

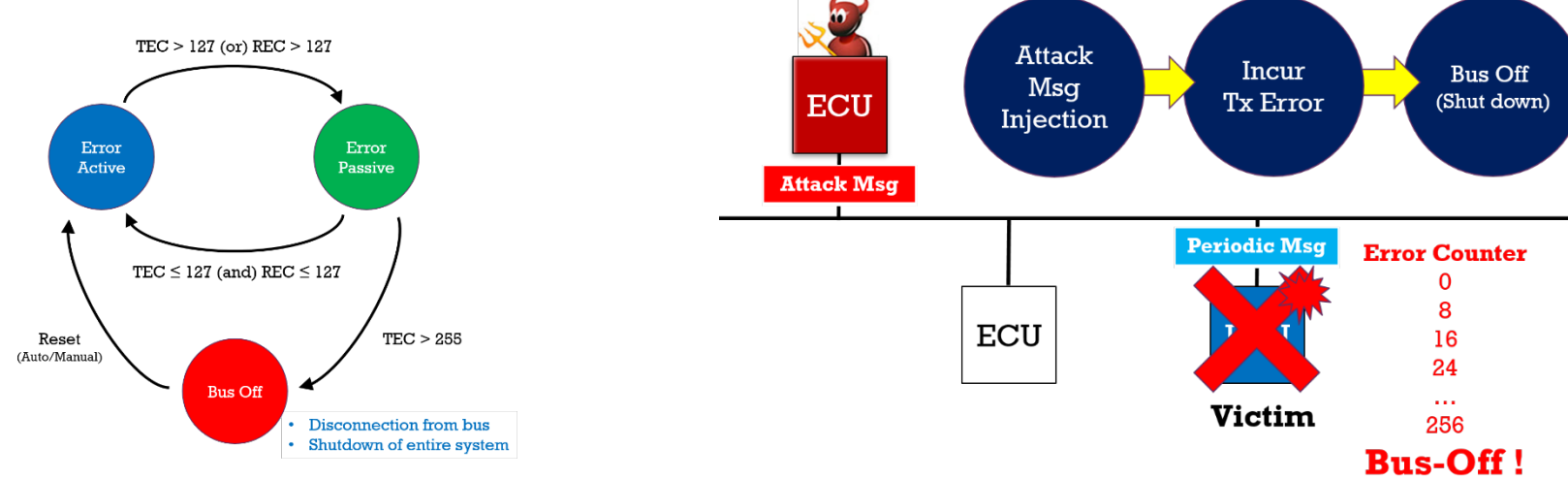
## Platform support for security

### Attack Model: "Bus-off Attack"

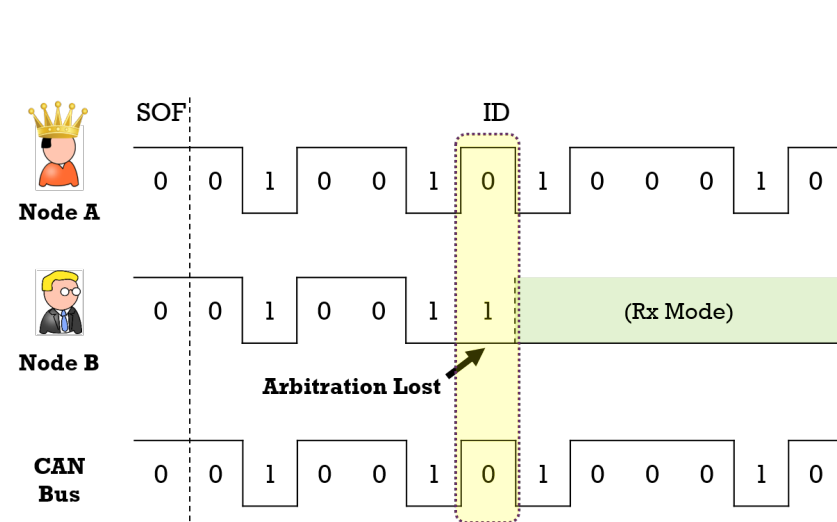
- Attacker's objective is to shut down or disconnect uncompromised (healthy) in-vehicle ECUs with minimal number of injections.

