### Design and Development of an Adaptive Hypermedia-Based Course for Counterinsurgency Training in GIFT: Opportunities and Lessons Learned

Jonathan Rowe<sup>1</sup>

Randall Spain<sup>1</sup>

Bob Pokorny<sup>2</sup>

Bradford Mott<sup>1</sup>

Benjamin Goldberg<sup>3</sup>

James Lester<sup>1</sup>

<sup>1</sup> North Carolina State University

<sup>2</sup> Intelligent Automation, Inc.

<sup>3</sup> U.S. Army Research Laboratory



### **Tutorial Planning**

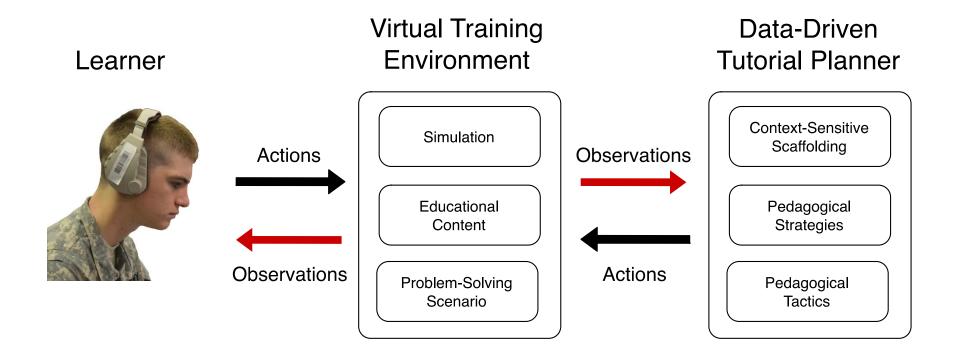




- Hints
- Feedback
- Scenario adaptations
- Embedded assessments
- Remedial instruction

### **Data-Driven Tutorial Planning**



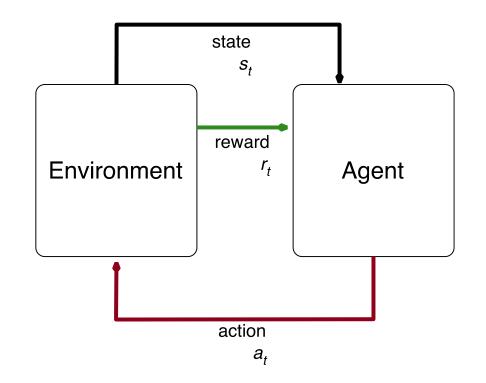


# **Reinforcement Learning**

### Problem: Devise software agent that learns how to behave in

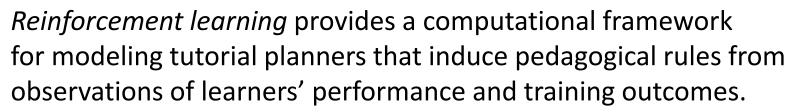
order to maximize numerical reward

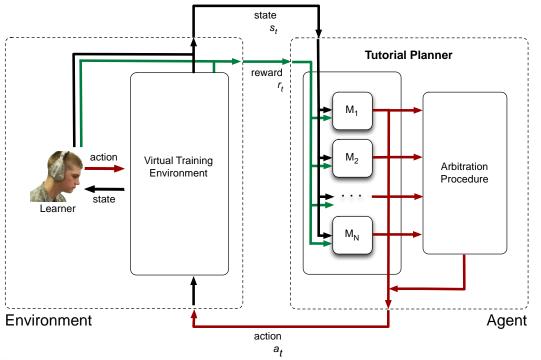
- No external supervision
  - Delayed rewards



Adapted from Sutton & Barto (1998)

# Reinforcement Learning-Based Tutorial Planning





(Rowe & Lester, 2015; Sawyer, Rowe, & Lester, 2017)





- Adaptive Hypermedia-Based Training Environment
- Course Overview
- Design and Development of an Adaptive Hypermedia Training Course in GIFT
- Lessons Learned
- Conclusion and Future Work

### Outline



### Adaptive Hypermedia-Based Training Environment

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## Tutorial Planning for Counterinsurgency Training

