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Generalized Intelligent Framework for Tutoring (GIFT)

TECHNOLOGY DRIVEN. WARFIGHTER FOCUSED.

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Associate Director for Science & Technology

Director, Learning in Intelligent Tutoring Environment (LITE) Laboratory

Army Research Laboratory - Human Research & Engineering Directorate (HRED)





Outline



- People
- Motivation for Computer-Based Tutoring
- Problem Statement
- GIFT Research Objectives and Purpose
- GIFT Authoring Construct
- GIFT Demo
- GIFT Instructional Management Construct
- GIFT Assessment Construct
- How to request GIFT... GIFTtutoring.org
- References
- Questions



People



- Adaptive Tutoring Research @ the Learning in Intelligent Tutoring Environments (LITE) Laboratory
 - Dr. Robert Sottilare, ARL-HRED AD for S&T, LITE Lab Director
 - Dr. Heather Holden, Trainee Modeling & HCI Lead for LITE Lab
 - Mr. Keith Brawner, Authoring and Expert Modeling Lead for LITE Lab
 - Mr. Benjamin Goldberg, Instructional Strategy Lead for LITE Lab
 - Mrs. Janice Connor, Research Assistant
 - Dr. Anne Sinatra, Post-Doc



Co-creators of GIFT







We don't work alone...















































Motivation for adopting computer-based tutoring



Tutoring Methods and Effect Sizes...

- .42 Unskilled human tutors (Cohen, Kulik, & Kulik, 1982)
 (↑ median score from 50th percentile to 66th percentile)
- .79 Skilled human tutors (VanLehn, 2011)

 (↑ median score from 50th percentile to 79th percentile)
- .80 AutoTutor (20 experiments) (Graesser and colleagues)
- 1.05 Other tutoring systems (↑ median score from 50th to 85th)

 PACT Geometry Tutor (Anderson, Corbett, Koedinger & Pelletier, 1995)

Atlas-Andes (VanLehn, et al, 2005; Rose, et al, 2001)

Diagnoser - physics (Hunt & Minstrell, 1994)

Sherlock (Lesgold, et al, 1988)

- 2.00 Skilled human tutors (Bloom, 1984)
- Adapted from information provided by Dr. Art Graesser, University of Memphis, and Dr. Beverly Woolf, University of Massachusetts - Amherst.



Problem Statement

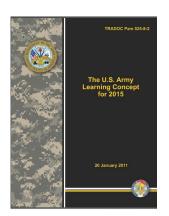


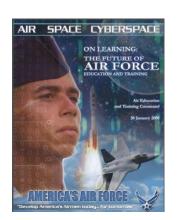
Computer-based tutoring systems (CBTS) have demonstrated significant promise in tutoring individuals in well-defined domains, but...

Fifty years of research have been unsuccessful in making CBTS ubiquitous in military training... Why?

CBTS are expensive to author and are insufficiently adaptable to support the tailored, self-regulated, individual & small unit tutoring experiences required to support:

- U.S. Army Learning Model (ALM) for 2015 (TRADOC, 2011)
- U.S. Air Force (AETC, 2008)
- U.S. Navy STEM Grand Challenge (ONR, 2012)
- OSD R&T Vision for PAL
- NATO HFM RTG 237 (Advanced ITS)
- TTCP HUM TP-2 (Training Panel)







GIFT Research Objectives



Tutor Authoring

- promote reuse through common tools and standards
- promote reuse through domain-independent modules
- leverage open source solutions
- leverage existing training environments (e.g., games)

Tutor Adaptability

- develop methods to accurately classify learner states (e.g., cognitive, affective, psychomotor, social)
- develop methods to select optimal instructional strategies given the learner's existing states

