailored, and **career-long** learning integrated seamlessly along a learning continuum with **unit training systems and processes** to support the conduct of **multidomain operations**." – TRADOC Pamphlet 525-8-2

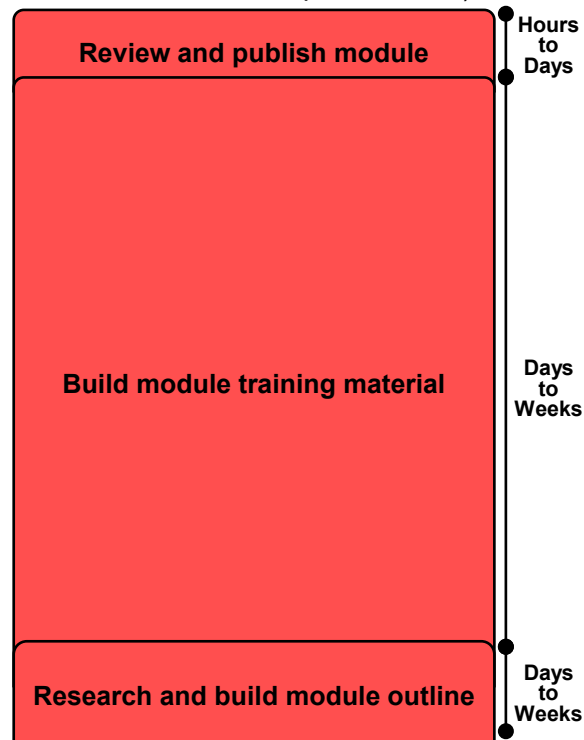




Manual to AI-Enabled to AI-Driven Training Development

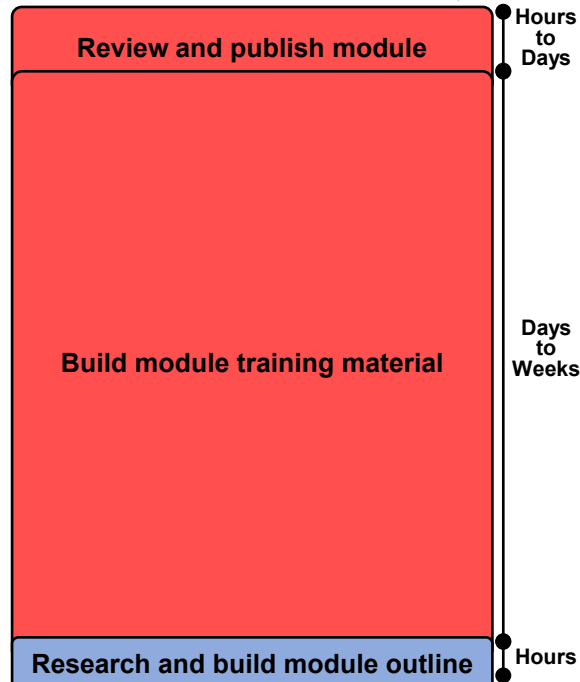
Manual

1 to 2 months to research, outline, develop, review, and publish each cyber analyst training module (outline, slides w/ PE and /or quiz, handout)



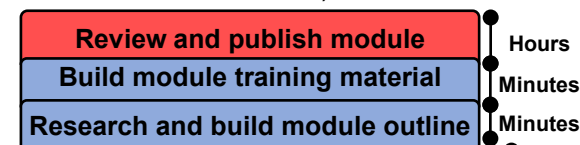
AI-Enabled

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AI-Driven

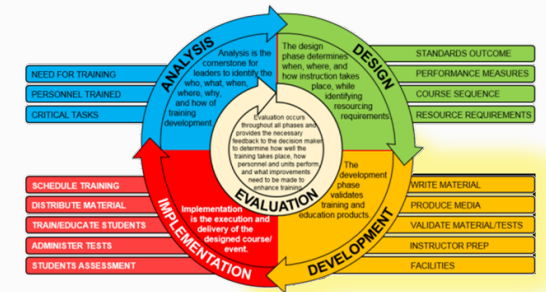
Minutes to research, outline, develop, review, and publish each cyber analyst training module (outline, slides, book, and handout)