### **UrbanSim Primer**



- Hypermedia-based training environment
- Range of COIN doctrinal concepts
  - Population support
  - Intelligence gathering
  - PMESII analysis
- Preliminary instruction on UrbanSim usage

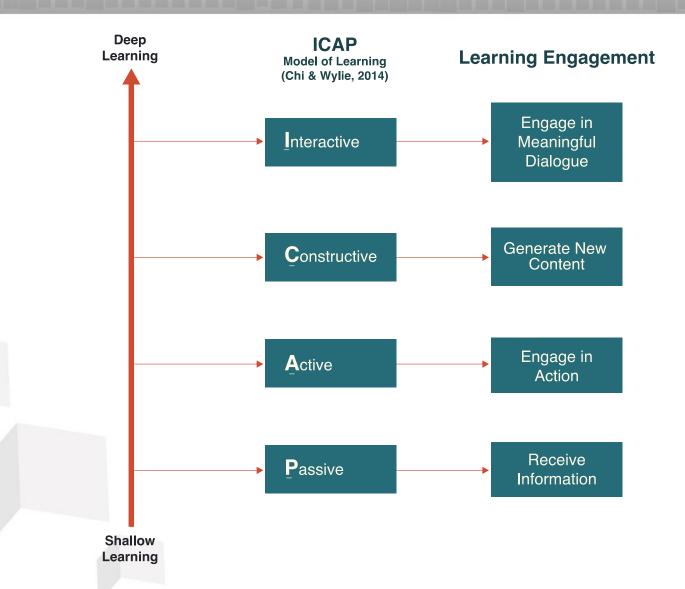
## Generalized Instructional Strategies for COIN Training



- High-level instructional strategies
  - Single-topic coaching
  - Multi-concept review
  - Feedback on unproductive learning behaviors
- ICAP-inspired remediation strategies (Chi, 2009)
  - Constructive
  - Active
  - Passive

**ICAP** Framework





### **Research Objectives**



- Objective 1: Devise adaptive hypermedia-based COIN training environment in GIFT to serve as a testbed for data-driven tutorial planning.
- Objective 2: Induce ICAP-inspired pedagogical strategies for feedback and remediation from learner training data.
- Objective 3: Evaluate RL-based tutorial planning models in run-time adaptive hypermedia-based training course.