### How to shut down the victim ECU?

- Exploit the error handling mechanism in CAN and deceive the victim into thinking it is erroneous while is actually under attack.

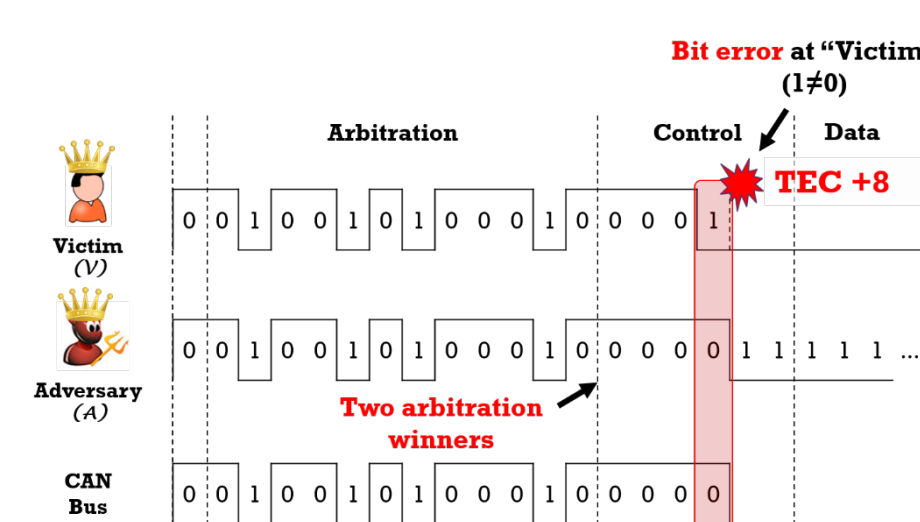


### CAN Error Handling Mechanism



Only **ONE** arbitration winner!

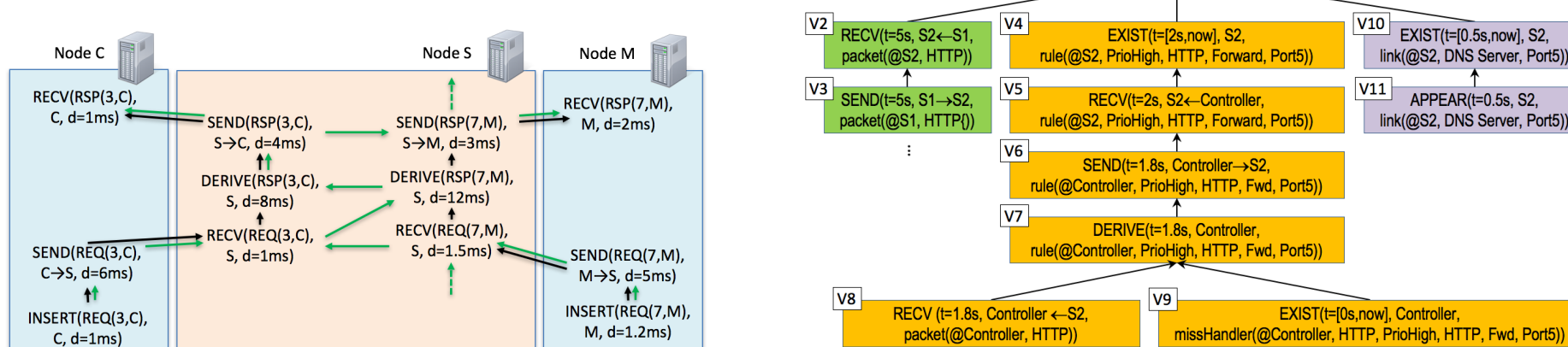
### Bus-off Attack



But in the bus-off attack... **TWO** arbitration winners

### How do we figure out what happened?

- Goal: System should be able to 'explain' to a forensic investigator why a given event occurred
- Idea: adapt the concept of data provenance from the database literature
- Problem: existing solutions only explain functional behavior ("why did this happen?") but not temporal behavior ("why did it happen too late?"; "why did it take so long?")
- Approach: new time-aware provenance model that explicitly captures resources and sequencing