Analysis and design of cyber training program

Key Data Points & Results

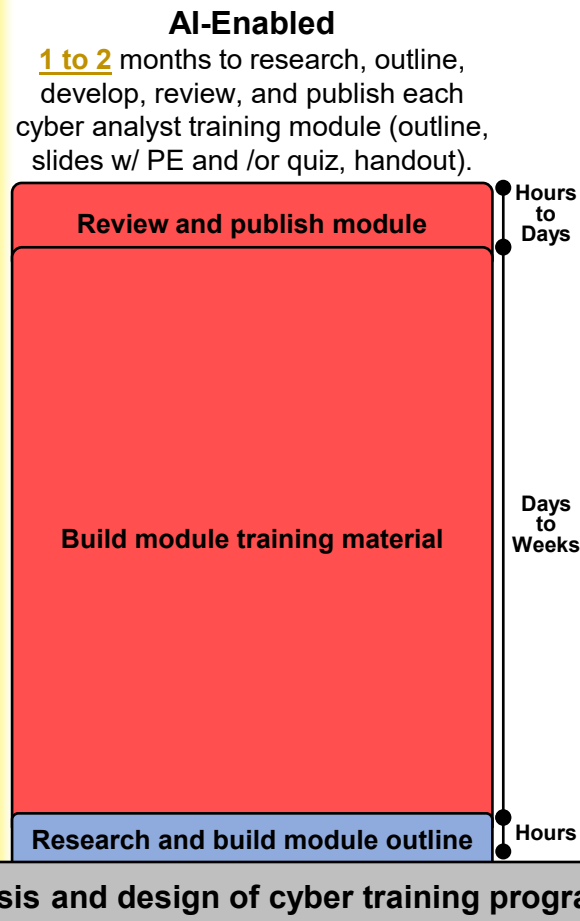
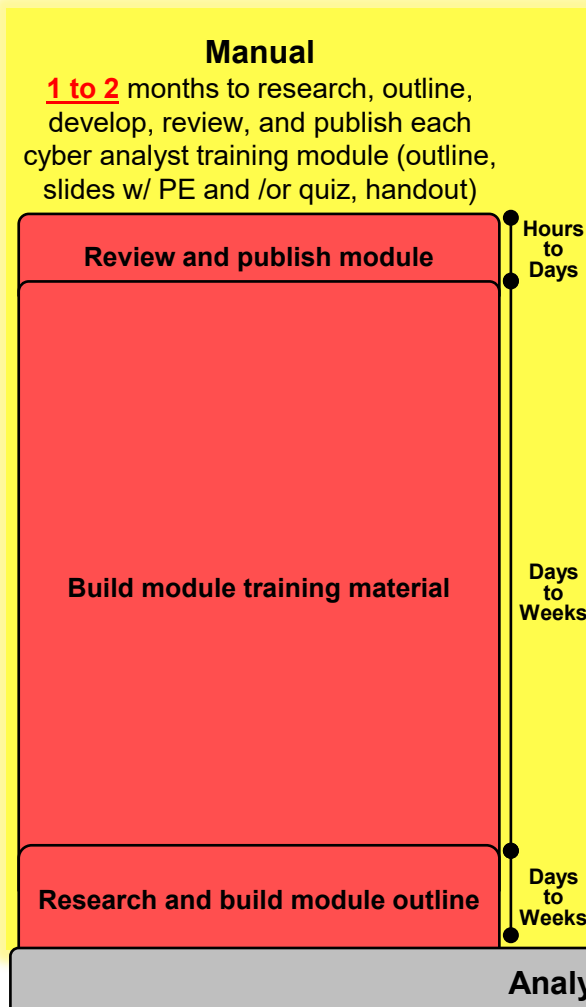
- Started with ~5,000 words in module descriptions (prompts).
- Manual training development:
 - 1 to 2 months to research, outline, develop, review, and publish **each** cyber analyst training module.
 - Estimated ~1 year to develop entire unit-internal training pipeline.**
- AI-enabled training development:
 - Optimizing for the wrong constraint** led to similar 1 to 2 months to research, outline, develop, review, and publish **each** cyber analyst training module.
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- AI-driven training development:
 - Training development reduced to minutes.**
 - LLMs transformed 5,000 word module descriptions into 60,000 words of outlines into **284,000 words on 1,600 slides** of course material.
 - Total cost of project: **\$34.68**



