

---

# Information Fusion of CB and non-CB Assets

Chemical and Biological Defense Science and  
Technology Conference

Gerald R. Larocque, Ph.D.

MIT Lincoln Laboratory

(781) 981-5843

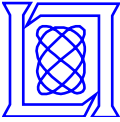
[larocque@LL.mit.edu](mailto:larocque@LL.mit.edu)

19 November 2009

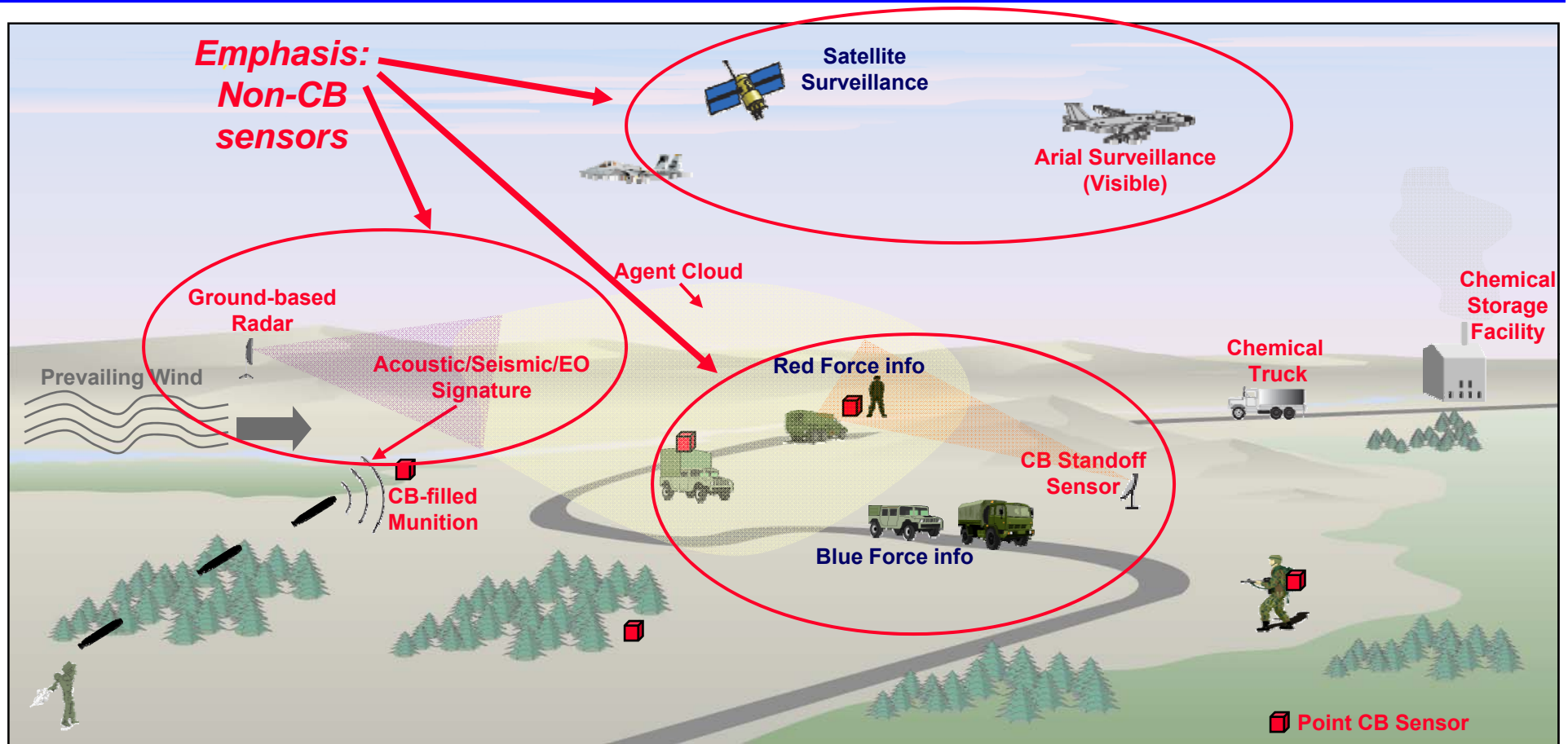
This research is sponsored by DTRA under United States Air Force under Contract FA8721-05-C-0002. Opinions, interpretations, conclusions and recommendations are those of the author and are not necessarily endorsed by the United States Government.

