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McLean, VA

Integrated Cognitive-neuroscience Architectures for Understanding Sensemaking (ICArUS):

Phase 1 Challenge Problem Walkthrough

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MTR140413 MITRE TECHNICAL REPORT

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1 Introduction

This document provides a broadly accessible overview of the Integrated Cognitive-neuroscience Architectures for Understanding Sensemaking (ICArUS) Phase 1 challenge problem. The pages include screen shots (denoted by black rectangles) from the ICArUS Phase 1 Test and Evaluation (T&E) Graphical User Interface (GUI), including the tutorial that participants viewed before and during experiments.

This document is not meant to stand alone. For a detailed description of the ICArUS Phase 1 challenge problem, please refer to the following document:

Burns, K., Greenwald, H., & Fine, M. (2014). *ICArUS Phase 1 Challenge Problem Design and Test Specification*. MITRE Technical Report, MTR140410.

More information about materials developed for Phase 1 T&E is available in the following document:

Burns, K., Fine, M., Bonaceto, C., & Oertel, C. (2014). *Integrated Cognitive-neuroscience Architectures for Understanding Sensemaking (ICArUS): Overview of Test and Evaluation Materials*. MITRE Technical Report, MTR140409.

These documents are available at: <u>http://www.mitre.org/publications</u>.

For reference purposes, Table 2 from the Phase 1 Challenge Problem Design and Test Specification is reproduced below. This table outlines the 6 tasks (also known as "missions") that comprise the primary Phase 1 challenge problem. An additional Task 7, outlined in Section 9 below, is described in Appendix A of the Phase 1 Challenge Problem Design and Test Specification.

In general, tasks of the Phase 1 challenge problem require predicting which of several enemy groups is most likely to attack a given location, or which of several locations a group will most likely attack. Tasks 1-3 require statistical learning, as evidence is accumulated over time from reports of individual attacks. Tasks 4-6 require integrating various layers of intelligence, as evidence about a single attack is provided by multiple independent sources coincident in time. Task 7 combines aspects of earlier tasks while introducing a notion of self-initiated sensemaking.

All materials used in human experiments were approved by MITRE's Institutional Review Board prior to use.

Task	Description
1	Learning two groups . [10 blocks of 10 trials]. Attacks by two groups (A, B) are generated (SIGACTS), one on each trial, by two normal distributions – each with a different base rate, center location, and dispersion. On the last trial of each block the subject is shown an attack location and asked to predict the probability of attack by each group, {A%, B%}. The subject then makes a forced choice (A or B), to allocate resources against the attack. At the end of the trial the subject sees ground truth (A or B) at the attack location and he reports surprise (on a 7-point Likert scale).
2	Learning four groups. [5 blocks of 20 trials]. Unlike Task 1, there are four different groups (A, B, C, and D). Also, before reporting {A%, B%, C%, D%}, the subject is required to draw four circles – each representing the "two-to-one boundary" for a group (i.e., attack by the group is twice as likely inside the circle compared to outside the circle). After reporting the probabilities {A%, B%, C%, D%} and making a forced choice in allocating resources against one group, the subject is shown ground truth (A, B, C, or D) at the attack location and he reports surprise.
3	Finding centers . [5 blocks of 20 trials]. Unlike Task 2, the task is to find group centers along roads "as the cow walks" (rather than "as the crow flies"). After each block of trials, the subject clicks four points A, B, C, and D on the roads – each representing the "center of gravity" for a group (i.e., maximum likelihood location for a group's center, given the group's attacks). The subject then reports {A%, B%, C%, D%} at the attack location. After reporting the probabilities and making a forced choice in allocating resources, the subject is shown ground truth (A, B, C, or D) at the attack location and he reports surprise.
4	Scoping attacks . [10 trials, 2 stages per trial]. Unlike Task 3, the subject is given the center (from HUMINT) for one group, along with four possible locations 1, 2, 3, and 4 of attack by that group. In stage 1, the subject is required to estimate the probability of attack at each location based on a normal distance decay function along roads. In stage 2, the subject is given the regional boundaries for groups (SOCINT), along with the inside/outside region attack likelihoods from PROBS. The subject is required to aggregate the prior (HUMINT) and SOCINT probabilities. The subject allocates resources in percentages (not a forced choice) across the sites, and is shown ground truth (1, 2, 3, or 4). The subject reports surprise after observing ground truth.
5	Fusing layers . [10 trials, 4 stages per trial]. Unlike Task 4, the subject is given an attack location (SIGACT) along with group centers (HUMINT) for four groups (A, B, C, D). The subject is also given the probabilities of attack by each group {A%, B%, C%, D%}, based on the HUMINT distance function. The subject is then given four more INTS (IMINT, MOVINT, SIGINT, SOCINT), one at a time, along with the likelihoods (from PROBS) for features of INTS. At each stage the subject updates probabilities {A%, B%, C%, D%}. After the last stage the subject allocates resources in percentages {A%, B%, C%, D%} against the groups. At the end of the trial the subject is shown ground truth and he reports surprise.
6	Choosing layers . [10 trials, 3 stages per trial]. Much like Task 5, except the subject decides which layer of INT (IMINT, MOVINT, SIGINT, or SOCINT) to receive on each of three stages, after receiving the initial HUMINT. The criterion for each choice is to maximize the expected amount of useful information to be gained from the choice of an INT.

Purpose

You will be playing the role of a geospatial intelligence analyst over the course of seven missions.

In each mission, you must <u>make judgments</u> concerning the attacks by enemy groups. There are 2-4 enemy groups that are active in the area of interest at any given time. They are known as Aqua, Bromine, Citrine, and Diamond, or A, B, C, and D for short.

Your task is to <u>make sense</u> of various intelligence sources in order <u>to predict</u> which group is most likely to attack or which location a group will attack. An important aspect of your decision making will be <u>to assess</u> the relative chance, or probability, of attack by all groups in the area.

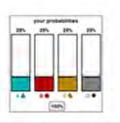
For example, if there are four groups then you will need to report the probability of attack by each group: A, B, C, D.