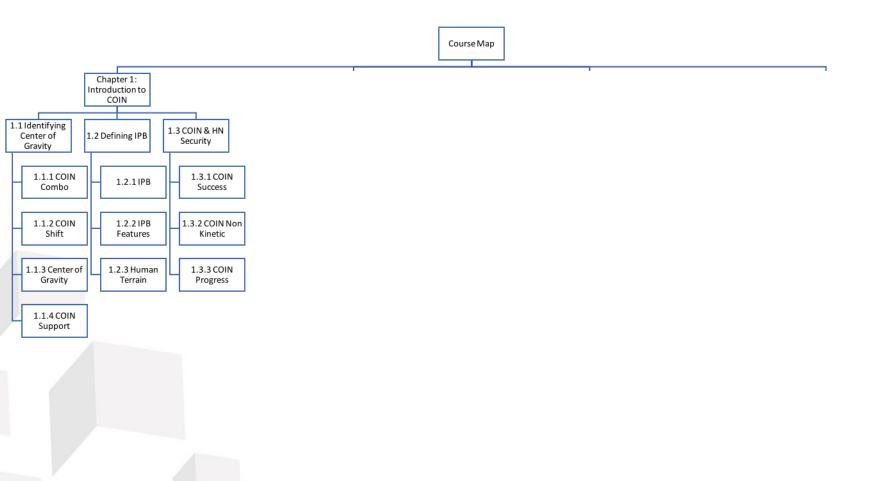




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# **Course Map**





### **Course Overview**



Take a Course Learner Profile Course Creator	Publish Courses			Help + 🎍 -jprow
🔜 ؇ 🔁 💿 UrbanSim Primer Adaptive Test Cour	se - April 2018			
Information as Text Introduction	Achievement Goal	COIN Pre-Test (C)	t Lesson 1-2.1	Lesson 1-2.3
Adaptive Courseflow Lesson 1-5.1	Courseflow	Lesson 1-6.1	w Chapter 1 Review Questions (1/3)	Chapter 1 Review (2/3)
Courseflow Lesson 2-3.1	Courseflow	Lesson 2-5.1	w Lesson 2-8.1	Multi-Lesson Review 2.1
Image: Adaptive Courseflow           Multi-Lesson Review 2.3	Courseflow	Lesson 3-6.3	W Courseflow Carseflow Multi-Lesson Review 3.1	Adaptive Courseflow Multi-Lesson Review 3.2
Lesson 4-2.1	Courseflow	Lesson 4-3.1	w Adaptive Courseflow Multi-Lesson Review 4.1 Multi-Lesson Review 4.2	Multi-Lesson Review 4.3
COIN Post-Test		-[]		
Q Q \$				

### Demo Video



Introduction

#### Welcome to the Training Course!

In this course, you will learn foundational concepts about mission command for counterinsurgency (COIN) operations.

The course includes a series of short videos that discuss COIN theory and doctrine, quiz questions, and remediation activities.

Before you get started, we'd like you to answer a few questions.

To begin, please click the arrow above.

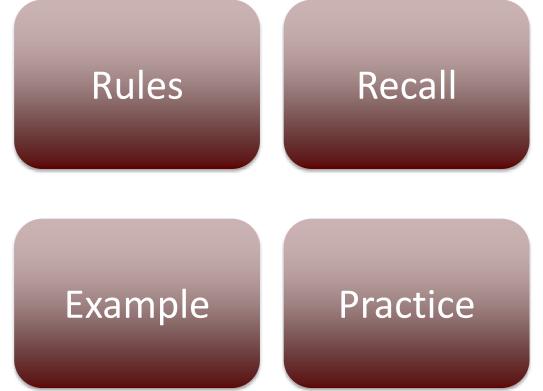




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# EMAP: Engine for Management of Adaptive Pedagogy





**Content Type** 

- Implemented with adaptive courseflow objects
- Training activities are procedurally sequenced based on learner performance

# Adaptive Courseflow for UrbanSim Primer







Recall

Q1: Which are used by COIN

- Example Quadrant: UrbanSim Primer lesson videos
- Recall Quadrant: Multiple-choice embedded assessments
- Not currently using Rules or Practice Quadrants

