

Resource Integration and Inference in Vanilla World

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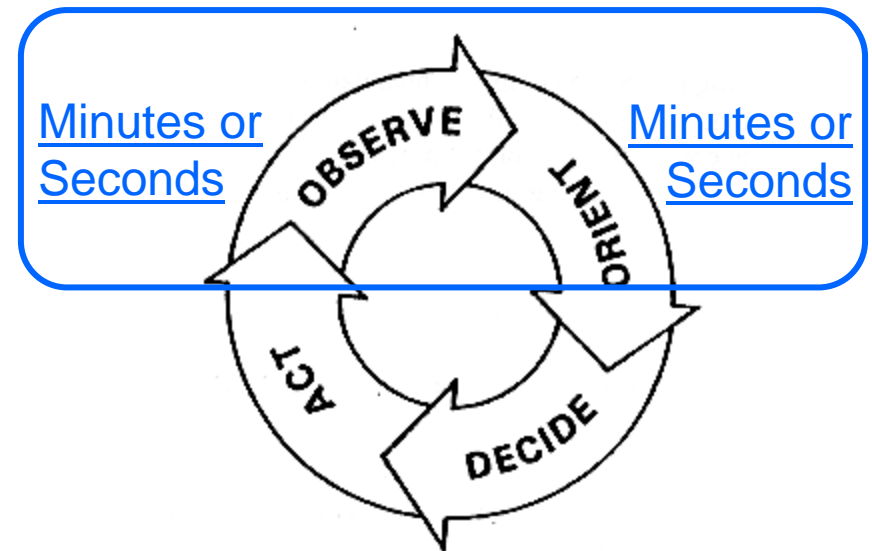
The logo for Applied Physics Laboratory (APL) at Johns Hopkins University, consisting of the letters 'APL' in a large, bold, serif font.

The Johns Hopkins University
APPLIED PHYSICS LABORATORY

Hypothesis

- Information Exists That Can Be Fused to Create *Real-Time, Actionable Threat Assessments* and Alerts.
- The Information Necessary to Achieve These Assessments and Alerts is Available from:
 - Strategic Sensors
 - Direct Human Observation
 - Unmanned Sensors
 - Intelligence Data Bases
 - Informal “In-Country” Data Sets
 - Open Source
- As Currently Used This Data Cannot Be Used Fused Rapidly Enough to Provide Tactical Prediction

Blue OODA Loop



Tactical analysis can't be done by humans *here*.

Design Features

Prototype a Decentralized, Agent-based System With The Following Characteristics:

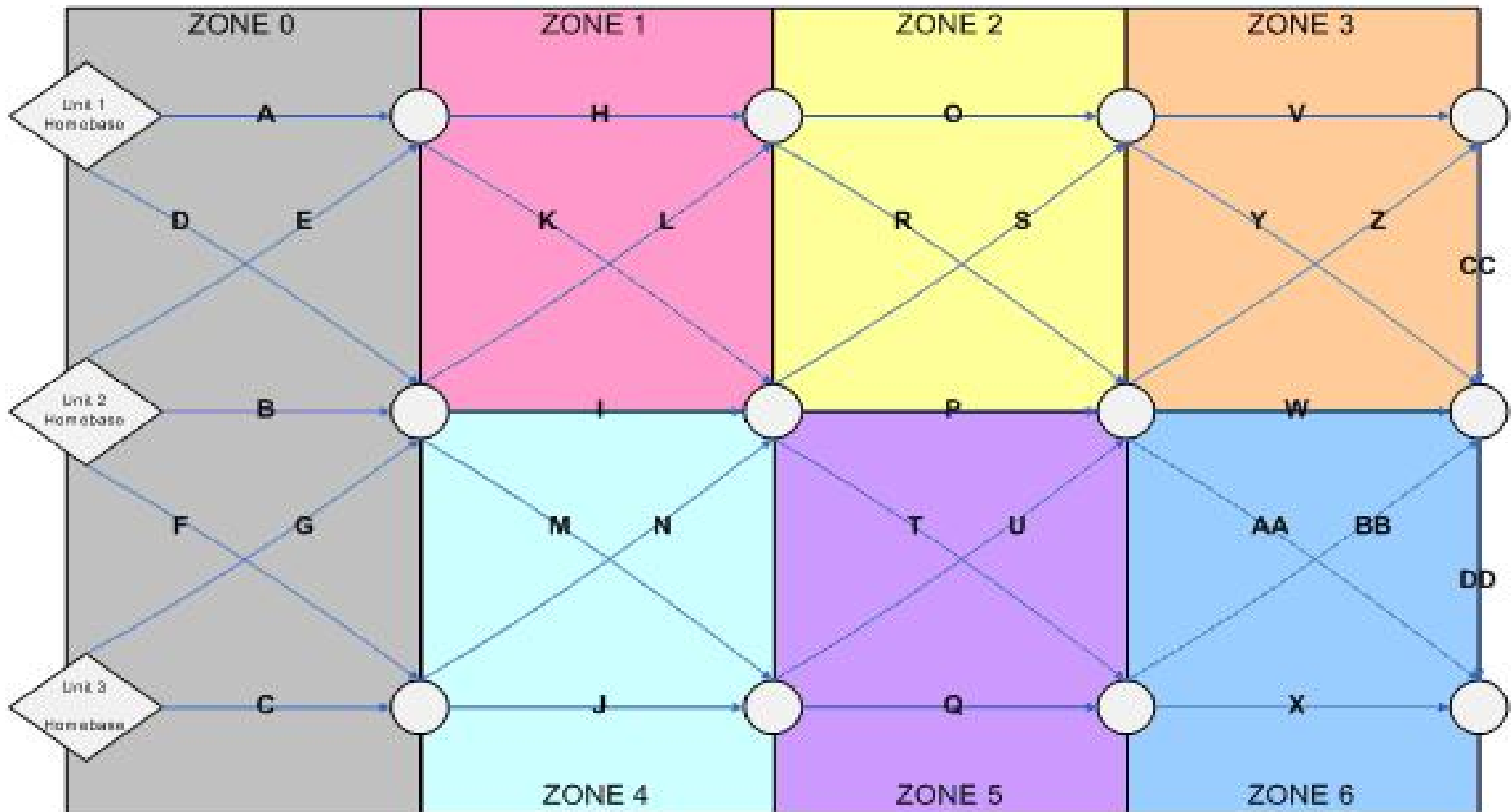
- Massively Parallel, Addressing Many Users Simultaneously and *Individually*
- Fully Autonomous Threat Assessment
- Real-Time Contextually Aware
- Fusing Information from Diverse Sources
- Adaptive, Incorporating New Users and Changing Information Sources at Run Time
- Lightweight and Easily Understood