Adaptive Tutoring Learning Effect Chain

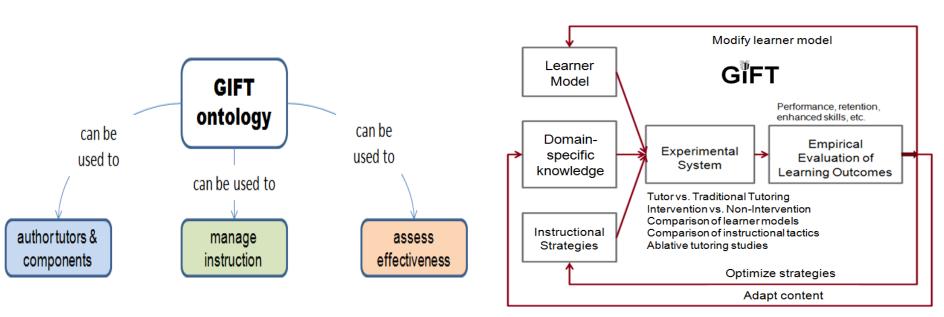
learner informs | learner informs | learner informs | learner informs | learning | learn



Generalized Intelligent Framework for Tutoring (GIFT)



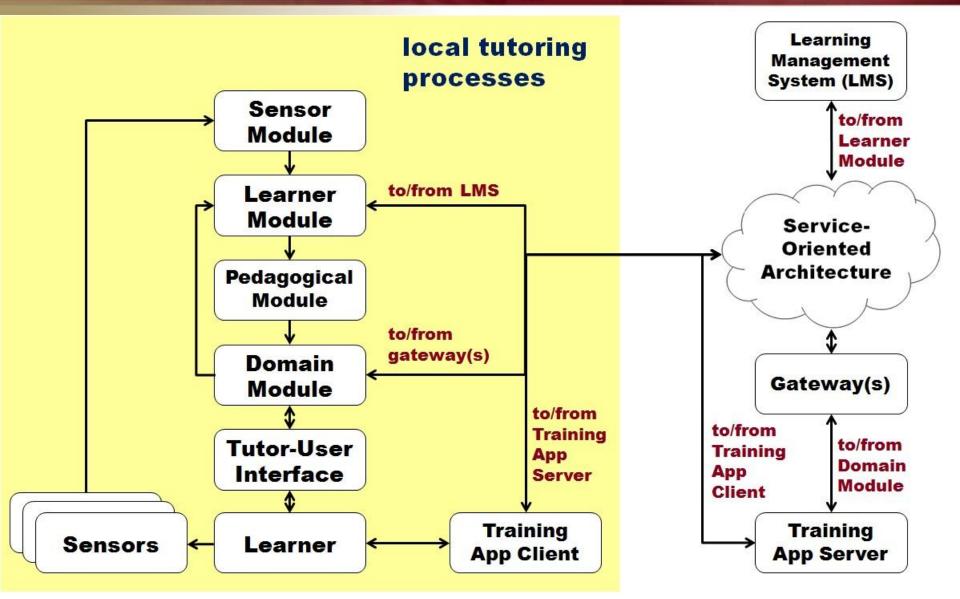
- Research and prototype a computer-based tutoring framework to evaluate adaptive tutoring concepts, models, authoring capabilities, and instructional strategies across various populations, training tasks and conditions, thus enabling summative and formative evaluations including between system evaluations
 - empirically assess CBTS, CBTS models, methods, and components using GIFT
 - use results to build CBTS standards