"Future Army forces require the capability to **rapidly understand, develop, and implement** training and education changes in order to meet shifting operational demands in the MDO environment. (paras 3-6.b and 3-8.b.)" – TRADOC Pamphlet 525-8-2

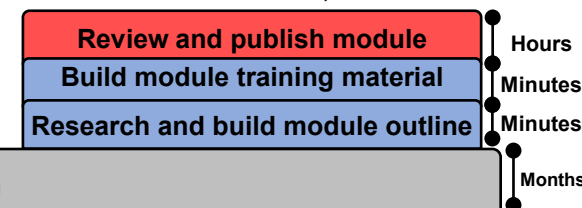


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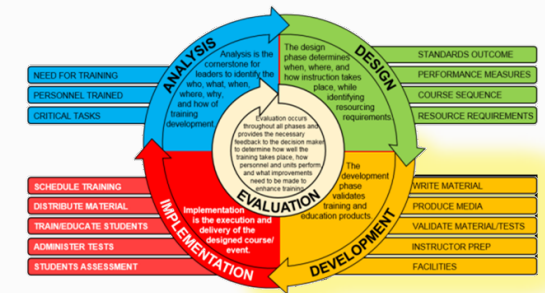
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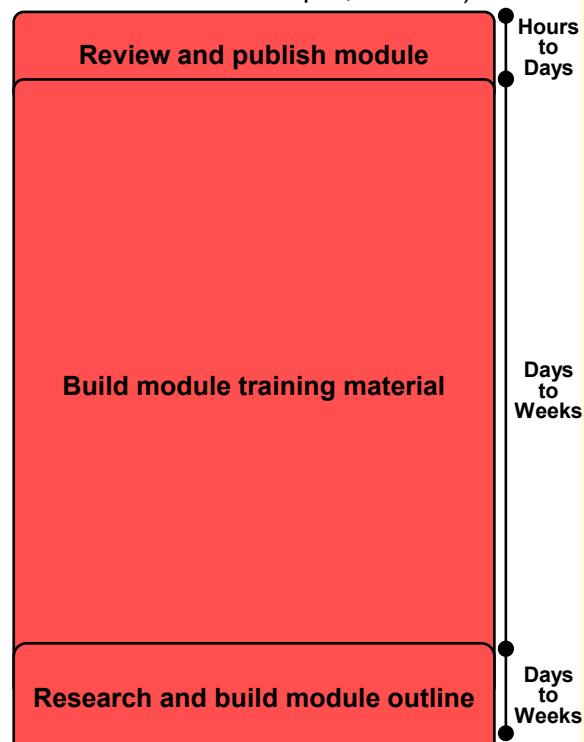
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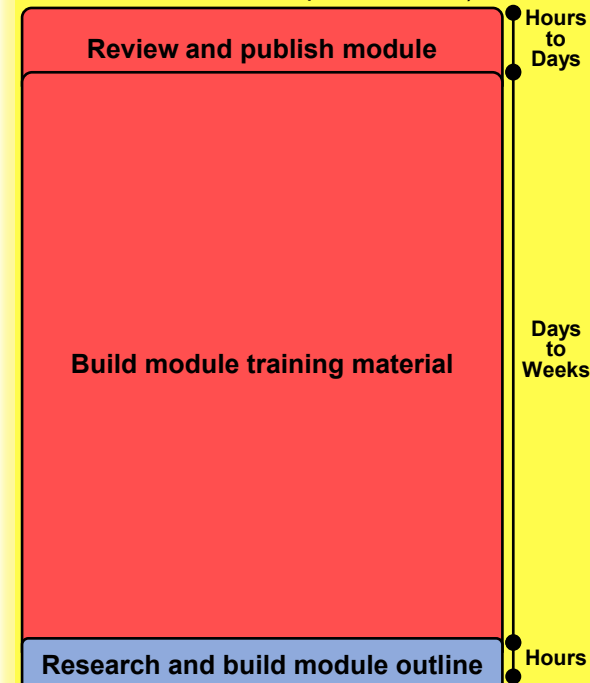