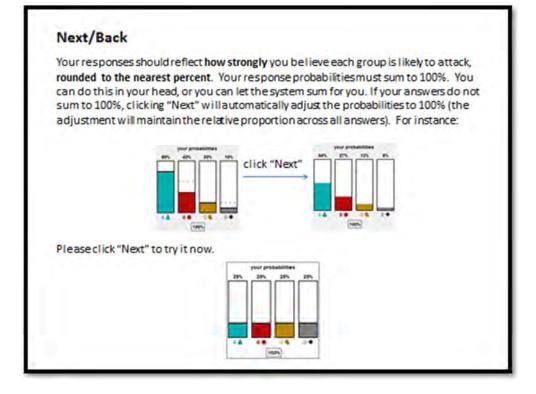
Entering probabilities

You will enter probabilities using the interface shown below. There are 3 methods of entering probabilities; you may choose any combination of methods you like.

- 1. You can use the mouse to drag each slider up or down.
- 2. You can "click" within a slider to automatically move it to that point.
- 3. You can use the scroll wheel on your mouse to make fine adjustments within a slider.

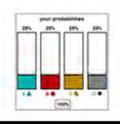
Pleasetry each method now.





Next/Back

You may click "Back" if you wish to make any adjustments. When satisfied, click "Next" to report these levels as your final judgments. Please note that once you have clicked "Next" a second time, you may not go back to change your answers.



Scoring for Judging the Probabilities of Attack Each mission will consist of 10 – 20 instances or trials in which you provide judgments of attacks. At the end of each mission, you will be scored on how well you judged probabilities. Your judgments will be compared to the calculations of an optimal analyst that has the same information as you. Thisscore will be averaged over multiple attacks, and will only be given at the end of a Mission. For example: A = 40%, B = 30%, C = 20%, D = 10%and the optimal analyst's judgments are: A = 10%, B = 20%, C = 30%, D = 40%. Using a similarity-based scoring system, your score for just this attack would be so f 100 points.

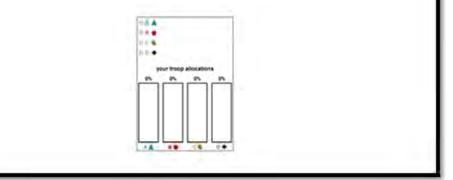
Allocating Troops

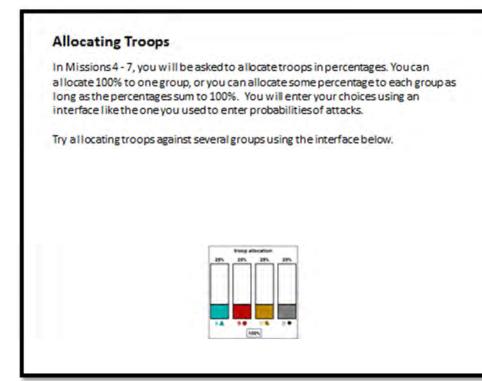
score would be 100 of 100 points.

After reporting probabilities of each attack, you will be asked to <u>allocate troops</u> against a group or to a location. You will receive a score based on the correctness of your troop allocation choices.

In Missions 1 - 3, you will be asked to choose a single group or location to allocate all your troops to.

Try allocating troops against a single group now using the interface below (select a radio button).





Scoring for Troop Allocation

After entering your responses, you will be shown which group attacked, and will receive a score. The score is based on the **percentage or proportion** of troops you allocate. For example:

 Assume you allocate troops against a single group (Missions 1 - 3) {A = 100%, B = 0%}

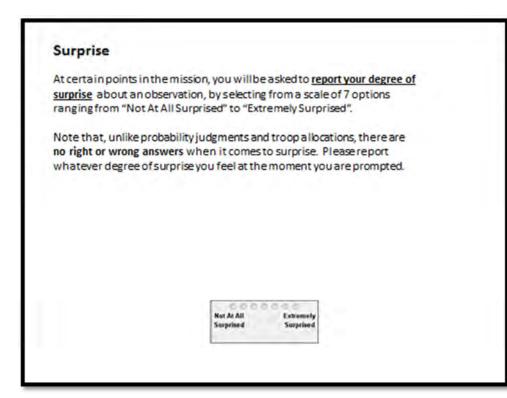
If the attack was by group A, you would score 100 out of 100 points in allocating troops.

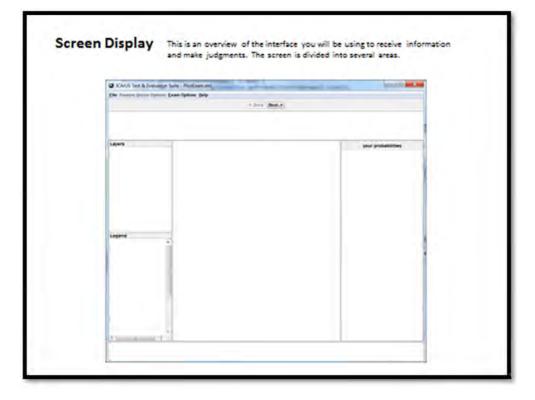
If the attack was instead by group B, you would score 0 points.

 Assume you allocate troops in percentages (Mission 4 – 7) {A = 40%, B = 30%, C = 20%, D = 10%}.

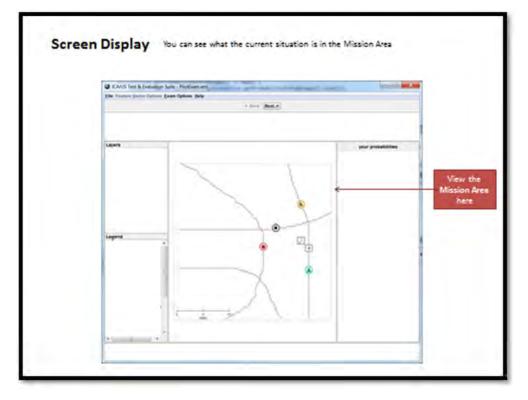
If the attack was by group A, you would score 40 out of 100 points in allocating troops.