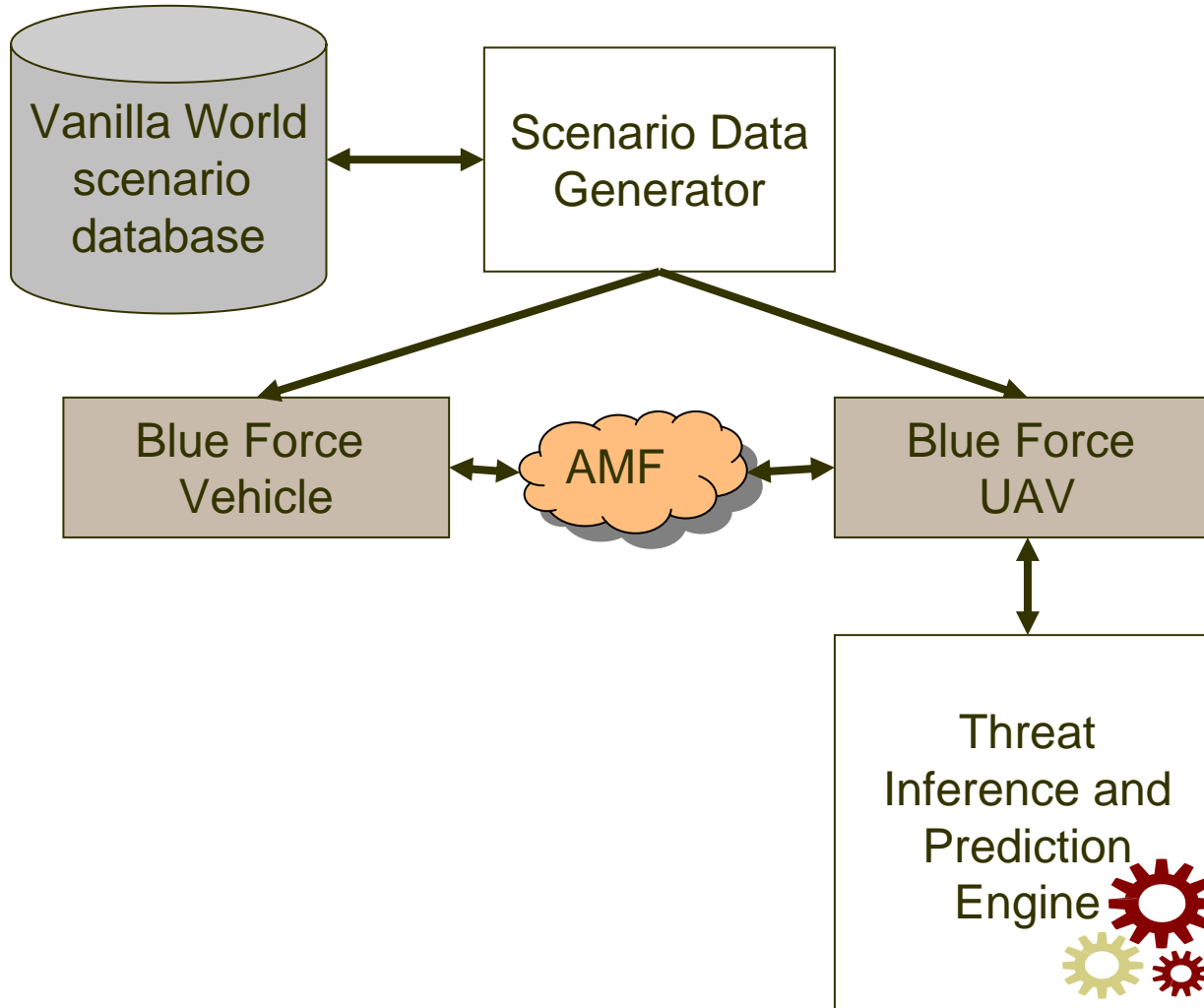
Vanilla World

- **Hypothetical Country with undesirable events**
- **Scenario contains:**
 - Patterns of activity leading up to events
 - Significant amount of random “normal” activity
 - 40 days of historical data and 30 days of “real-time” data
 - 2000 non-POI people, 20 POI
- **Data Modeled**
 - Passenger Aircraft manifests
 - Phone calls (~8500 in last 30 days)
 - HUMINT free-text information
 - Activity reports (digging, emplacement events) (~100 events)
 - Threat events and small arms fire events (~25 events)
 - Events take place in a notional country