---

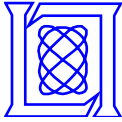
MIT Lincoln Laboratory



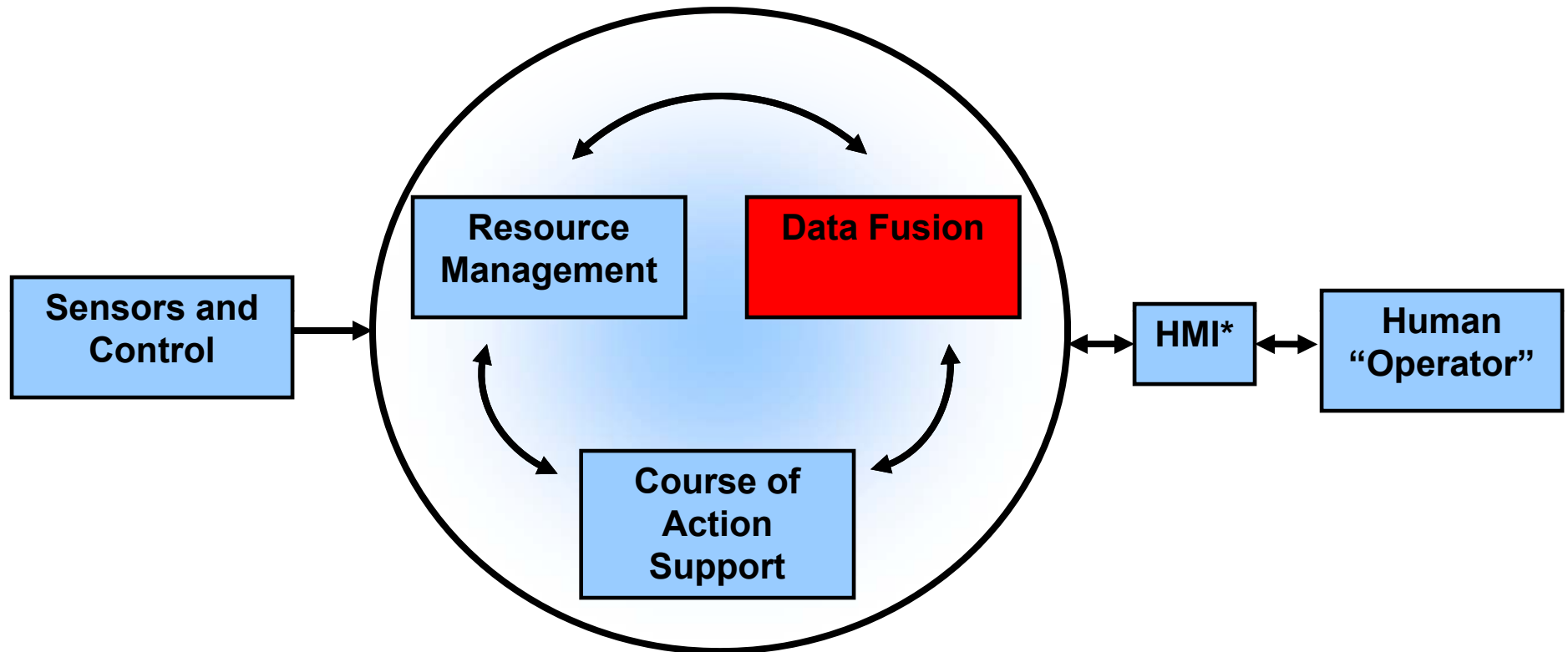
# The Problem



Full value of CB sensing will require fusion of disparate CB and related CB information sources



# Decision Support “Vision”



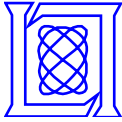
Physical Domain

Informative Domain

Cognitive Domain

 Presentation Emphasis

\* Human-machine Interface



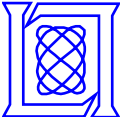
# MARS-JFP\* Objectives

---

- ***Overall: Develop and demonstrate effective fusion systems for CB/non-CB sensors***
  - Initial emphasis on introduction of non-CB resources
  - Enhanced performance relative to CB-only systems
- ***Current presentation: Sensor utility and fusion development framework***
  - Overall approach and analysis scenarios
  - Sensor utility analysis
  - Path forward

***Central issue is to demonstrate whether non-CB sensors serve to confirm or deny occurrence of CB alarms.***

**\*Military Applications of Reconnaissance and Surveillance – Joint Force Protection**

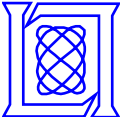


# Fusion Objectives

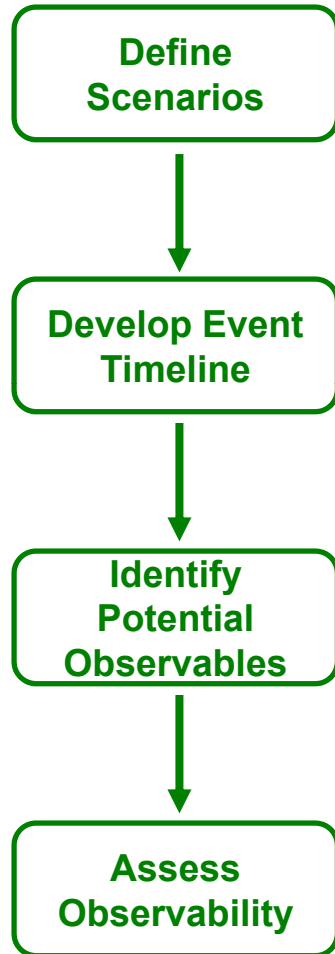
---

- **Demonstrate utility of non-CB sensors in CB attack classification**
  - Ability of non-CB sensors to confirm/deny CB alarms
    - Upon CB alarm, search earlier in event chain for corroborating evidence**
  - Earlier warning of attack (prior to CB release)
    - Alert upon detection of early events in attack chain and watch for subsequent CB alarms**
- **Demonstrate ability to estimate and predict plume propagation**
  - Ability to interpolate sensor readings
  - Ability to leverage information from contributing events (e.g., impact location; agent mass)

**The fusion approach leverages the full attack event chain to determine whether or not a CB event is likely to be in progress and estimate severity**