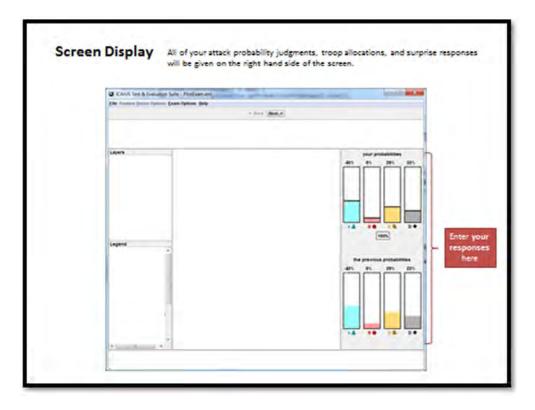
If the attack was instead by group B, you would score 30 points.

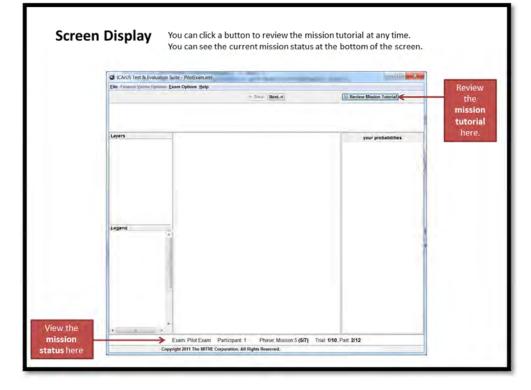






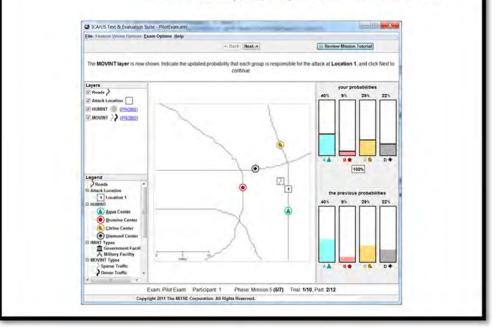






Screen Display

This is a complete example of the display you will see for a typical mission. There's no need to study it now, since you will become more familiar with it later.



Missions

During the experiment you will be asked to complete 7 different missions. More specific instructions will be given at the start of each mission.

You will be given a break after Mission 3, then another break after Mission 5. You are free to take more breaks, but please try to wait until the end of a mission.

Please ask the study proctor if you need help at any time during the experiment.

IMPORTANT: Please <u>do not use</u> a pen, pencil, paper, calculator, or any other external device. The study is intended to measure how well you can perform without any aids.

Click Next to begin Mission 1.

Learning two groups. [10 blocks of 10 trials]. Attacks by two groups (A, B) are generated (SIGACTS), one on each trial, by two normal distributions – each with a different base rate, center location, and dispersion. On the last trial of each block the subject is shown an attack location and asked to predict the probability of attack by each group, {A%, B%}. The subject then makes a forced choice (A or B), to allocate resources against the attack. At the end of the trial the subject sees ground truth (A or B) at the attack location and he reports surprise (on a 7-point Likert scale).

Mission 1: Attacks by Two Groups

You will see attacks at various locations in the mission area. One attack will be shown each time you click 'Next'. Each attack is caused by group A or Be, as indicated on the screen.

On every 10th attack you will be provided an attack location, but not the identity of the attacking group (A or B). Your job is to judge the probability that the attack is by group A or B.

You will do this 10 times as 100 attacks are accumulated on the screen.

Mission 1: Group Tendencies

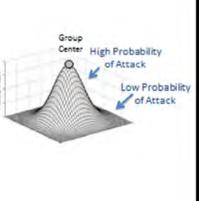
At the start of the Mission, you will not know anything about a group's attack tendency. By studying the pattern of attacks, you will gradually become able to judge the probability of attack by each group. Each group will behave differently. For example:

 Each group has a different operational center that remains constant throughout Mission 1. The probability of attack is highest near the center, and decreases farther from the center along a bell curve (see illustration). Note: the group center will not be visible; it must be inferred from the pattern of attacks.

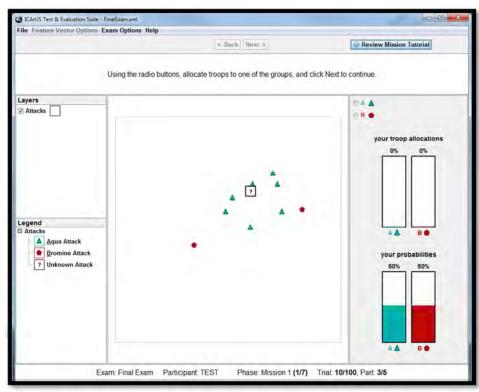
 One group may attack farther from its group center than another (spread out more).

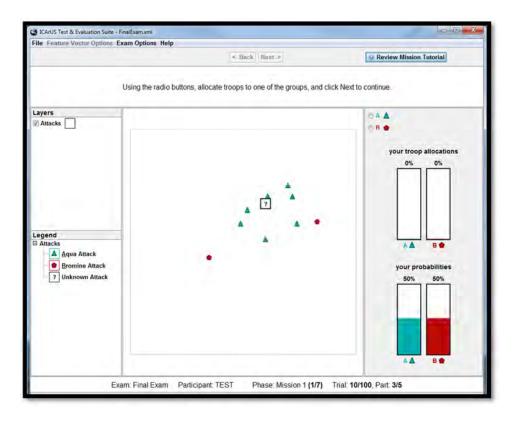
One group may attack more frequently than another.

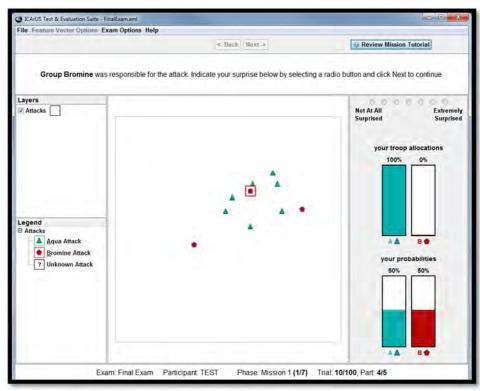
 You should always judge based on all the attacks you have seen, not just the most recent attacks.