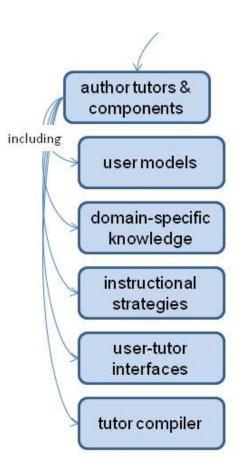
GIFT's Instructional Elements











Authoring Goals for GIFT

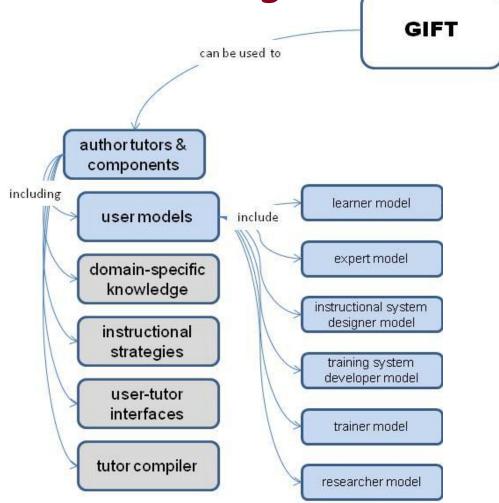
(adapted from Murray, 1999; Murray, 2003; Sottilare & Gilbert, 2011)

- Decrease the effort (time, cost, and/or other resources) for authoring and assessing CBTS;
- Decrease the skill threshold by tailoring tools for specific disciplines to author, assess and employ CBTS;
- Provide tools to aid the designer/author/trainer /researcher organize their knowledge;
- Support (i.e. structure, recommend, or enforce) good design principles (in pedagogy, user interface, etc.);
- Enable rapid prototyping of CBTS to allow for rapid design/evaluation cycles of prototype capabilities.
- Employ standards to support rapid integration of external training/tutoring environments (e.g., games) (Sottilare & Gilbert, 2011)





- Approach: functional user modeling
- standard structures and graphical user interfaces
- GUIs based on function (e.g., researcher) and functional competency
 - learners
 - subject matter experts
 - instructional system designers
 - · system developers
 - · trainers
 - researchers



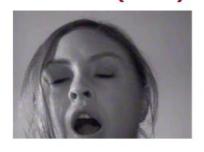




Approach: learner affect modeling

- what does the tutor need to know about the learner to classify their affect?
- how does the tutor get that information?
- which affective states are important to recognize?
- how does
 classification of
 state influence
 instructional
 decisions?

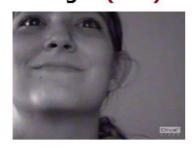
Boredom (23%)



Confusion (25%)



Delight (4%)







Frustration (16%)



Surprise (4%)

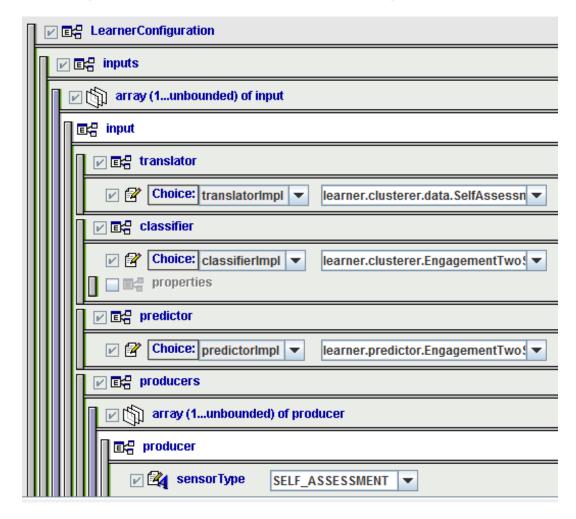
Graesser and D'Mello (2012, in press)





Approach: learner configuration authoring tool

- simple interface for authoring learner models
- tree structure driven by XML schema
- prevents learner model authoring errors by validating against the learner model XML schema
- provides ability to validate learner model using GIFT source w/o having to launch the entire GIFT architecture







Approach: sensor configuration authoring tool



- · Implemented sensors
 - · Affectiva QSensor
 - electro-dermal activity (EDA)
 - skin temperature and acceleration
 - Emotiv EEG
 - temperature and humidity mouse (custom)
 - Surrogate sensors for temp, humidity and assessment