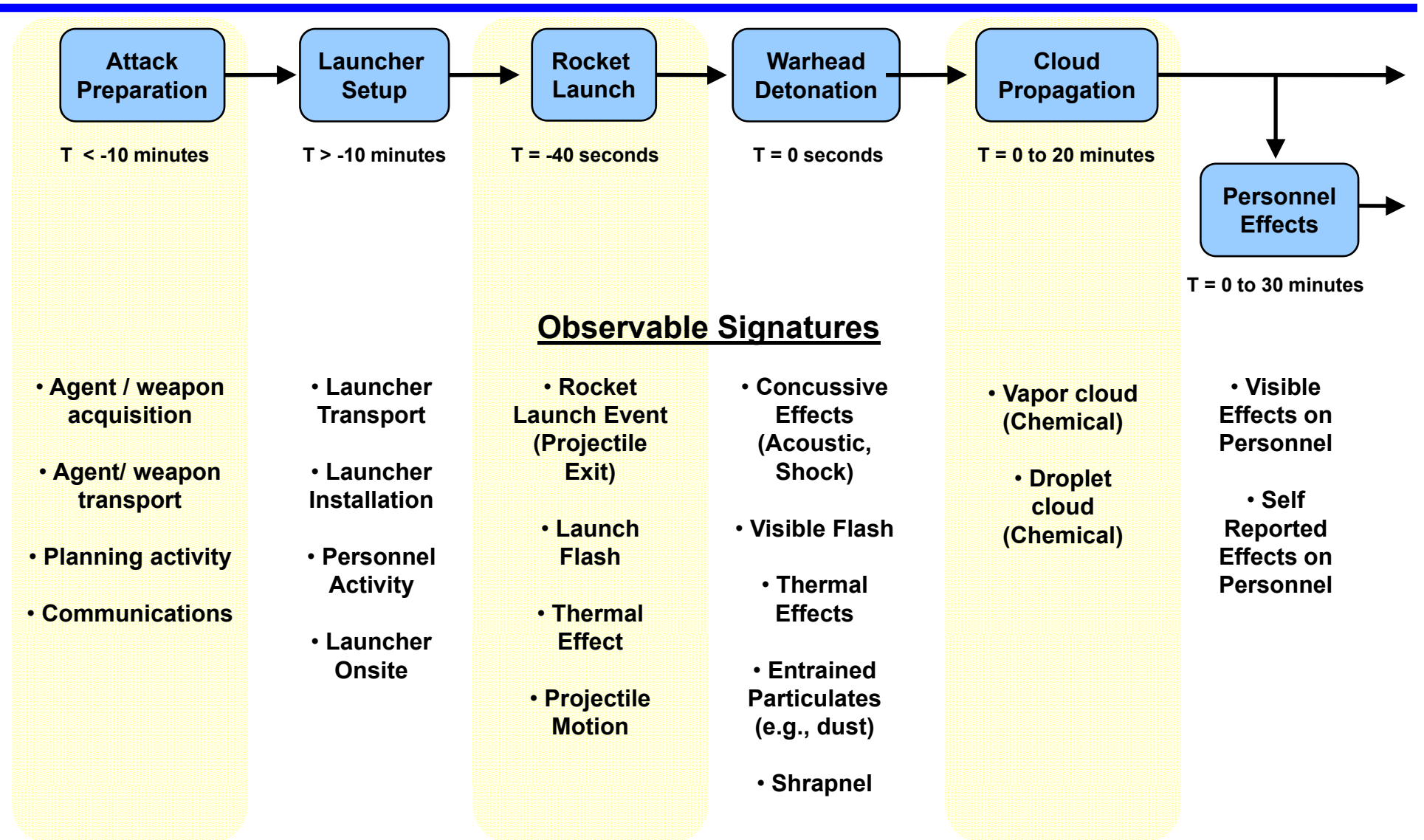
# Sensor Utility Analysis



- **Representative CB attack examples**
  - Chemical and Biological
  - Covert and Overt
  
- **Enumerate steps to effect attack**
  - Preparation
  - Execution
  - Effects
  
- **Enumerate potentially observable phenomena**
  - Equipment (e.g., launchers)
  - Projectiles
  - Explosions
  - Clouds , etc.
  
- **Signature above background**
- **Sensor available to FOB**
- **Need for additional algorithms**
- **Scanning / Tasking capability**