Learning four groups. [5 blocks of 20 trials]. Unlike Task 1, there are four different groups (A, B, C, and D). Also, before reporting {A%, B%, C%, D%}, the subject is required to draw four circles – each representing the "two-to-one boundary" for a group (i.e., attack by the group is twice as likely inside the circle compared to outside the circle). After reporting the probabilities {A%, B%, C%, D%} and making a forced choice in allocating resources against one group, the subject is shown ground truth (A, B, C, or D) at the attack location and he reports surprise.

Mission 2: Attacks by Four Groups

Mission 2 is much like Mission 1, but now you are working in a completely different area with four new attacking groups (stillcalled A^{4} , B^{4} , C^{4} , D^{4}).

As in Mission 1:

 Each group has a different operational center that remains constant throughout the mission. The probability of attack is highest near the center, and decreases farther from the center along a bell curve. Note: the group center will not be visible; it must be inferred from the pattern of attacks.

 One group may attack farther from its group center than another (spread out more).

One group may attack more frequently than another.

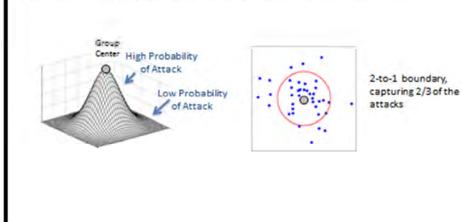
 You should always judge based on all the attacks you have seen, not just the most recent attacks.

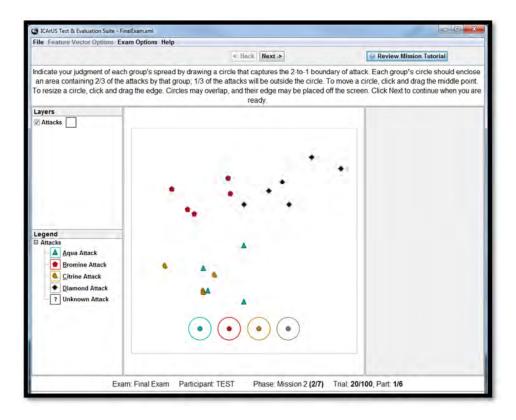
You will be asked to report probabilities on every 20th attack. You will do this 5 times as 100 attacks accumulate on the screen.

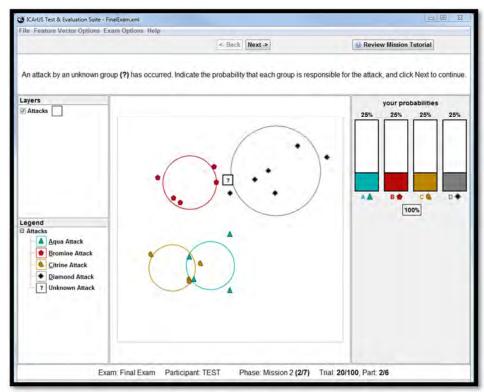
Mission 2: Continued

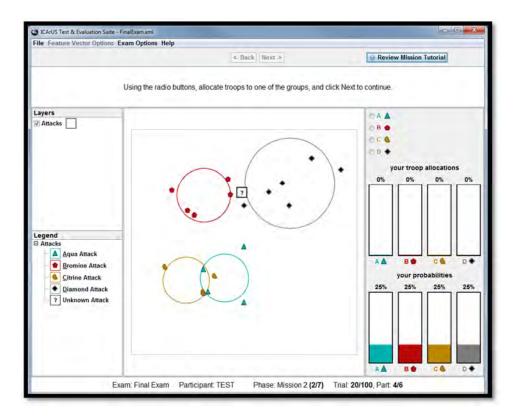
In Mission 2, in addition to reporting probabilities, you will be asked to judge the position of each group's center and its spread.

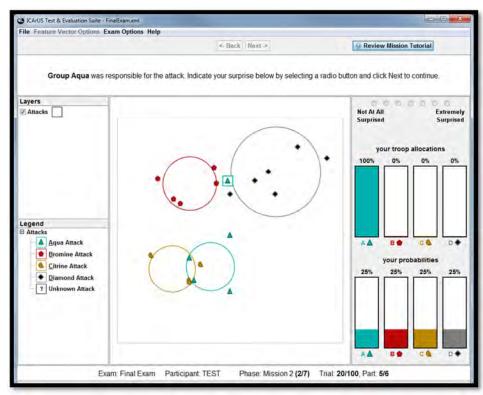
You will indicate your judgment of each groups' spread by drawing a circle that captures the 2-to-1 boundary of attack. This circle encloses an area containing 2/3 of the attacks; 1/3 of the attacks will be outside the circle.











Finding centers. [5 blocks of 20 trials]. Unlike Task 2, the task is to find group centers along roads "as the cow walks" (rather than "as the crow flies"). After each block of trials, the subject clicks four points A, B, C, and D on the roads – each representing the "center of gravity" for a group (i.e., maximum likelihood location for a group's center, given the group's attacks). The subject then reports {A%, B%, C%, D%} at the attack location. After reporting the probabilities and making a forced choice in allocating resources, the subject is shown ground truth (A, B, C, or D) at the attack location and he reports surprise.

Mission 3: Attacks on Roadways

In Mission 3, you are once again working in a completely different areawith four new attacking groups (still called AA, B , C , D).

Mission 3 is much like Mission 2, except that everything now happens on a road:

- Groups are centered along roads.
- All attacks will appear on or near roads.

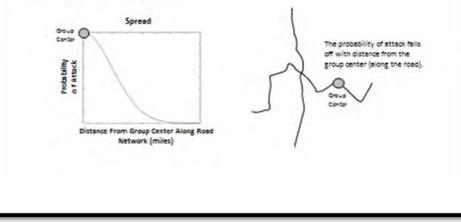
You should always judge based on all the attacks you have seen, not just the most recent attacks.

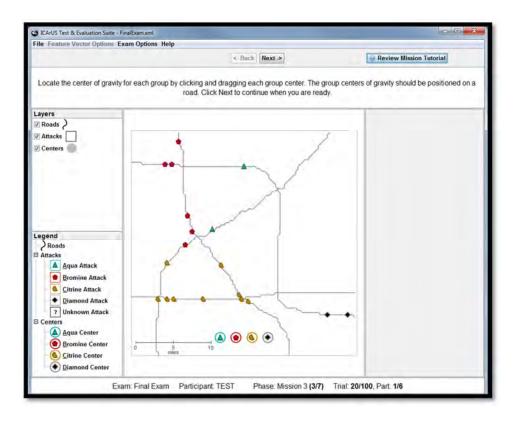
On every 20th attack, you will see the location of attack by an unknown group and be asked to report the probability of attack by each group. You will do this 5 times as 100 attacks accumulate on the screen.