- behavioral sensors
- physiological sensors
- state classification models

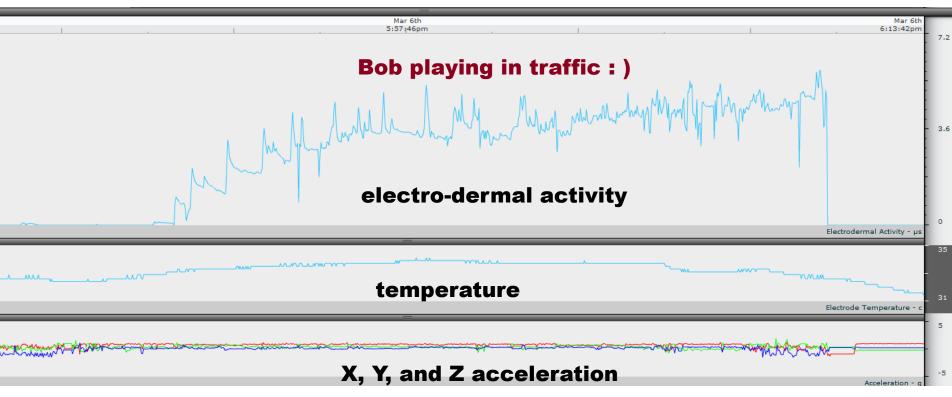


- Sensors under consideration
 - NeuroSky and ABM EEGs
 - Webcam (1Hz)
 - Zephyr heart rate monitor
 - Sonar distance sensor
 - Pressure chair (custom)
 - Pupil diameter (custom)
 - Design Interactive EmoPro



Passive Sensing - Q Sensor 4





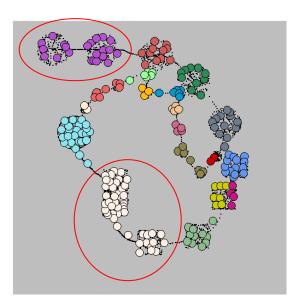
Research question: what is the minimum set of sensors needed to assess engagement, workload, motivational level and emotional state?



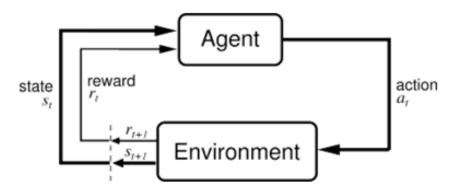




· Approach: clustering, classification & optimization

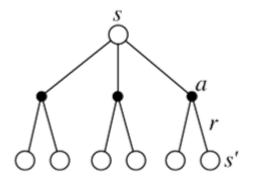


Growing Neural Gas Clustering Technique



$$V^{\pi}(s) = E_{\pi}\{R_t|s_t = s\} = E_{\pi}\left\{\sum_{k=0}^{\infty} \gamma^k r_{t+k+1} \mid s_t = s\right\}$$

Reinforcement learning in Markov Decision Processes



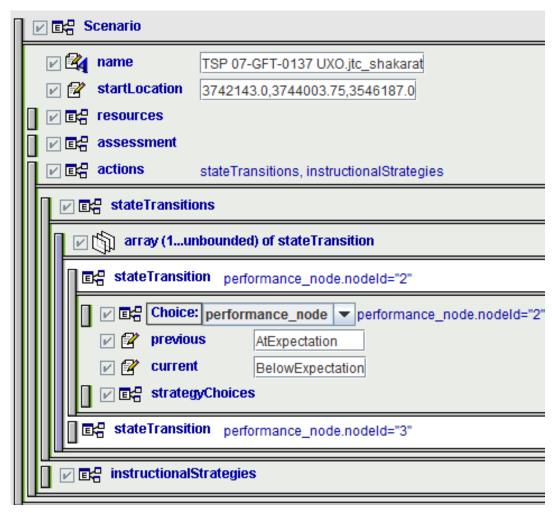




Approach: Domain Knowledge File (DKF) authoring

tool (DAT)