Vanilla World Map



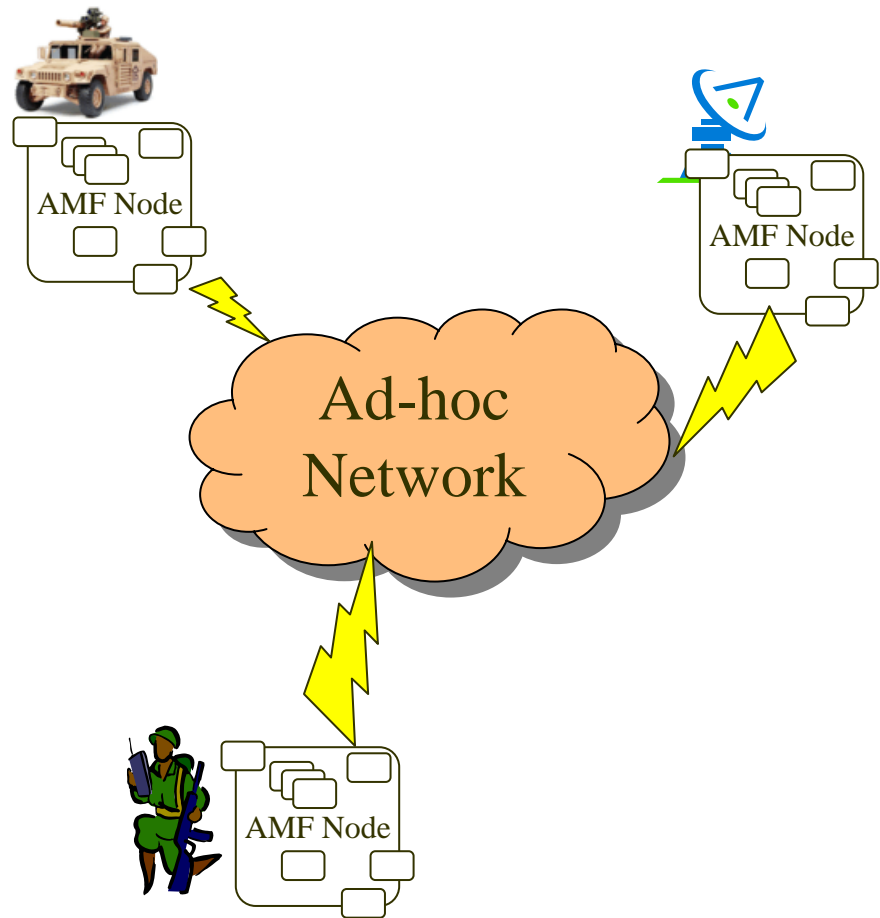
Testbed Architecture



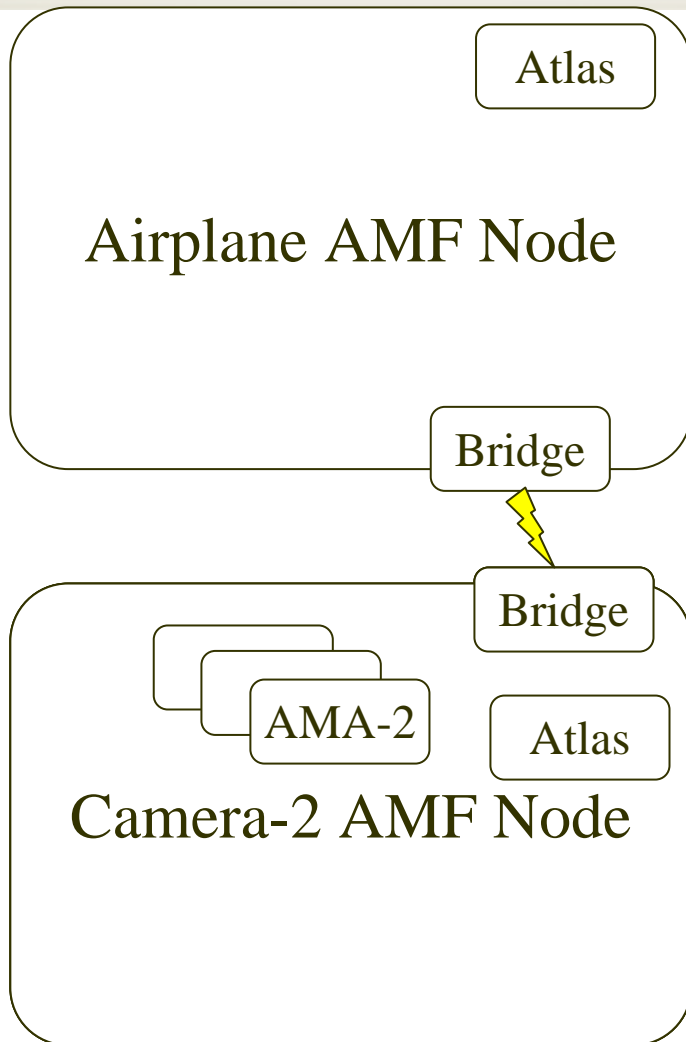
Active Metadata Agents

Design Features

- Agent-Based Architecture
- Discovery – To Support the Incorporation of New Information Providers, Users and Fusion Engines
- Smart Filtering
 - Mission Awareness
 - Threat Awareness
 - Proximal Awareness
 - Temporal Awareness
- Support for Autonomous Data Fusion
- Criticality-Based Information Exchange