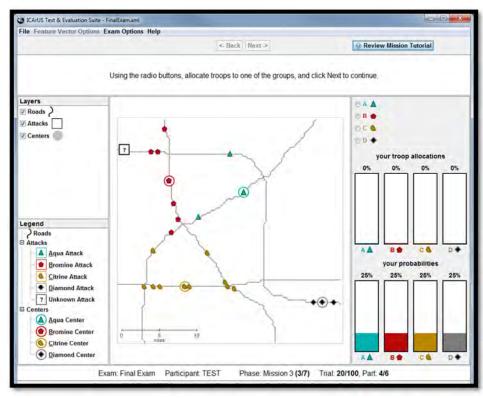
Mission 3: Distance Along Roads

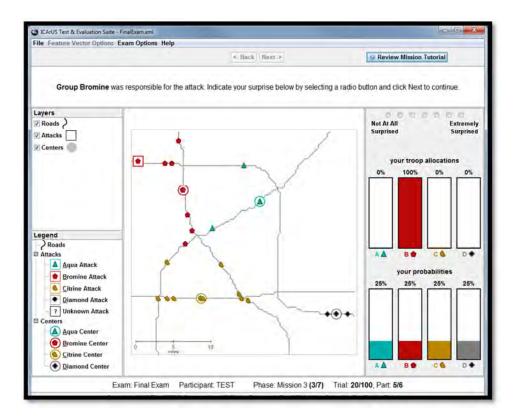
You will also be asked to indicate the center for each group. Like Missions 1 and 2, each group has a different center and attack frequency. However, here in Mission 3, each group has the same spread (shown below):

 A group's probability of attack depends on the distance from the group center, as measured along roads rather than "as the crow flies" (the shortest distance between two points).









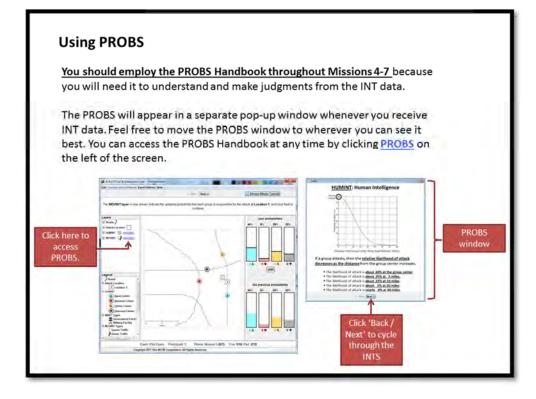
5 Handbook

Handbook: PROBS and INTS

Missions 4-7 are very different from Missions 1-3. Rather than acquiring data on individual attacks over time, your knowledge of groups' attack patterns comes from an Intelligence Handbook called **PROBS** (short for probabilities). PROBS provides you with rules for how to interpret data from various **intelligence sources (INTS)**.

INTS come in five types and provide "clues" as to which group may have attacked or where they will likely attack in a given trial.

- 1. HUMINT: Human intelligence reports the location of each group center.
- 2. IMINT: Image intelligence reports the type of building at a location.
- 3. MOVINT: Movement intelligence reports the density of traffic at a location.
- 4. SIGINT: Signal intelligence reports a group's use of cell phones.
- 5. SOCINT: Socio-cultural intelligence reports the groups' favored regions.



Using PROBS

Click the <u>PROBS link</u> now to open the PROBS Handbook while you review the following pages. Then click 'Next' to continue.

Generic Constraints

There are two INTs that apply to all groups. These are HUMINT and SOCINT.

 For HUMINT, the probability of attack decreases as the attack location gets farther from a group's center (as measured along roads). It decreases with distance along a bell curve like in Mission 3.

• For SOCINT, the probability of attack by a group is larger (by a factor of 2to-1) in the group's own region compared to each other group's region.

Specific Constraints

The PROBS for IMINT and MOVINT capture tendencies that are specific to each group. For example:

 For IMINT, groups A and B prefer (by a factor of 4-to-1) to attack near government buildings as opposed to military buildings, and vice versa for groups C and D.

 For MOVINT, groups A and C prefer to attack (by a factor of 4-to-1) in dense traffic as opposed to sparse traffic, and vice versa for groups B and D.

The PROBS for SIGINT are different because SIGINT will report on only one group.

 When SIGINT on a group reports cell phone activity (chatter), attack by that group is more likely than each other group (by a factor of 7-to-1). When SIGINT on a group reports silence, attack by that group is less likely (by a factor of 1-to-3) than each other group.

INTS are Independent

IMPORTANT: The INTS you receive provide all the information you need to perfectly judge the probability of attack in Missions 4-7.

IMPORTANT: Each INT source provides an **independent clue** about which group conducted an attack. Specifically, the INT data you see at any time depends only on the group that attacks and is not affected by what the other INTS say.

For example, the type of traffic (MOVINT) is not affected by the type of nearby building (IMINT), so the likelihood of seeing an attack in dense traffic near a government building **depends only on the group that attacks.** It does not depend on the likelihood of seeing dense traffic given a government building.

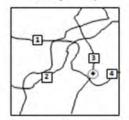
Click Next to begin Mission 4.

Scoping attacks. [10 trials, 2 stages per trial]. Unlike Task 3, the subject is given the center (from HUMINT) for one group, along with four possible locations 1, 2, 3, and 4 of attack by that group. In stage 1, the subject is required to estimate the probability of attack at each location based on a normal distance decay function along roads. In stage 2, the subject is given the regional boundaries for groups (SOCINT), along with the inside/outside region attack likelihoods from PROBS. The subject is required to aggregate the prior (HUMINT) and SOCINT probabilities. The subject allocates resources in percentages (not a forced choice) across the sites, and is shown ground truth (1, 2, 3, or 4). The subject reports surprise after observing ground truth.