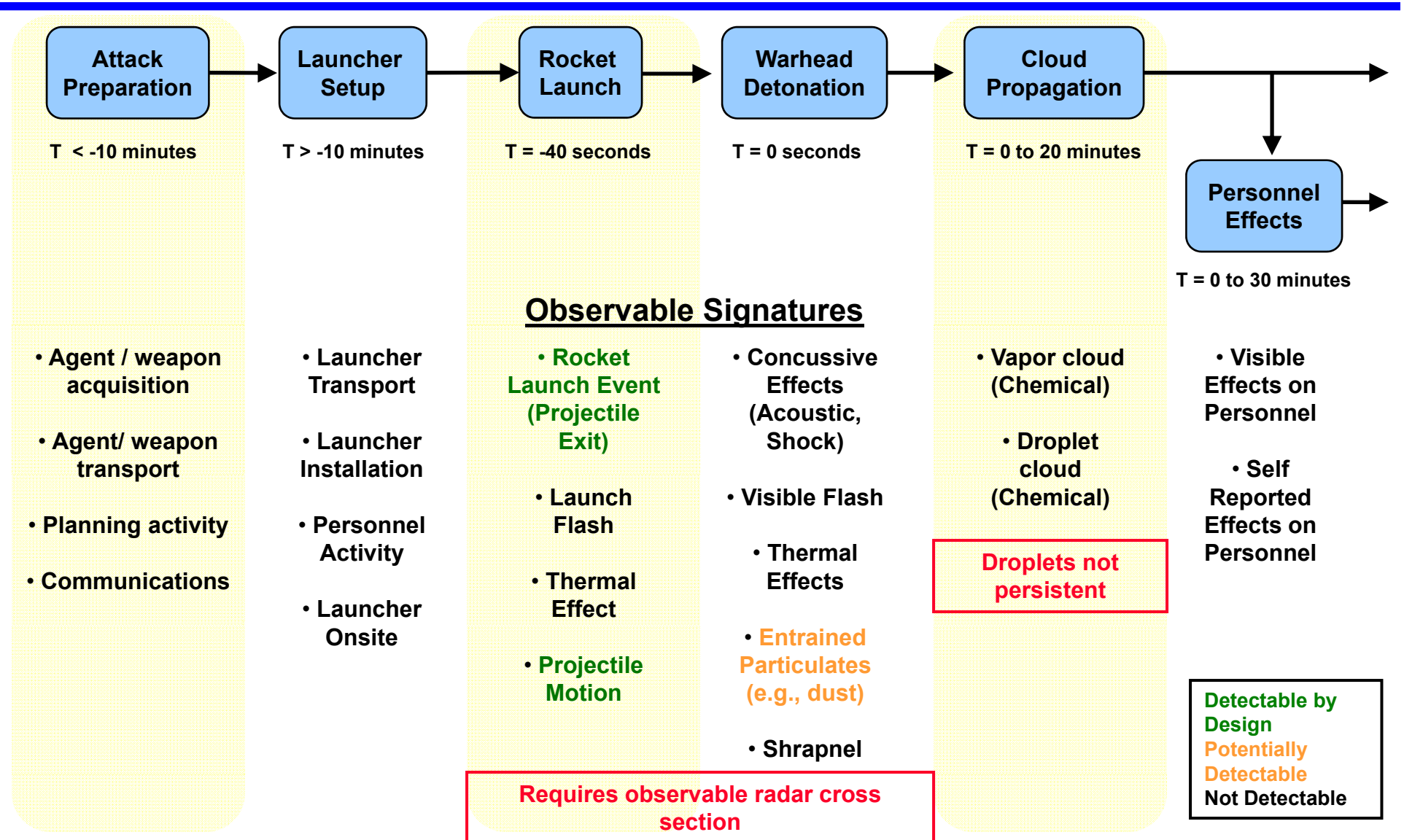


# Event Timeline – Rocket Attack MLRS Type with GB





# Signature Detectability – Firefinder Radar GB MLRS Rocket Attack

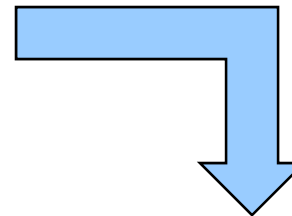




# Sensor Recommendations

Sensor Class	Example Types
Firefinder radar	TPQ 36/37
Ground surveillance radar	ARSS, MSTAR
Acoustic	UTAMS, HALO
Chemical Point/Standoff	JCAD/JSLSCAD
Biological Point/Standoff	JBTDS; JBPDS/JBSDS
CB UAS/UGS	Chem/Bio Raven
Visible/IR Cameras	Orion, DefendIR HD
Intelligence	DCGS feeds

- Covers contributing events and plume detection
- Emphasizes sensors likely to be available at medium to large FOBs
- **More advanced sensors (e.g., hyperspectral or fast scanning backscatter LIDAR) likely in future implementations**