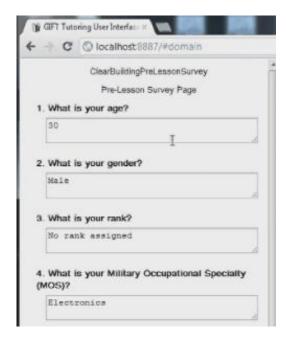
- simple interface for authoring DKFs
- tree structure driven by XML schema
- prevents DKF authoring errors by validating against DKF XML schema
- provides ability to validate DKF content using GIFT source w/o having to launch the entire GIFT architecture







Approach: survey authoring tool



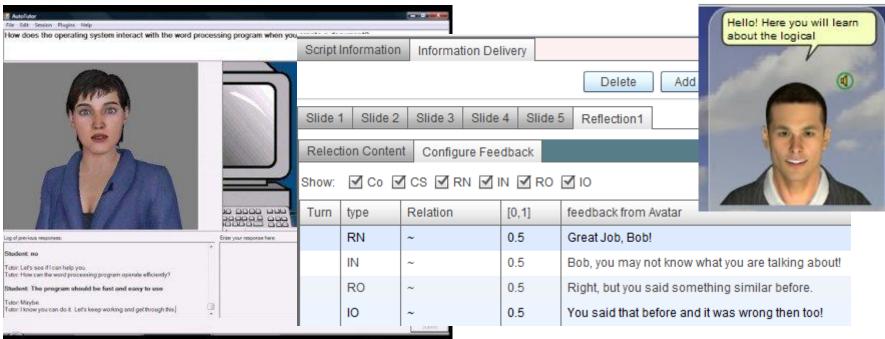
- author questions
- author surveys
- assign surveys
- present surveys

Create Question Reply Set Editor			
ID	Question	Answer Typ	
1	What is your age?	Fill in the bla	
2	What is your gender?	Fill in the bla	
3	What is your rank?	Fill in the bla	
4	What is your Military Occupational Specialty (MOS)?	Fill in the bla	
5	How many hours of sleep did you get last night?	Fill in the bla	
6	Have you had any caffeine in the last two hours?	Fill in the bl	
7	Rate your level of experience with computers	Multiple Cho Single Sele	
8	How often do you play computer/video games?	Multiple Cho Single Sele	
9	What color was the pickup truck?	Fill in the bl	
10	How many people did you see in the compound?	Fill in the bl	
11	Were any people identified carrying weapons? If so, how many?	Fill in the bl	
12	How many people/vehicles are around the target?	Fill in the bl	
13	Describe a vehicle: # doors / color / make (sedan truck SUV van)?	Fill in the bl	
14	Were there any Military Age Males (MAMs)?	Fill in the bl	
15	Were they carrying weapons? How many?	Fill in the bla	





 Approach: leverage elements of AutoTutor & AutoTutor Lite







Dreamers. Thinkers. Doers.







Approach: game-based tutoring



- prototype integration with VBS2
- real-time feedback
- learner model influences challenge level within game





RDECOM GIFT's Authoring Construct



- Hard to demo an architecture but here it is
- Completely separable processes using standardized communications
 - Developers need not be sensor experts AND Instructional Strategy experts
 - Each box an active area of research
- Functional architecture and experimental platform
- Ability to author questions
- Ability to pull in any content which is web-enabled
- Content developed here is directly pulled from another trainer (PEO-STRI)
 - The idea that you can latch ITS tech onto any trainer
 - Two things need to be written assessments and feedback
 - "You bring the content, we bring the tutoring"
- Mission briefing developed with SME aid, things on the mission briefing are assessments
- Surveying the building
- In the event that you can't assess something, you can directly ask (authored questions)