Mission 4: One Group and Four Attack Locations

In Mission 4, the attacking group is known to be D, but the attack may come at one of four locations (1, 2, 3, or 4). Your job is to judge the probability of attack at each location. You will have access to two intelligence sources (INTS) in this mission.

Your first step is to estimate the probability of attack at each location based on data from HUMINT and the knowledge contained in your Intelligence Handbook (PROBS). HUMINT illustrates the location of D's group center, and PROBS for HUMINT specifies how the probability of attack depends on the distance (along roads) from the group center. Example map



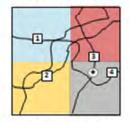
HUMINT shown

Mission 4: One Group and Four Attack Locations

After reporting probabilities, you will be given another clue in the form of SOCINT data. The probability of attack in the group's own region is twice as high compared to attacks in another group's region.

You will be asked to report your surprise upon receiving the SOCINT data. For example, after HUMINT you may think location "3" is the most likely location of attack. In that case you may be surprised if SOCINT reports that location "3" is outside group D's preferred region of attack.

Next, using SOCINT, you'llbe asked to update your previous judgment (the probability of attack at each location), which was based only on HUMINT. Your updated judgment should consider **both HUMINT and SOCINT.** Example map

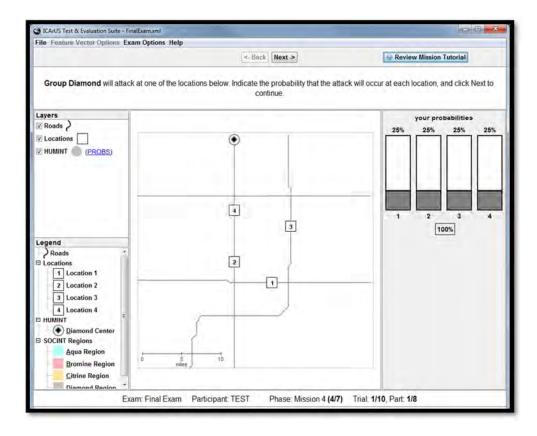


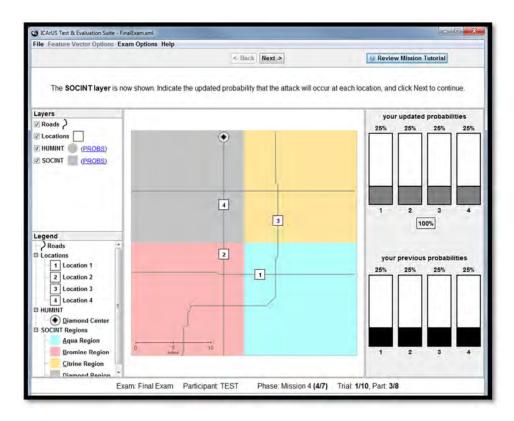
HUMINT and SOCINT shown

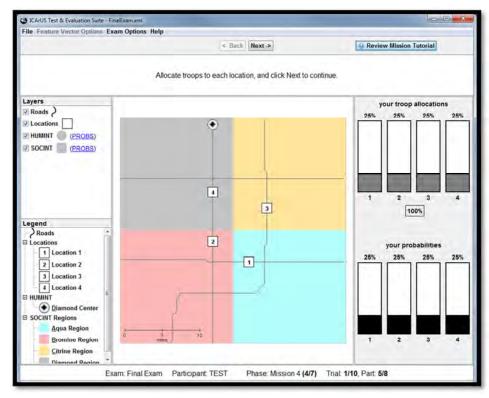
Mission 4: Continued

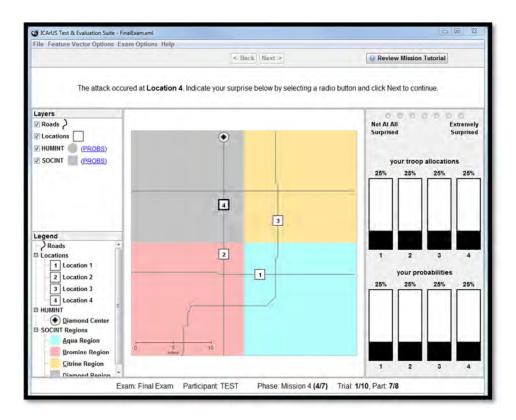
After reporting your updated probabilities, you will be asked to allocate troops in percentages. You can allocate any percentage of troops to a location, but the total troop allocation over the four locations must sum to 100%.

You will be asked to do this 10 times Each trial is independent; that is, each attack will occur in a new area of interest, with different roads and attack locations.









Fusing layers. [10 trials, 4 stages per trial]. Unlike Task 4, the subject is given an attack location (SIGACT) along with group centers (HUMINT) for four groups (A, B, C, D). The subject is also given the probabilities of attack by each group {A%, B%, C%, D%}, based on the HUMINT distance function. The subject is then given four more INTS (IMINT, MOVINT, SIGINT, SOCINT), one at a time, along with the likelihoods (from PROBS) for features of INTS. At each stage the subject updates probabilities {A%, B%, C%, D%}. After the last stage the subject allocates resources in percentages {A%, B%, C%, D%} against the groups. At the end of the trial the subject is shown ground truth and he reports surprise.

Mission 5: Four Groups and One Attack Location

In Mission 5, there will be a single attack location and four possible attacking groups (still called A▲, B♠, C▲, D♠). Now you will be given more INT data about each attack.

HUMINT will report the locations of group centers, as in Mission 4. But in Mission 5 probabilities will be automatically computed using the HUMINT distance function. These calculations are exact.