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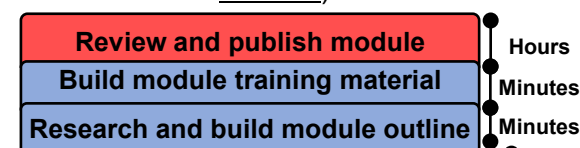
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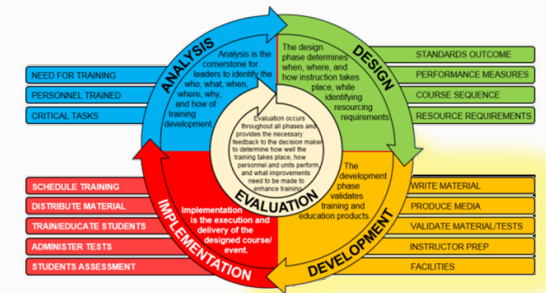
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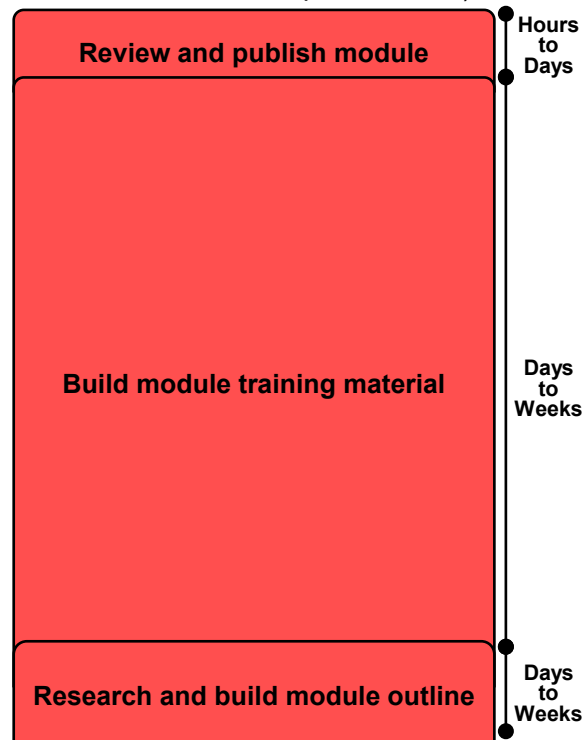
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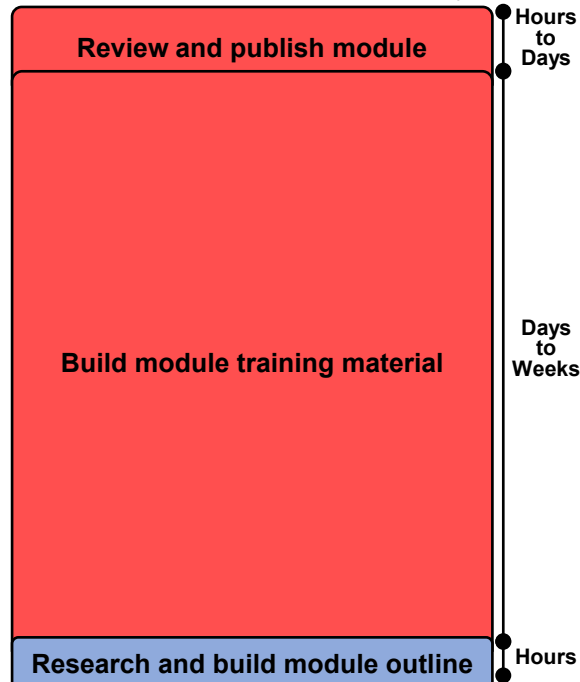
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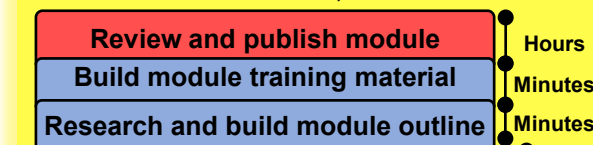
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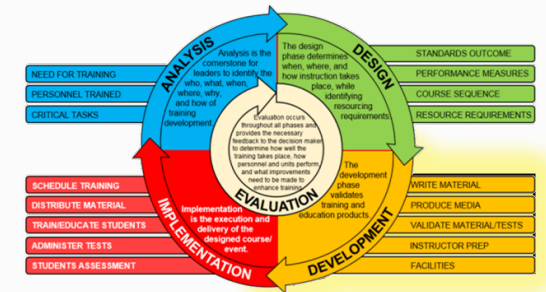
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Accelerated Training Development Process