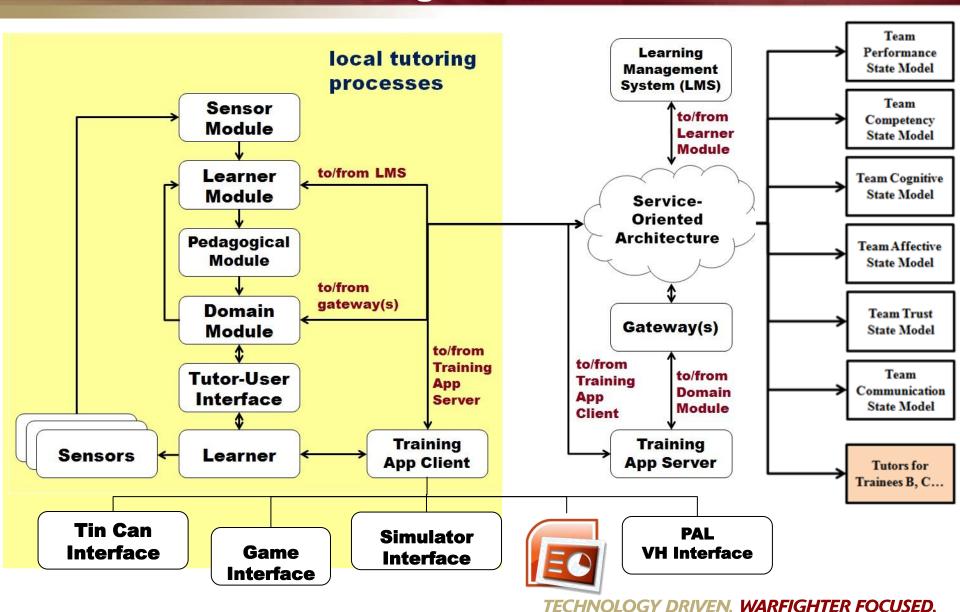
RDECOM GIFT's Authoring Construct



- Nighttime
 - Survey->sensorAssessment->TraineeModule->Ped->Domain->selected intervention
 - Sensor can turn it back to day (same information channel)
- Sensors can trigger instructional events
 - Cue the fog!
- [remediation Feedback] Selecting a door
 - These could all be within-game interactions with 1 line of code changed
- [remediation feedback] shooting the guy
- [Reflective feedback] clearing the room
- [2nd level remediation Feedback] shooting guy 2
 - Supports **n levels** of feedback
- [Feedback]
 - Note that these feedbacks are authored, have an authoring tool, and are stored in the 'Domain Knowledge File (DKF)'. They are somewhat customizable
 - Mention SIMILE?
- Filling out a report (additional functionality supported by TUI)
- Experimenter questions
 - Authorable
- AAR
 - Can be fed via this information
- LMS
 - Data is stored about the student





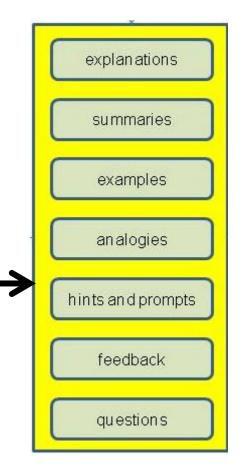






Tutoring Process (Person, et al, 1995, p. 167)

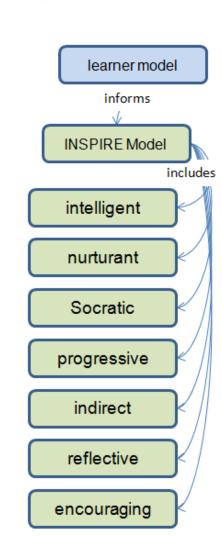
- 1. Tutor asks a question.
- 2. Student answers the question.
- 3. Tutor gives feedback on the answer.
- 4. Tutor and student collaboratively improve the quality of (or embellish) the answer.
- 5. Tutor assesses student's understanding of the answer"







- Approach: model successes of expert human tutors to support pedagogy
 - INSPIRE model (Lepper, Drake & O'Donnell-Johnson, 1997)
 - · facts about human tutoring (Person & Graesser, 2003)
 - importance of questioning (Dillon, 1988)
 - relation between deep reasoning questions and exam scores (Graesser & Person, 1994)
 - nine events of instruction (Gagne, 1985)
 - politeness strategies (Person, et al, 1995)