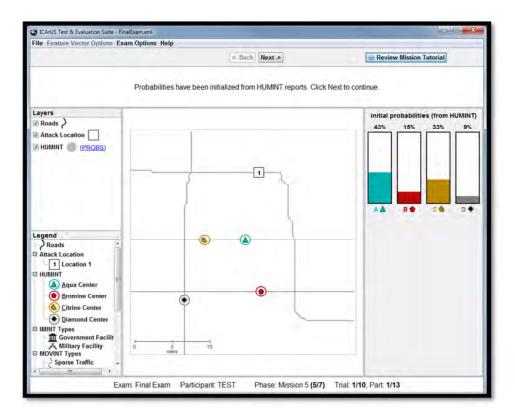
Subsequently, you will see data from four more INTS - one at a time, but in an order that will change:

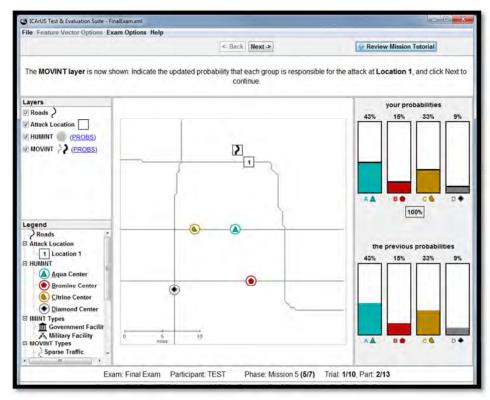
IMINT MOVINT SIGINT SOCINT

Mission 5: Continued

After receiving a new INT you will be asked to revise your previous probability judgments in light of the new INT, taking into consideration the new INT and all previous INTs.

You will be asked to do this 10 times Each trial is independent; that is, each attack will occur in a new area of interest, with different roads and attack locations.





8 Mission 6

Choosing layers. [10 trials, 3 stages per trial]. Much like Task 5, except the subject decides which layer of INT (IMINT, MOVINT, SIGINT, or SOCINT) to receive on each of three stages, after receiving the initial HUMINT. The criterion for each choice is to maximize the expected amount of useful information to be gained from the choice of an INT.

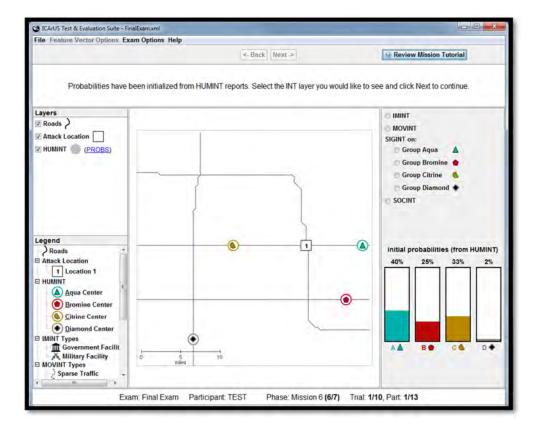
Mission 6: You Choose INTS

Mission 6 is much like Mission 5, except that after HUMINT is displayed, you will choose any 3 of 4 INTS from a menu, one at a time.

After you select an INT it is no longer available for selection from the menu. Remember that SIGINT is obtained on a single group of your choice. After choosing to obtain SIGINT on one group, SIGINT will no longer be available on that group or any other group.

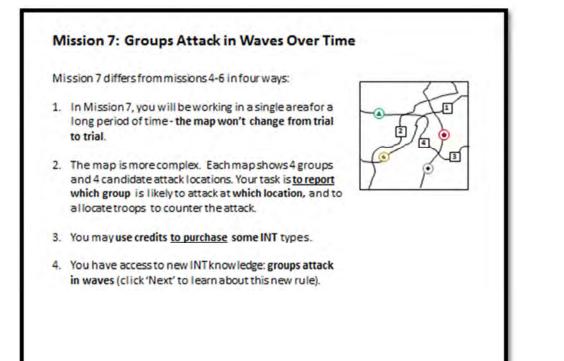
You should choose INTS at each step to maximize the amount of information you expect to receive for judging attack probabilities across groups.

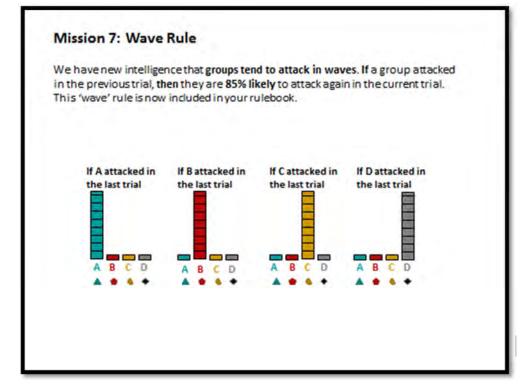
You will be asked to do this 10 times Each trial is independent; that is, each attack will occur in a new area of interest, with different roads and attack locations.

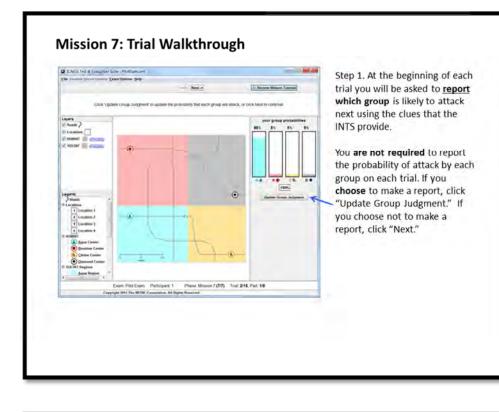


9 Mission 7

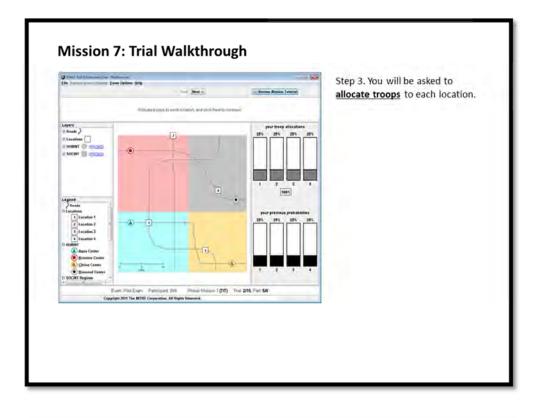
Self-initiated sensemaking. [15 trials]. Task 7 is a combination, in part, of Tasks 4 and 6, but with a focus on *self-initiated* sensemaking. Participants will be given the centers of four groups (A-D) and four possible attack sites (1-4). As in Task 4, the primary task is to predict the location of attack and to allocate resources to each location {@1%, @2%, @3%, @4%}. But unlike Task 4, participants will decide *if and when* to seek additional data, as well as which data (INT) to seek. See the Phase 1 Challenge Problem Design and Test Specification document for a more detailed description of Task 7, including a summary of the major structural differences between Task 7 and Tasks 1-6.