Step 1:

Manually create training module title and description.

- Individual training module concepts developed based on operational experience and prior industry training.
- Not necessarily *the* answer, but a good start.
- Current concept consists of **54** unique training modules.

Step 2:

Script extracts all module titles and descriptions, then prompts GPT 3.5 to create a module outline based on prompt.

- Module titles and brief, one paragraph descriptions provide enough context to create a good first draft of a training outline using the Large Language Model (LLM) GPT 3.5.

Step 3:

Script parses outline, then prompts GPT 4 to reorder, expand, and revise outline to satisfy JQR requirements. Final outline saved to disk.

- Manually extracted all **598** Job Qualification Record requirements for Host Analyst and Network Analyst, then mapped to individual training modules.
- Outline is revised using more capable LLM GPT 4 based on JQR requirements from manual mapping.

Step 4:

Script reads module outlines, then prompts GPT 4 to generate study guide for each module.

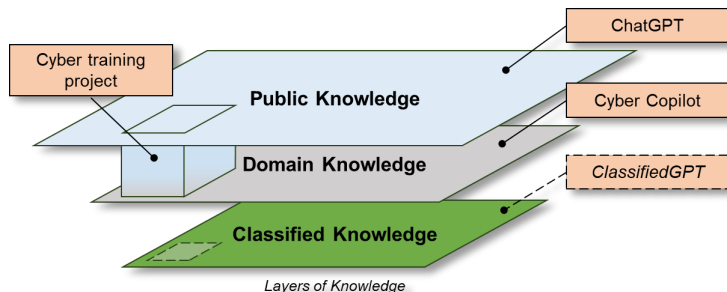
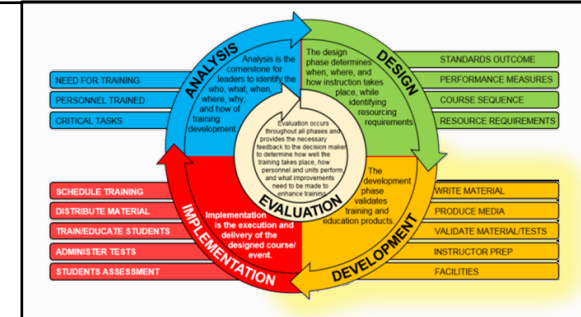
- Revised outline is fed to GPT 4 to develop study guide for each training module.
- Both training and handout are saved to disk.

Step 5:

Script reads each outline, creates a template slide presentation, then iteratively prompts GPT 3.5 to explain each topic from the outline. Explanation is appended to the appropriate slide presentation to produce finished product.