- Approach: investigate the influence of <u>learning</u>
 <u>class</u> in selecting effective instructional strategies
 for computer-based tutoring
 - · Learning Classes
 - · cognitive learning (Anderson and Krathwohl, 2000)
 - affective learning (Krathwohl, et al, 1964;
 Goleman, 1995)
 - psychomotor learning (Simpson, 1972)
 - · social learning (Sottilare, et al, 2011; Soller, 2001)
 - hybrid learning



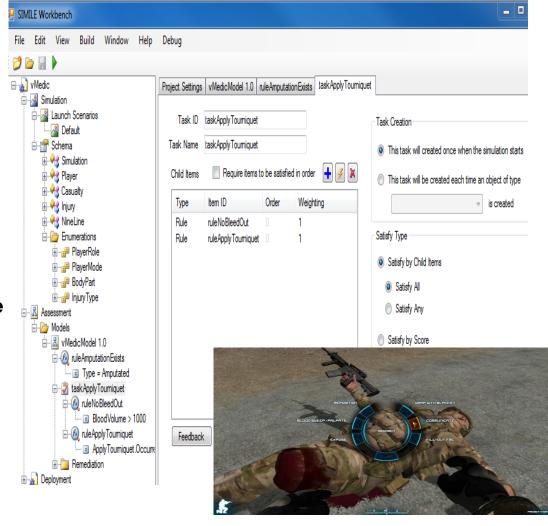


• Approach: leverage objective-task framework in

SIMILE

 Student Information Models for Intelligent Learning Environments (SIMILE)

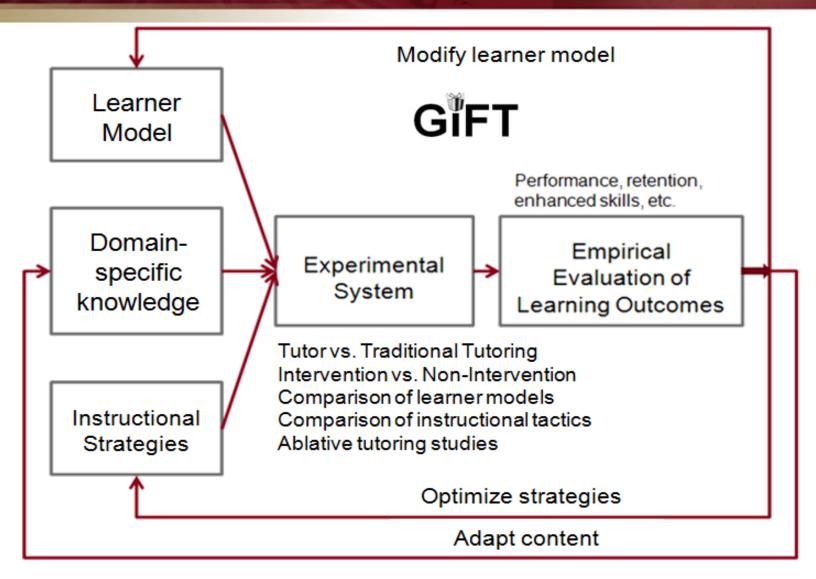
- standardized, adaptable, and generic mechanism for learner assessment in simulated training environments
- middleware with tools for the creation of assessment models that are distinct and separate from the simulation itself
 - Example Shown: Model rules for applying a tourniquet in the TC3 vMedic Trainer





GIFT's Assessment Construct





Methodology derived from: Hanks, Pollack, and Cohen (1993).



GIFT's Assessment Construct



Approach: event report tool

- post-hoc analysis tool
- provides a user interface to select important pieces of data from gift output file(s) such as the message logs, sensor data and **IOS/EOS** bookmarks
- creates a single output file (currently csv) with the selected events of interest
- output file can be consumed by third party applications for sorting by time, filtering by values, statistical analysis, etc.