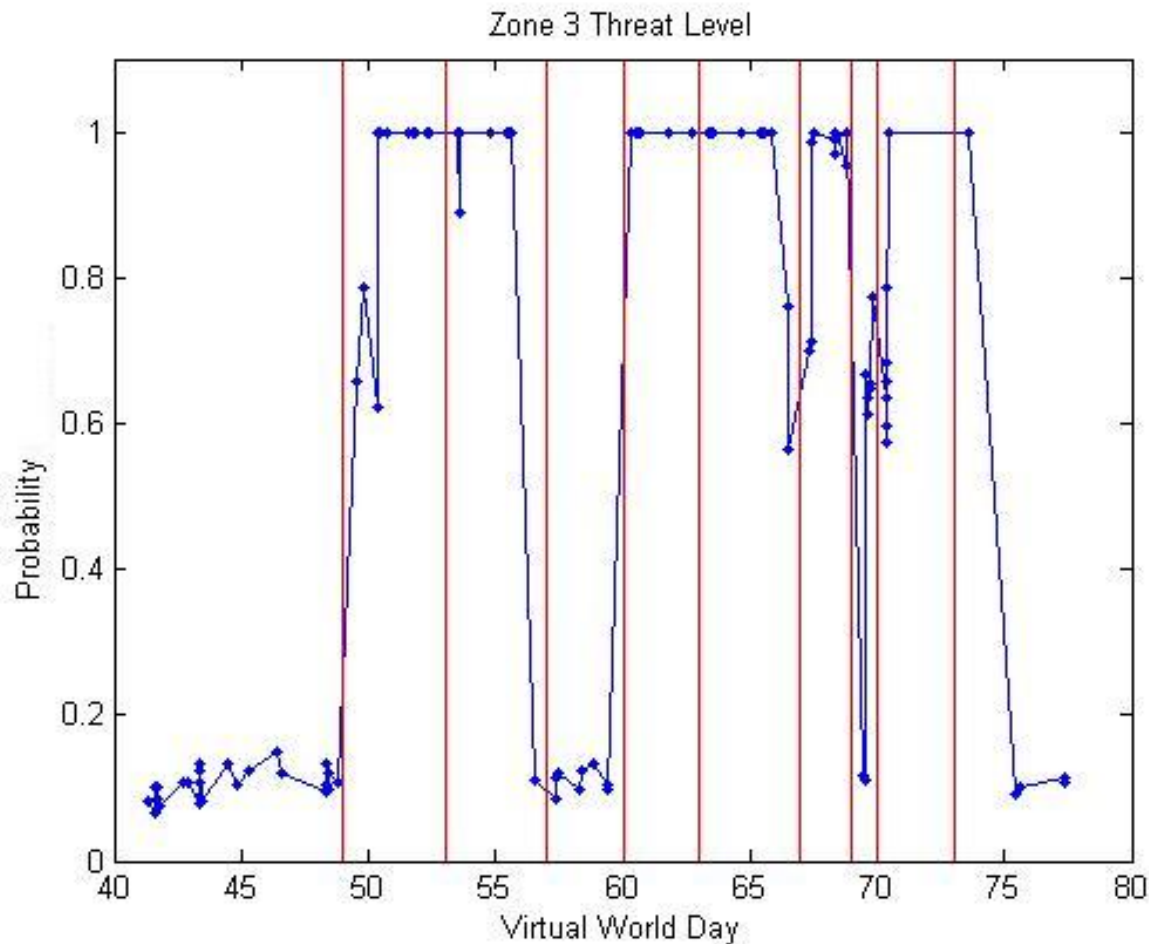
AMF Use Case



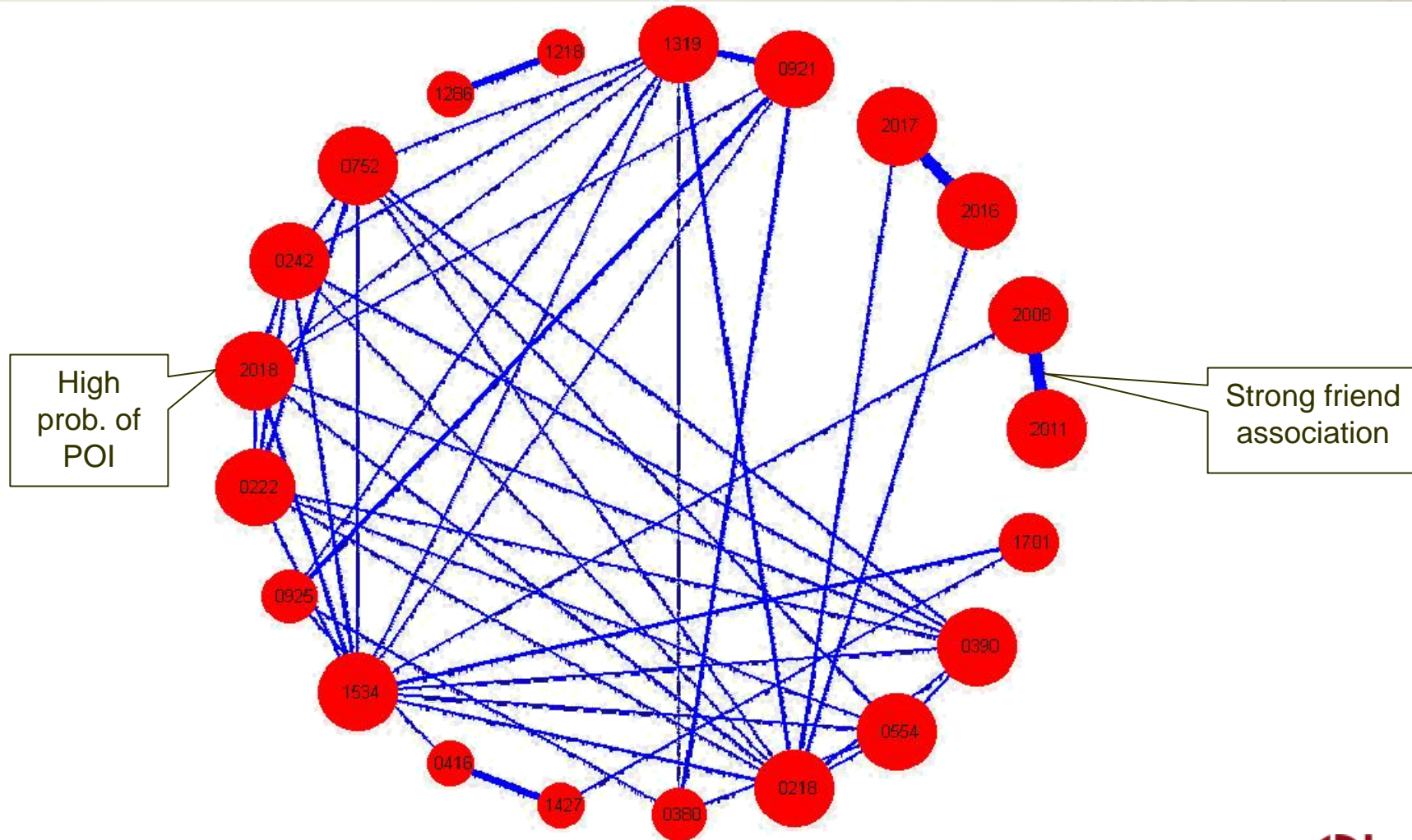
Markov Logic Networks

- We use *Markov Logic Networks* to do inference
 - Hybrid reasoning system combining Markov Networks (probabilistic reasoning) and First Order Logic (deductive reasoning)
- Uses weighted first order logic statements to describe the world
 - Statements may not always hold
- Example of prototype MLN statements:
 - Friends of Persons of Interest are Persons of Interest
 - $\text{friends}(\text{person1}, \text{person2}) \wedge \text{POI}(\text{person2}) \sim \rightarrow \text{POI}(\text{person1})$
 - If a POI dug in a location recently, that location is threatened
 - $\text{dig}(p, \text{loc}, \text{day}) \wedge \text{POI}(p) \wedge \text{currentday}(\text{today}) \wedge \text{recent}(\text{day}, \text{today}) \sim \rightarrow \text{threatened}(\text{loc})$
- Preliminary results: 20% of POIs (4 of 20) are identified vs. 0.5% False Positives (10 of 2000).
- MLN's can also output social network information.

Output of MLN: Threat Level



Output of MLN: Social Networks



Threat Pattern Discovery

- Previous tests used MLN's that were constructed using common sense patterns
- We wish to create a system that can automatically identify existing and novel patterns of threat activity
- Currently applying stochastic optimization techniques to create MLN's that have better results than hand-crafted MLN's.
- Other options include pattern discovery techniques from data mining or other pattern discovery techniques

Options for Future Work

- **Improve pattern discovery and pattern recognition Algorithms**
- **Create distributed pattern discovery and recognition techniques**
- **Synthesize components into a robust end-to-end solution**