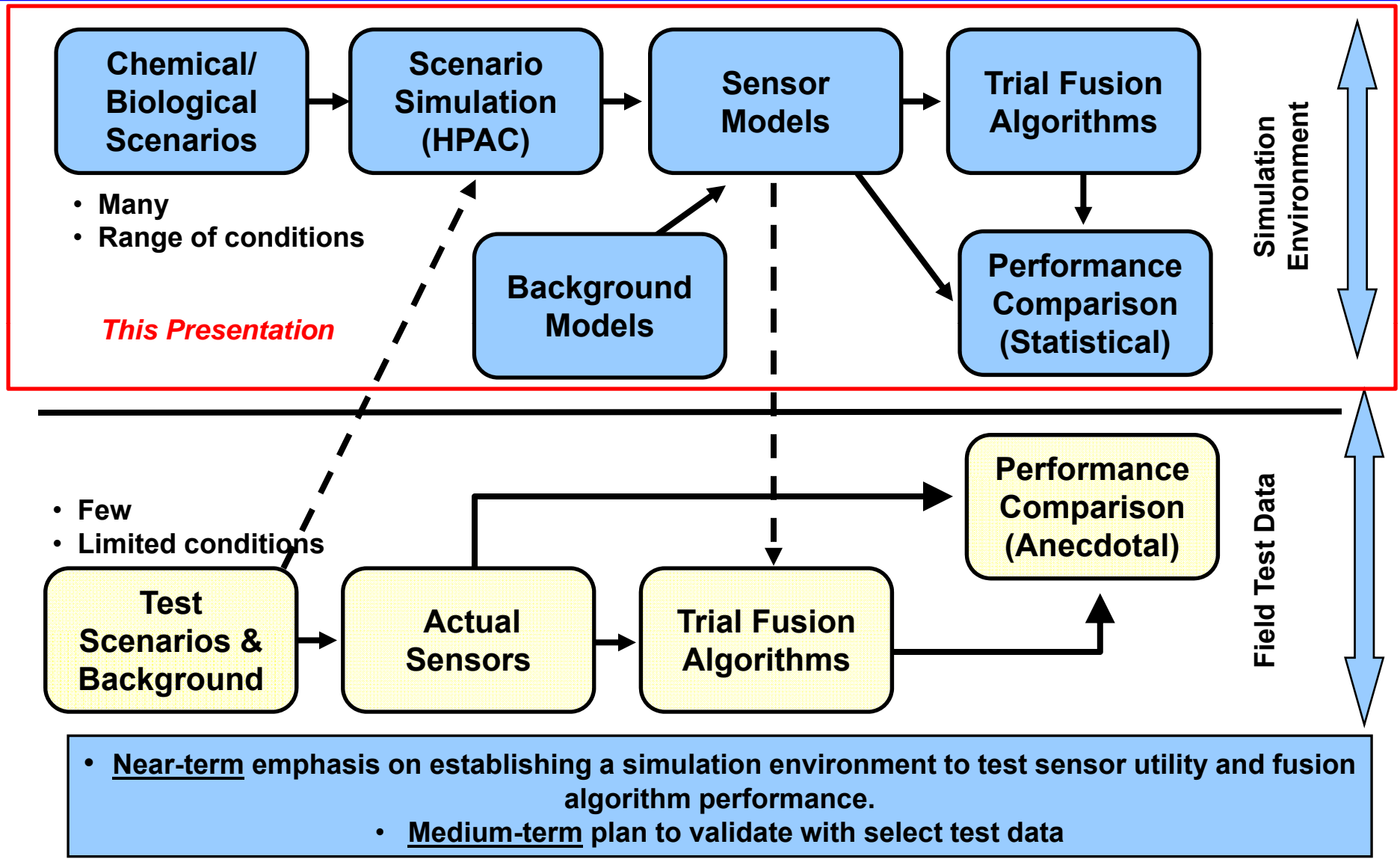


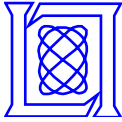
- Most sensors support attack confirmation
- **Early detection and characterization are covered less effectively**

Sensor Class	Early Detection	Confirmation	Characterization (Discrimination)
Radar	Firefinder Only	Ground Surveillance Only	
Acoustic/ Seismic	X	X	Possibly
Visible/IR		X	Possibly
CB Sensors	Standoff Only	X	X
Intelligence	X	X	



# Structure of Fusion Test/ Simulation System



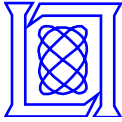


# Initial Fusion Algorithm Overview

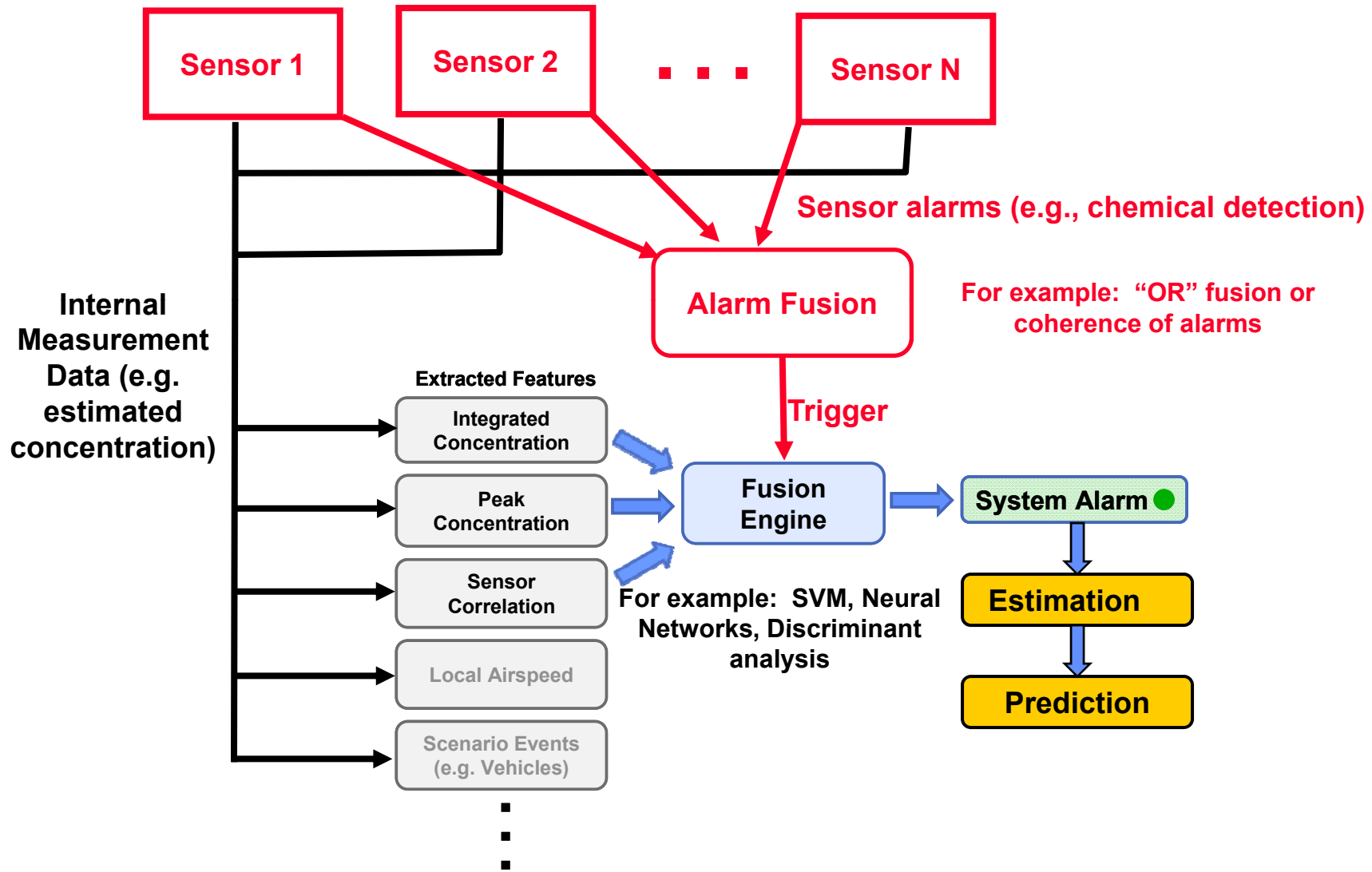
---

- **Classifier identifies “most-likely” attack**
  - Bayesian classifier modified by “time-window” rules
  - Based on sensor inputs and estimates of prior probabilities
  - Ranks selected attack scenarios by likelihood
  - Initial algorithm solely alarm-based
- **Estimation/Predication algorithm identifies area likely to be affected**
  - Predicts regions believed to be above a threshold concentration
  - Estimates “belief” in the contamination state
  - Refines estimates as more sensor information becomes available