Generate Report For domainSession137_2012-07-06_10-43-48.log				
Select the Events of Interest				
ACK CloseDomainSessionReque DisplayTextTutorRequest InitializeDomainSessionReq ProcessedACK SensorFileCreated SensorFilterData Siman StartDomainSession		Customize		
Customize the Default Columns				
Column Name Time Domain Session Time Domain Session Write Time Event Type Content	Column Heade Time DS_Time DS_Write_Time Event_Type Content	^ V ^ V ^ V		
Empty Cell Value .				
Report File Name EventReport	Tool.out.csv			

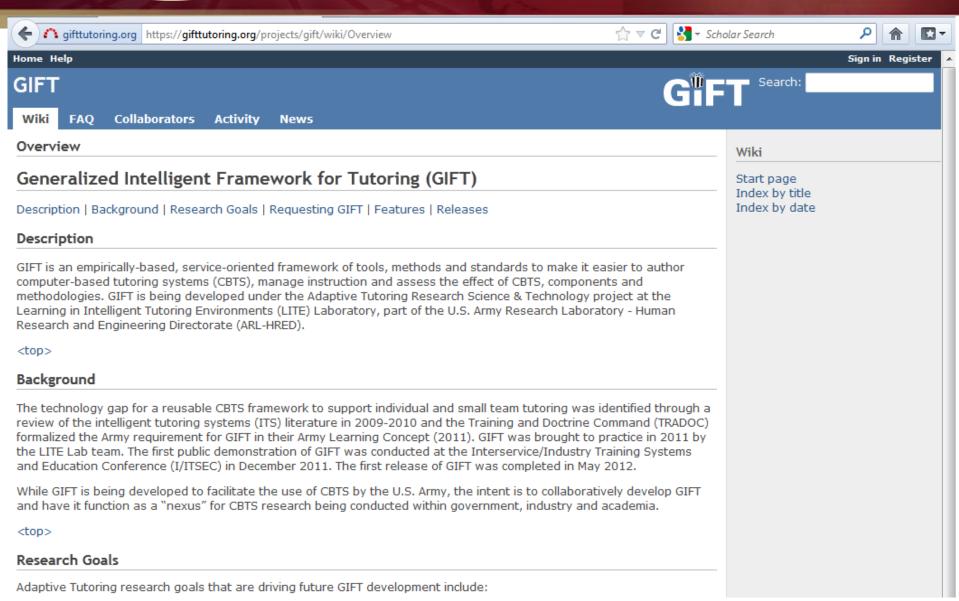
Create File

Cancel



GIFTtutoring.org









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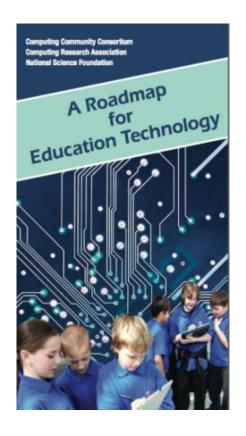


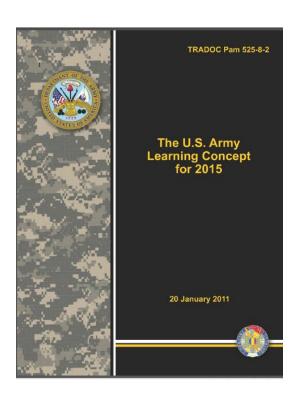
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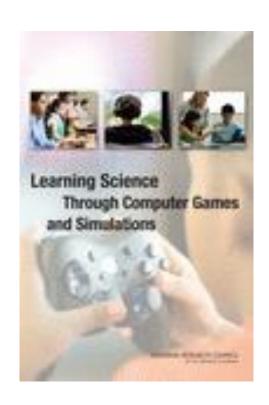


Recommended Reading ARL









Woolf (2010)

TRADOC (2011)

Committee on Science **Learning (2011)**



Stuff we talked about... 4R



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- GIFT Assessment Construct
- How to get GIFT
- References





Thank you for your attention

Questions?