# **ICAP-Enhanced EMAP**



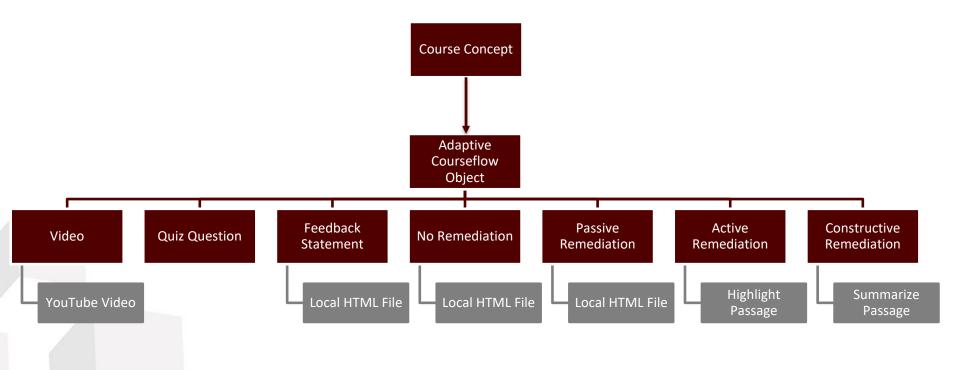


# ICAP-Enhanced EMAP





# Authoring Adaptive Courseflow Content



SintelliM

**Remediation Quadrant** 



Take a Course Learner Profile	Course Creator Publish Courses	Help 👻 💄 ୶ jprowe
Course Properties	🞴 ؇ 🔁 💿 UrbanSim Primer Adaptive Test Course - April 2018 - Form B	
■ Description	Image: State plane Courselfow         Im	New Course Object * X the selected course concept(s).
Concepts		
Course Cover Image		Show message on completion
Ø History €	Image: State of the s	Check on Learning Phase (Recall)
> Advanced		Course Question Bank
	Adaptive Coursellow	& Course Question Bank
	Lesson 2-3.3	Number of questions to show per concept:
		Concept Easy Medium Hard
	Adaptive Courseflow     Multi-Lesson Review 2.2     Multi-Lesson Review 2.3     Lesson 3-6.1	Please select one or more concepts above to begin editing concept questions.
	Lesson 3-6.3	Criteria needed to reach a particular expertise level on each concept: Set Allowed Attempts 3 *
	Image: State prive Coursellow         Image: State prive Coursellow         Image: State prive Coursellow         Image: State prive Coursellow           Multi-Lesson Review 3.3         Image: State prive Coursellow         Image: State prive Coursellow         Image: State prive Coursellow	Show message on completion
🚠 Course Objects		Exclude Rule/Example Content     Exclude Rule/Example Content     Remediation Content Files     Files
쉽 Media	Image: Coursellow       Im	No Remediation phase content was found for the selected course concept(s).
	COIN Post-Test (b) + Post-Training Opinion + Course Complete + New Course Object + + + + + + + + + + + + + + + + + + +	Practice Phase (optional) Add practice phase
Remaining Space: 96 MB	<u> </u>	▶ Options

### **Add Remediation Content**



#### **Add Remediation Content** 1 P ß Þ Ľ PDF Highlight Web YouTube Summarize Slide Power Local Local Webpage Image Address Video Passage Passage Show Point Metadata:\* Attributes: Concepts: 1-2.1-coin-combo Please select a checked concept to view the attributes assigned to it. 1-2.2-coin-shift 1-2.3-center-gravity 1-2.4-support-coin 1-5.1-ipb-includes 1-5.2-ipb-features

### **Add Remediation Content**



#### Add Remediation Content 1 P ß Ľ Þ Ø Highlight PDF Web YouTube Summarize Slide Power Local Local Passage Webpage Image Address Video Passage Show Point Metadata:\* Concepts: Attributes: 1-2.1-coin-combo Please select a checked concept to view the attributes assigned to it. 1-2.2-coin-shift 1-2.3-center-gravity 1-2.4-support-coin 1-5.1-ipb-includes 1-5.2-ipb-features

### **Add Remediation Content**



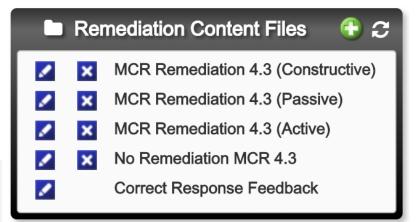
#### Add Remediation Content 1 P ß Ľ Þ Ø Highlight Summarize PDF Web YouTube Slide Power Local Local Webpage Image Address Video Passage Passage Show Point Metadata:\* Concepts: Attributes: 1-2.1-coin-combo Please select a checked concept to view the attributes assigned to it. 1-2.2-coin-shift 1-2.3-center-gravity 1-2.4-support-coin 1-5.1-ipb-includes 1-5.2-ipb-features

# **Remediation** Quadrant



#### Remediation Phase 😮

Exclude Rule/Example Content



- Remediation quadrant shows complete list of remediation assets linked to course object
- Files names created by course author
- Course authors can delete and edit content files





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### **Best Practices**



- Develop an instructional design map that organizes the training into terminal and enabling learning objectives.
- Develop an external prototype of the course prior to constructing the full course in GIFT.
- Conduct iterative rounds of pilot testing between development cycles.

Authoring Enhancement Recommendations



- Advanced previewing capabilities for remediation phase would improve authoring efficiency.
- Enhancements related to viewing and managing
   media files and course assets would further reduce authoring time.





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# Conclusion



- Data-driven tutorial planning shows significant promise for creating effective personalized learning experiences.
- ICAP-inspired enhancements to GIFT enable rich feedback and remediation in adaptive training environments.
- We have designed and developed an adaptive hypermedia-based training course in GIFT that will serve as a testbed for data-driven tutorial planning with hundreds of trainees.