Early algorithms provide capability with “look and feel” of more advanced fusion techniques

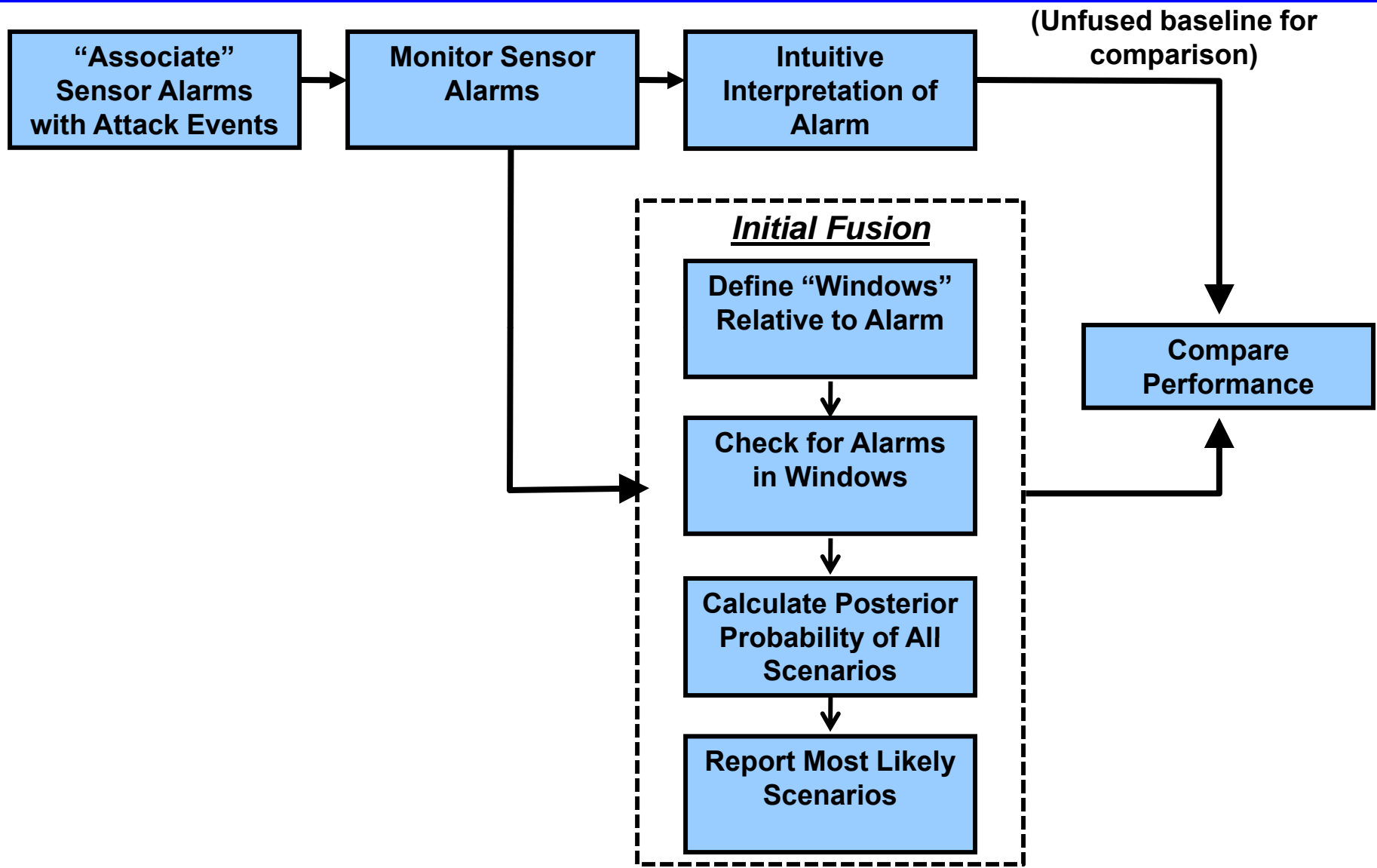


# Alarm vs. Feature Based Fusion





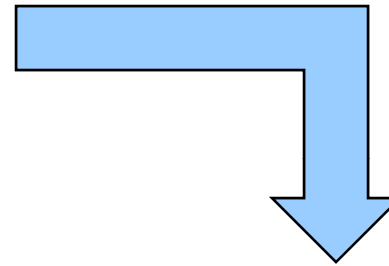
# Preliminary Fusion Algorithm Approach





# Algorithm Performance

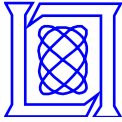
Intuition				
Classifier Actual \	No Attack	RAM (GB)	RAM (HE)	Truck Sprayer (VX)
No Attack	0.40	0.04	0.39	0.16
RAM (GB)	0	0.97	0	0.03
RAM (HE)	0.01	0.01	0.97	0.01
Truck Sprayer (VX)	0.02	0.01	0.04	0.93