Ensemble Model Approach

- ChatGPT:** Web interface and long context window makes this particularly well-suited to **human-in-the-loop iteration**.
- GPT 3.5 Turbo:** Accessible via API and ChatGPT. Fast, accurate, and well-suited to handling **explicit instructions**.
- GPT 4:** Accessible via API and ChatGPT. Slower than GPT 3.5, more expensive, but well-suited to **tasks** that may require inference or reasoning.
- Google Gemini:** Accessible via (free) API and web interface. Quality between GPT 3.5 and GPT 4.



- For each training module:
 - Read each topic in the outline.
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 - Append output to LaTeX slide deck.
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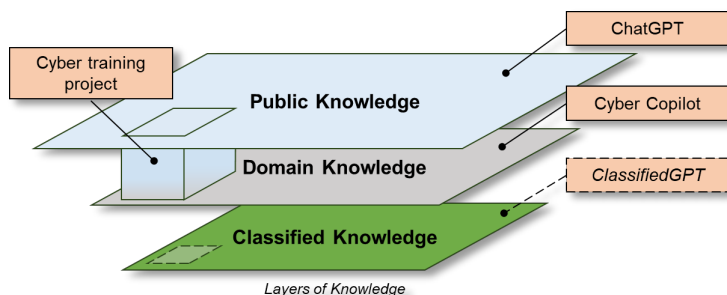
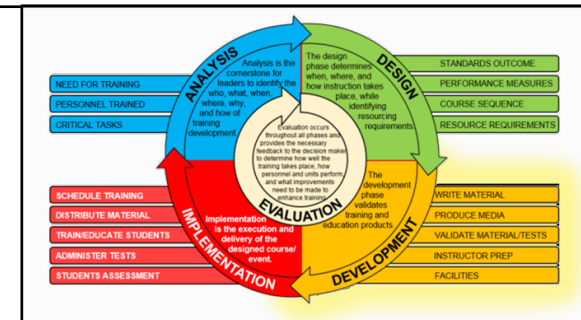
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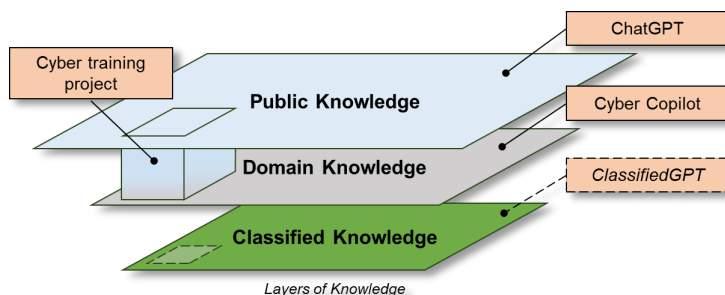
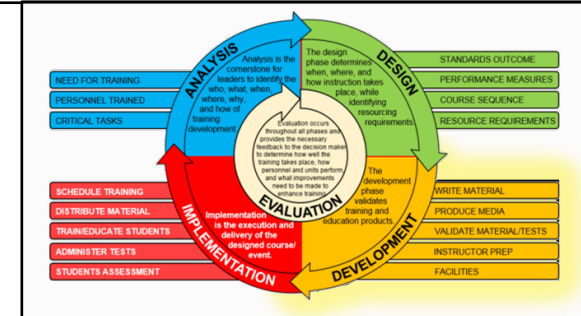
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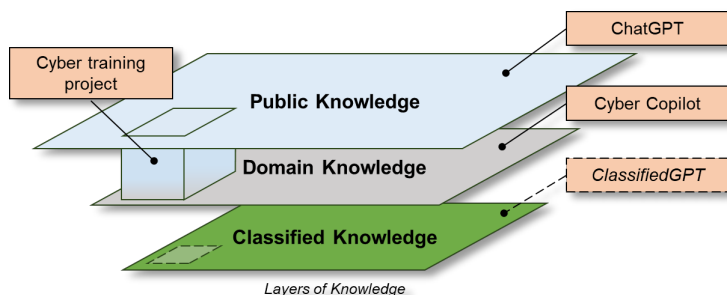
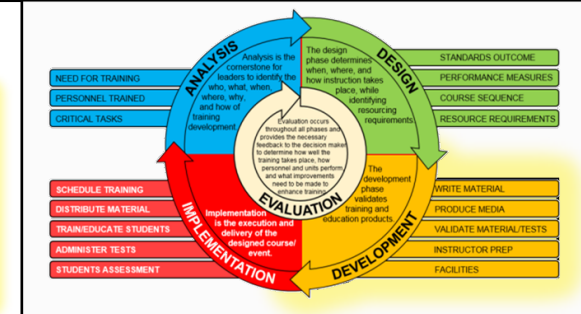
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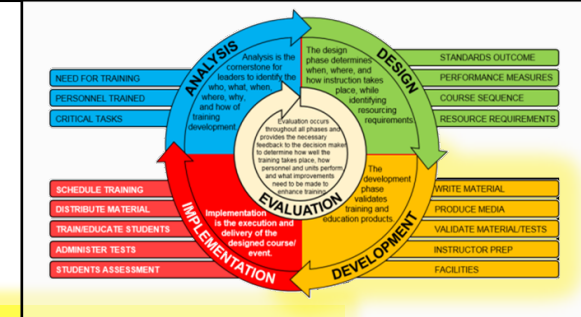




