

# An Ontology for Hypothesis Management in the Maritime Domain

Richard J. Haberlin Paulo Cesar G da Costa Kathryn B. Laskey June 22, 2011 Agenda



- Hypothesis Framework
- Maritime Domain Ontology
- Hypothesis Management Engine
- Simulation
- Results



## **Hypothesis Framework**

## Hypothesis Collection Framework







Hypothesis Knowledge Base

- Instantiated for each hypothesis in Hypothesis Knowledge Base
- Framework knowledge structure captures content and strength
  - Hypothesis vector describes a specific instantiation of a possible scenario
  - Weight vector allows us to update/compare its credibility

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#### **Query Hypothesis**



- A domain-specific inquiry is posed by the system operator
  - Initiates the inferential reasoning process
  - Used to search for candidate hypotheses
  - Captured as an *m*-tuple
  - Compared with the stored metadata
- Associated *m x 1* Priority Vector
  - System operator prioritization of attribute fields
  - Used by HMM to retrieve and prioritize hypotheses from HKB

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#### Maritime Domain Example

- **Environment:** 
  - Mediterranean Sea
  - Atlantic Ocean
  - East Coast of North America
- **Organization:** Islamic Jihad Group
- Base of Operations: Izmir, Turkey
- Plan: smuggle radiological material
  - Arriving in Baltimore, Maryland
  - Bulk cargo vessel Mustafa Kamal
  - Build radiological dispersal devices









## **Maritime Domain Ontology**



#### **Ontology Background**

- Merchant ships are a feasible means to smuggle illicit goods and personnel between nations
  - Multinational company ownership
  - Transit between coastal nations (global exposure)
  - Multinational and transient crews

#### Ontology

- Defines a common vocabulary for describing entities and relationships within a specific domain
- Shares a common understanding of the structure of information
- Ability to reuse the domain knowledge and structure for subsequent operation

#### • Maritime Domain Ontology

- Captures the maritime domain to assist in the situational awareness problem
- Describes the platforms and states of maritime vessels
- Ports of departure and arrival are limited to those in the Mediterranean Sea and Atlantic Ocean
- Cargo is shipped from departure ports in the Mediterranean to ports in North America
- HKB constructed of class instantiations with defined attribute values and additional relationships

#### Maritime Domain Ontology





## **Ontology** Classes



#### • Breadth: 74 Classes (47 cargo types); 6 Super Classes

#### Cargo

- May be legal or illicit
- Country
  - Contains Places of Interest & corporate offices
  - Flag maritime transports
  - Base terrorist organizations
- Maritime Behavior
  - Mariners maximize profit and minimize risk
  - Deviations are suspicious
- Maritime Transport
  - Merchant vessels, fishing vessels, combatants
- Organization
  - Define social structure of individuals
  - Located in countries, may consist of or be affiliated with terrorists, and may own/operate maritime transports.
- Place of Interest
  - Represent departure and destination points
  - May be targets for terrorist organizations





## **Ontology Implementation**

- Captured in Protégé Version 4.1.0 (Build 213)
- Provides domain-specific ontology for inferential reasoning systems
  - Specifies domain using realworld data
  - Produces more realistic output
- Future builds
  - Smaller fishing (only) ports
  - More rigorous evaluation of relationships between terrorist organizations and companies

Unit	Number	Source
Cargo Classes	47	Subject-matter Expert Data
Country Individuals	78	CIA World Factbook 2010 [2]
Maritime Behavior Properties	41	Subject-matter Expert Data
Maritime Transport Classes	4	Subject-matter Expert Data
Terrorist Org. Individuals	46	U.S. Dept. of State List [5]
Company Individuals	121	Directory of Top Int'l Maritime
		Shipping Lines & Ship Owners [9]
Port Individuals	73	CIA World Factbook [2]
City Individuals	37	Subject-matter Expert Data
Target Individuals	51	Subject-matter Expert Data

## **Domain Relationship Implications**



- MDO contains many relationships between classes
  - Some imply increased likelihood of association with terrorism
  - Some imply a ship is of interest in maritime domain awareness
- Relationships indicating a suspicious relationship
  - Company Affiliated with Terrorism owning a Maritime Transport
  - Country Sponsoring Terrorist Organization flagging a Maritime Transport
  - Target of Terrorist is near Terrorist Organization
  - Port is near Terrorist Organization
  - Company has offices in Country Sponsoring Terrorist Organization



## **Hypothesis Management Engine**

### Hypothesis Management Engine





- Creates, updates, administrates, filters and routes hypotheses
- Coordinates with HKB for retrieval and storage of hypotheses
- Delivers set of contextually relevant hypotheses for inferential reasoning as a result of an operator query

#### **Process Incoming Data Activity**





- Continuously creates and updates hypotheses from data
- Operations within the shaded interruptible region execute continually on incoming streaming data until shutdown

#### **Retrieve Hypothesis Activity**



- Reasoning Controller requests candidate hypotheses
- HME coordinates with the HKB for retrieval, filters and prunes the hypotheses within the context of the query, and forwards the filtered hypotheses

#### **Archive Hypothesis**





 Allows non-time sensitive attributes of hypotheses to be archived in the HKB in anticipation of building upon them upon return to the area of operations



## Simulation





- Provides an opportunity to observe HME in a synthetic environment
  - Scenario with HME running for a short period of time
  - Number of hypotheses (100) gathered in the HKB
- Receives a varying number of inputs that must be processed for inclusion and for possible relationships
- HKB searched for candidate matches to a randomly generated hypothesis query





- Randomly created a contextually accurate HKB of 100 entries
  - Classes, properties, and individuals from the MDO
  - Each entry has 30% probability for each of 22 attribute fields
- Assumptions affecting HKB density
  - Size of the track pool determines the frequency with which the unit identification numbers are repeated
    - A track pool of 10,000 entries was allowed, making duplication unlikely.
  - Each unit captain has an identification number
    - Pool of 1000 captains makes duplication of a captain significantly more likely when updating incoming information.
  - The probability of inclusion of 30% discussed above determines if an attribute is to be included in a hypothesis
    - Greater inclusion would create a KB of more-dense hypotheses

### Generate Random Query Hypothesis

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- Randomly created a query hypothesis for each run
  - Classes, properties, and individuals from the MDO
  - Each entry has 70% probability for each of 22 attribute fields
  - High likelihood that each attribute is of interest to operator
- Single query hypothesis created and executed against the randomly created, 100-entry HKB and its additional inputs using the *Retrieve Hypotheses* algorithm

Sort Query Hypothesis attributes by Priority Vector value
For each priority value above a threshold {
For each non-zero attribute {
 Check each HKB entry for matching value
 If values match, return hypothesis as candidate}}



## Results

#### Results





- Natural log of p size shown for simulation run with P{Inclusion} = 0.30 and starting HKB size of 100 entries
- Linear profile of the HKB size denotes exponential growth rate  $\sim O(N^2)$
- Exponential plot for natural log of run-time indicates a higher-level polynomial relationship for processor time represented by the black trend line



- Context-variable relationships drive the computational complexity of the HME
  - Reductions in overhead only realistically achieved by reducing the number of context variables for the *Process Incoming Data* activity
- Linear profile of the HKB size denotes exponential growth rate (O(N2))
  - Primarily caused by creation of context relationships evolving from multiple hypothesis possibilities
  - Volume of classes, properties and specified individuals also affect performance
  - Complexity driven primarily by number of context variables included
- Exponential plot for the natural log of run-time indicates a higher-level polynomial relationship for processor time



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