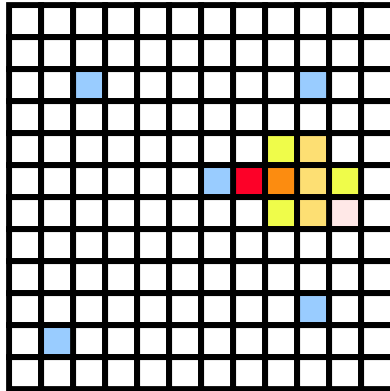
**Bayesian classifier substantially improves performance**

- **Enhanced identification of “No Attack” scenarios**
- **Some loss in ability to detect “Truck Sprayer”**

Bayesian Classifier				
Classifier Actual \	No Attack	RAM (GB)	RAM (HE)	Truck Sprayer (VX)
No Attack	0.93	0.00	0.06	0.01
RAM (GB)	0	0.99	0	0.01
RAM (HE)	0.01	0.00	0.99	0
Truck Sprayer (VX)	0.16	0.02	0.03	0.81



# Agent Spread Estimator



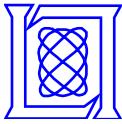
■ - Sensor measurement or other information

■ to ■ - Relative belief

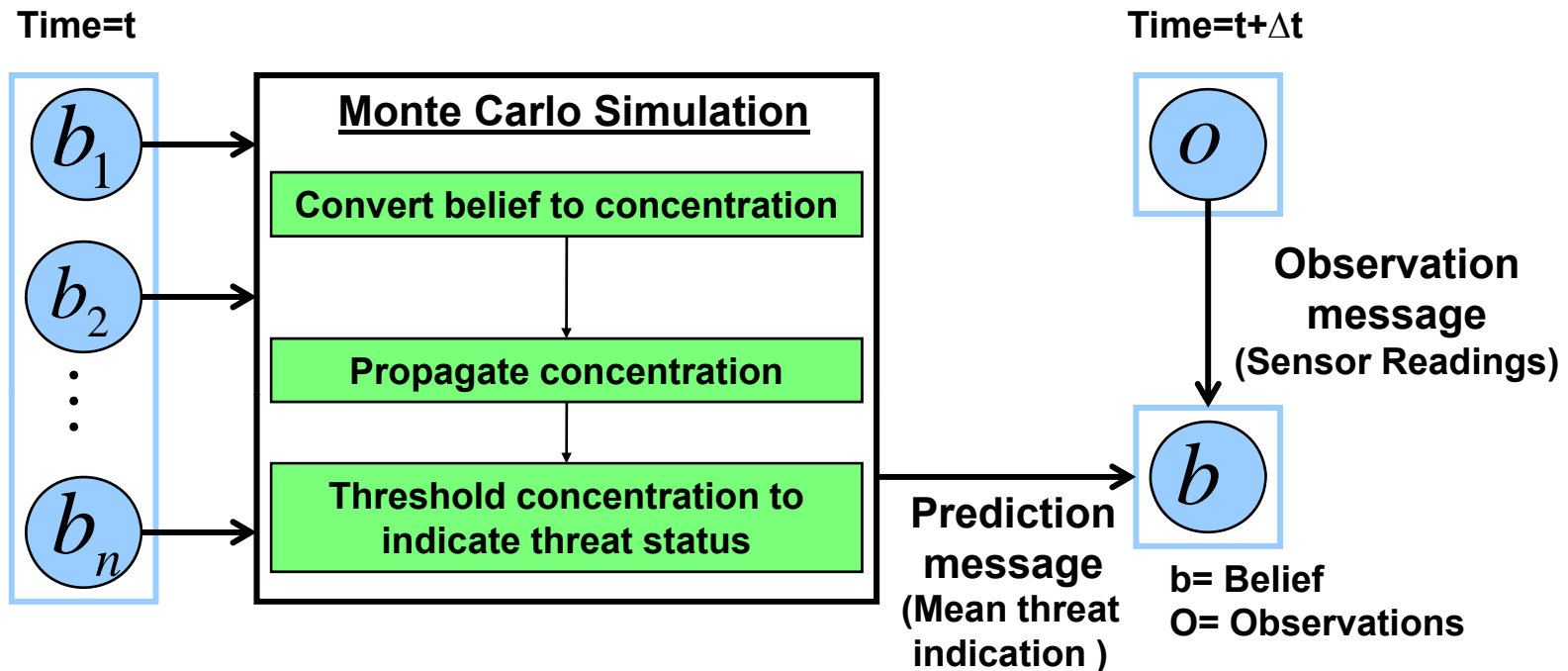
- Region of interest discretized into a uniform grid
- CB sensors detect threatening levels of CB agent
  - Binary alarms
  - Node concentrations not available
- Belief is the likelihood of a significant concentration of hazardous agent at each grid node
  - Likelihood is estimated from current observations and previous beliefs

Estimator/predictor provides the estimated “belief” over time that a particular node is above the sensor detection threshold