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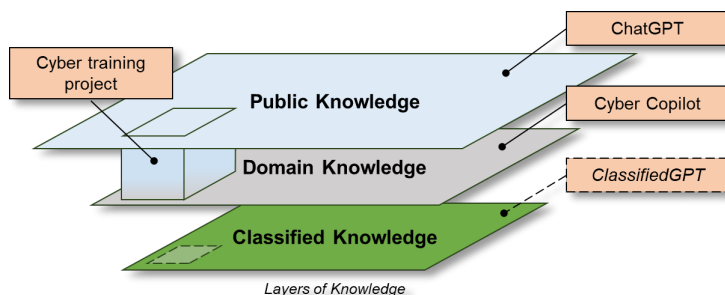
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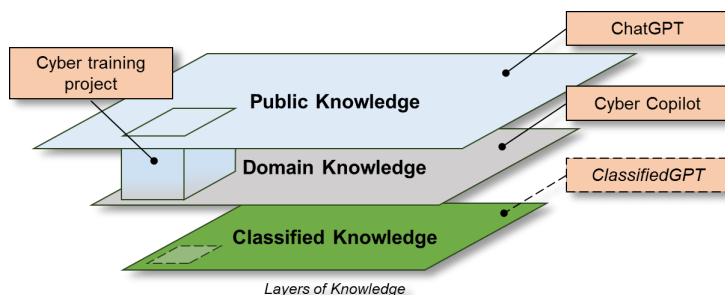
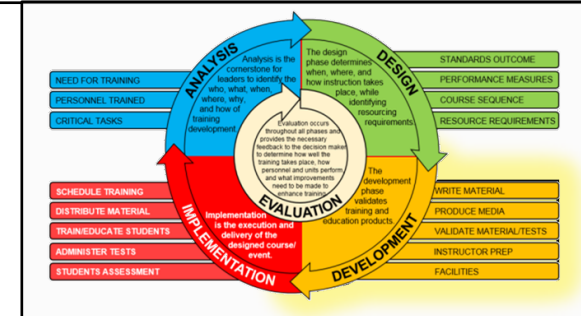
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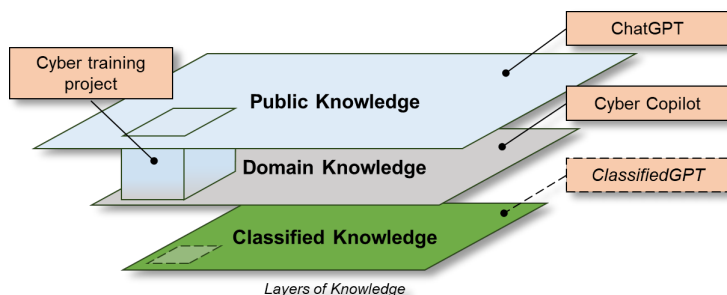
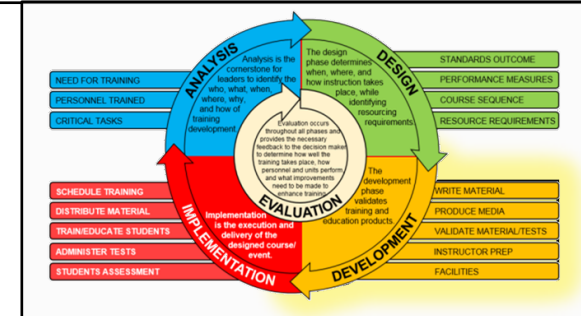
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AI- Versus Human-Generated Training Material