### **Future Directions**



- Collect a training corpus through the Amazon Mechanical Turk crowdsourcing platform to investigate RL-based tutorial planning.
- Induce control policies for adaptively personalizing remediation and feedback to individual learners.
- Integrate data-driven tutorial planning models into the run-time adaptive training course and evaluate their effectiveness.

# Acknowledgments



- Dignitas Technologies
- Institute for Creative Technologies

- Vanderbilt University
- NCSU Army ROTC Program



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## **Passive Remediation**



wedia mie.	What's this?	
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	age What's this?	
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0 1	-2.2-coin-shift	Please select a checked concept to view the attributes assigned to it.
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1	-5.1-ipb-includes	
1	-5.2-iob-features	

### **Active Remediation**



ñ	Take a Course Learner Profile Course Creator Publish Courses	Help 🗕 🚽	-jprowe
1	Add Remediation Content		
I	Highlight Passage  Title:* What's this?		
	Enter any instructions that you want your learners to see here. $ \begin{array}{c c} \hline \hline$		a b
	Enter the text from which you want learners to highlight passages here.		Ľ
	Expert Highlighting         To help you evaluate your understanding, here is some example highlighting generated by an expert:         This is where you will be able to select the ideal passage to be highlighted.		
	<ul> <li>Display an image</li> <li>Ask learner to evaluate how well their response matches the ideal highlighting</li> <li>Ask learner how helpful this question was</li> </ul>		
e	Change Content Type Metadata:*		
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Rema	Add	Cancel	

### **Active Remediation**

javascript:;



P Highlight Passage	
Title:" What's this? Remediation 4-2.1 (Active)	
INCORRECT. You missed a question asking what is the crucial battleground for COIN. Please read the following passage about counterinsurgency operations from the video. Afterward, highlight the passage that best addresses the question you missed. COIN and HUMINT	
As previously discussed, Human Terrain is the crucial battleground in COIN operations. This terrain includes human intelligence and knowledge of social networks, as well as cultural and ethnographical information. Because the human terrain changes constantly within the operating environment, it is yet another reason that intelligence gathering must be a systematic and continuous process.	
Expert Highlighting	
To help you evaluate your understanding, here is some example highlighting generated by an expert:	
COIN and HUMINT	
As previously discussed, Human Terrain is the crucial battleground in COIN operations. This terrain includes human intelligence and knowledge of social networks, as well as cultural and ethnographical information. Because the human terrain changes constantly within the operating environment, it is yet another reason that intelligence gathering must be a systematic and continuous process.	
Please select how similar your answer is to the expert's answer.	
Not Moderately Very similar similar similar	

### **Constructive Remediation**



Take a Course Learner Profile Course Creator Publish Courses	Help 🗸 💄 – jprowe
Add Remediation Content	
i≣ Summarize Passage	
Title: What's this?	
Enter any instructions that you want your learners to see here	
Enter the text that you want learners to summarize here.	
This is where learners will enter their summary.	B
Expert Summary To help you evaluate your understanding, here is an example summary generated by an expert:	
Enter your ideal summary here.	
Display an image	
Ask learner to evaluate how well their response matches the ideal summary	
Ask learner how helpful this question was	
Change Content Type	, j
Metadata:*	
bbA	Cancel
Remaining Space: 90 MB	Populons

### **Constructive Remediation**

Data			
	I Summarize Passage		
	Title: What's this?		
	Remediation 4-2.1 (Constructive)		
	INCORRECT. You missed a question asking what is the crucial battleground for COIN. Please read the following passage about counterinsurgency operations from the video. Afterward, write a brief (1-2 sentence) summary addressing the question you missed. COIN and HUMINT As previously discussed, Human Terrain is the crucial battleground in COIN operations. This terrain includes human intelligence and knowledge of social networks, as well as cultural and ethnograp information. Because the human terrain changes constantly within the operating environment, it is yet another reason that intelligence gathering must be a systematic and continuous process. This is where learners will enter their summary.	phical	
	Expert Summary To help you evaluate your understanding, here is an example summary generated by an expert:		
	The crucial battleground for COIN is the human terrain.	6	
	Not       Moderately       Very         similar       similar       similar		