- Basis to decide which areas are likely to have been affected



# Belief Propagation Inference



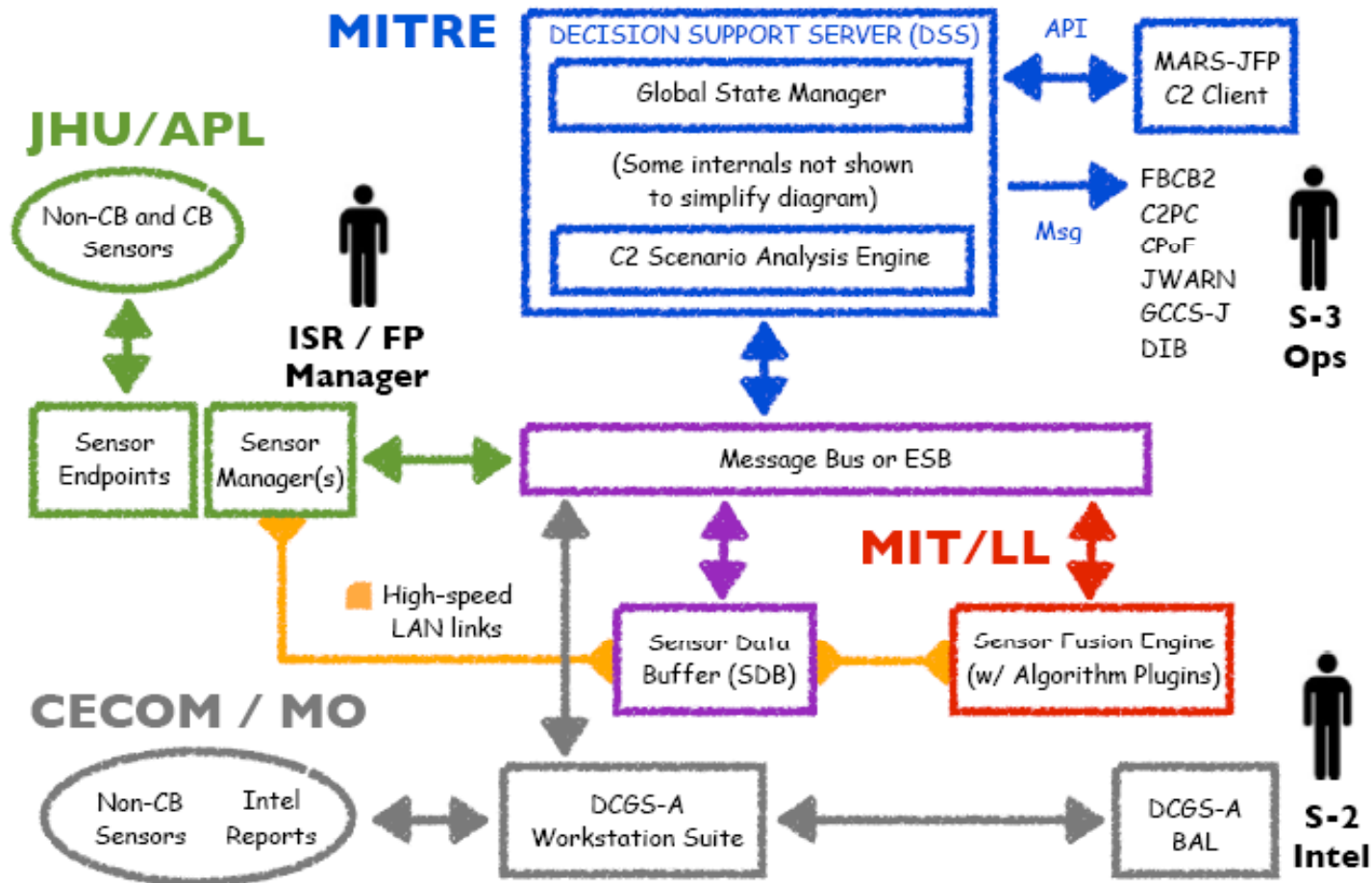
- **Belief is propagated based on previous belief and current observations**
  - Current belief determined by a normalized combination of the propagated (predicted) belief and the observation result.

**Belief must be converted to concentration to apply dispersion models.**



# System Context

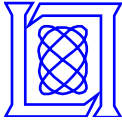
## MARS-JFP Server Architecture v4.2





# MARS-JFP Schedule

MAJOR TASKS	FY09	FY10	FY11	FY12	FY13	FY14
	1 2 3 4	1 2 3 4	1 2 3 4	1 2 3 4	1 2 3 4	1 2 3 4
Tech Insertion Opportunities		▲	▲	▲	▲	▲
Technology Transition Agreement	▲	▲	TTA Signed			
Project Management	[Red bar]					
FFRDC Architecture Development	[Red bar]					
FFRDC C2 Prototype/Test Bed	[Red bar]					
Operator In The Loop Sim Events		■	■	■	■	
Industry Prototypes (multiple)	[Red bar]					
Integration Events	[Red bar]					
Test Plans/Procedures	[Red bar]					
Technical Demonstrations		Demo 10 ■	TD1 ■	TD2 ■	TD3 ■	
Operational Demonstrations				OD1 ■	OD2 ■	
Doctrine & Training Development	[Red bar]					
Military Utility Assessments					MUA ★	
Technical Readiness Assessment						▲
Residual Support						[Red arrow]



# Path Forward

## Future S&T Integration and Transition Opportunities

---

- **Capability Demonstration Integration**
  - **Spiral updates to MARS-JFP prototype**
    - Integration of enhanced fusion algorithms into overall demonstration system
    - Integration of broader range of actual and/or simulated sensor assets
  - **Demonstrate system concept in simulated exercises (SIMEX)**
  - **Participate in future Field Tech Demo's (Empire Challenge, etc)**
- **System Analysis**
  - **Performance assessment methods**
  - **Identifying S&T projects for potential integration into MARS-JFP**
- **System Level Test and Evaluation Capabilities**
  - **Open air test grid challenges for wide area, cross domain, and mobile asset (UAS/UGV) assessments**