Passive Tap

Active Tap

Switch SPAN Port

- ▶ A Switched Port Analyzer (SPAN) port, commonly referred to as a 'mirror port', is a designated port on a network switch that is configured to receive and replicate packets from one or more target ports. This functionality enables network administrators or security personnel to monitor network traffic entering or leaving these target ports.
- ▶ The primary goal of a SPAN port is to aid in troubleshooting, monitoring, and analyzing network issues without interrupting the normal flow of data. This makes it an invaluable tool for identifying anomalies or potential security threats within a network.
- ▶ Configuring a SPAN port typically involves selecting a source port (or ports) whose traffic will be mirrored and a destination port where the mirrored traffic will be sent. It's important to ensure that the destination port has adequate bandwidth to handle the additional traffic, as it will receive both its own traffic and the mirrored traffic.
- ▶ It is essential to be cautious when using SPAN ports. Overloading the destination port can lead to dropped packets and incomplete data capture. Additionally, the SPAN port itself does not introduce any latency or alter the packets, making it a transparent and reliable tool for network analysis.
- ▶ When using a SPAN port for capturing data, it's often paired with network analysis tools or intrusion detection systems. These tools can interpret, store, and further analyze the mirrored traffic for insights or alerts.

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AI-Generated Training Material

AI won't obviate the need for skilled course designers and knowledgeable instructors, but it can produce training material at least as good as what we have today.

Port Mirroring

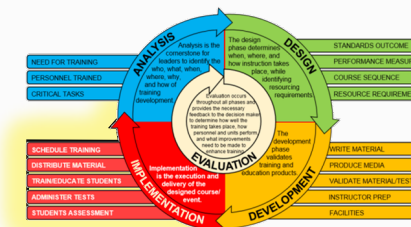
Port Mirroring

SPAN

Limitations

- Performance degradation can occur when mirrored traffic exceeds the capacity of the listening or monitor interface, to prevent this issue it is recommended to:
 - Limit the ports monitored to prevent duplicate data
 - Use a firewall filter to send specific traffic to a port supporting mirroring
- If the device monitor interface capacity is insufficient to handle traffic from the source port(s), overflow packets are dropped
- Both ingress and egress switched traffic not originating from the switch can be mirrored from interfaces, but this is not the case for VLAN traffic
- Only traffic entering a VLAN can be mirrored, and you cannot copy packets exiting a VLAN with mirroring

Contractor-Generated Training Material





Key Takeaways

1. This project has already had significant impact at the **tactical level** but could have a greater impact **across echelons** and **across the force**.
 - The Army has many programs to teach specialists to create lesson materials in the institutional domain, but few opportunities for that training in the operational force.
2. This project **automates the mundane work** of basic information gathering and product creation. It enables **focusing on higher order tasks**.
 - Evaluating the effectiveness of training programs.
 - Improving the quality of training.
 - Integrating emerging research from academia and lessons from the operational force in a far more rapid manner than is done today.



Questions, Comments, & Closing

💡 All the code for this project is hosted on US Cyber Command's GitLab server, R2D2, here: <https://code.levelup.cce.af.mil/3mdtf/idco/training>