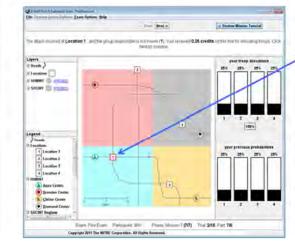










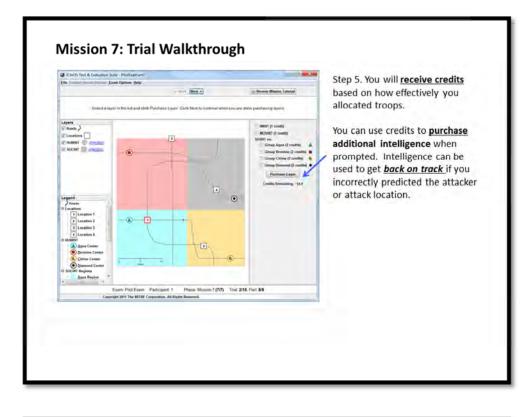


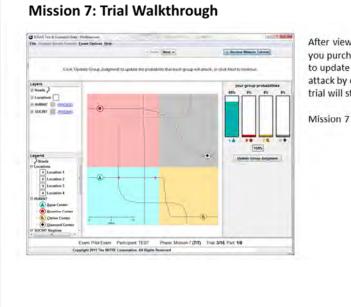
Mission 7: Trial Walkthrough

Step 4. Next, the actual attack location will be revealed.

If the attacker is known, it will appear inside the attack location; otherwise, a red '?' will appear, indicating the attacker was unknown.

Note: The last 5 attack locations will remain on the screen at all times.





After viewing the intelligence you purchased, you'll be asked to update the probability of attack by each group, and a new trial will start.

Mission 7 will last for 15 trials.

Mission 7: Notes about Credits

You have a limited number of credits to spend, so use them wisely. You will start the mission with 10 credits.

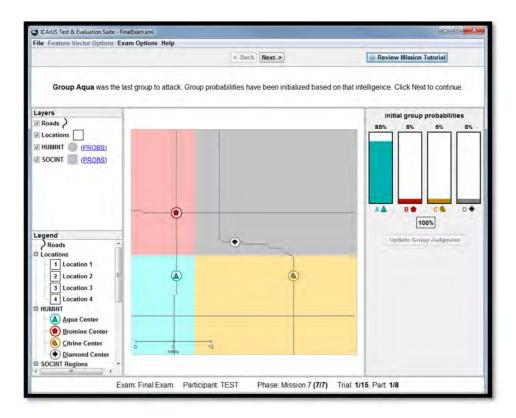
You may purchase as many layers as you have credits for. Each layer costs 1-2 credits.

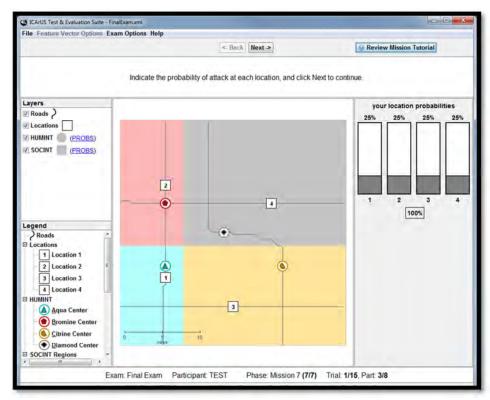
All credits expire at the end of the mission. You will not receive a higher score if you have credits remaining.

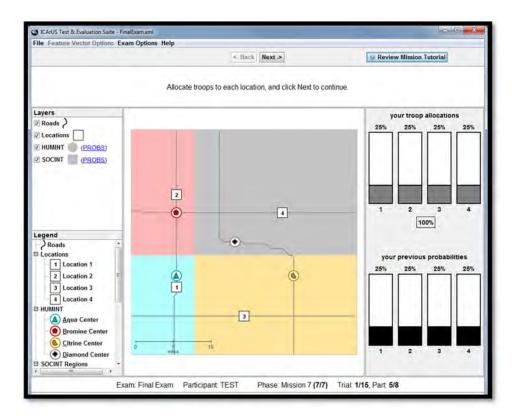
Mission 7: Beginning and Ending

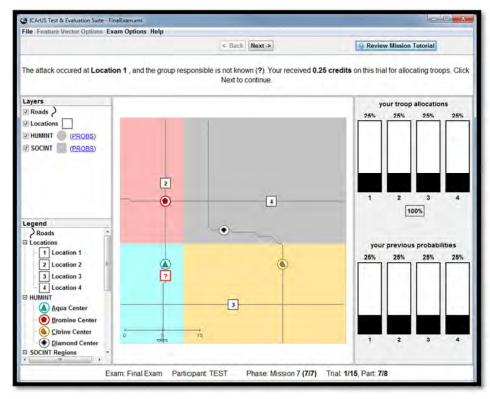
On trial 1, you will start in the middle of an attack wave. At step 1 of the trial, you will be told which group attacked just before you were assigned to the mission, and the probabilities will automatically pre-populate according to the new wave rule.

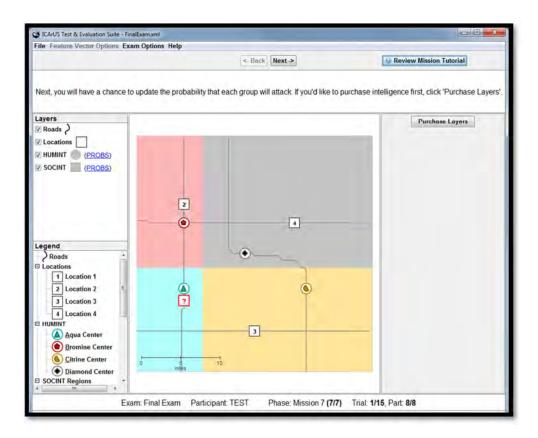
You can click 'Review Mission Tutorial' at the top of the GUI window to review this tutorial at any time during the mission.











10 Appendix A: PROBS