## Modeling Human Factors

### Problem:

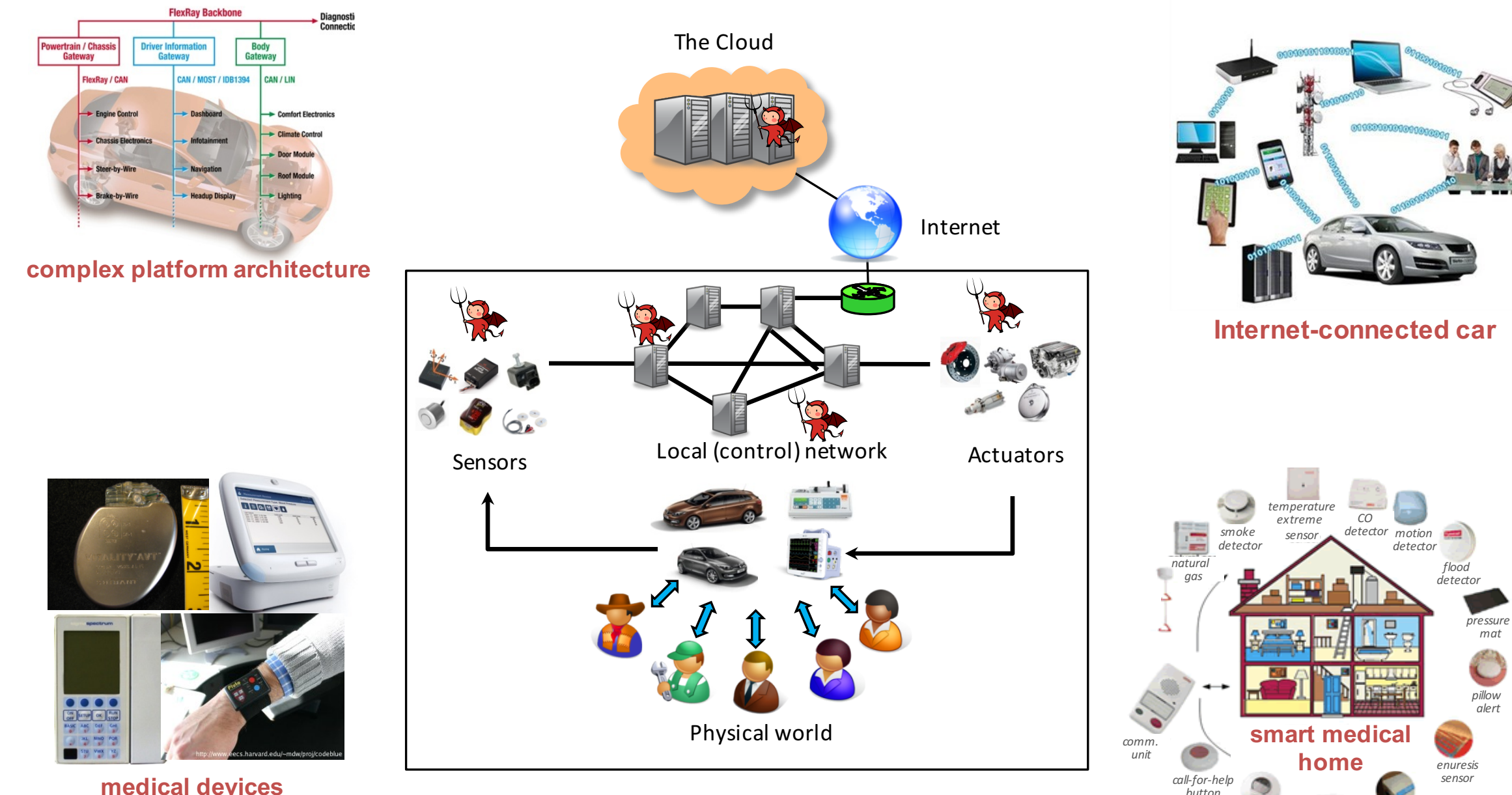
Users resort to workarounds when they feel that security features of a system prevent them from doing their work. How can we predict workarounds and analyze their effects?

### Approach:

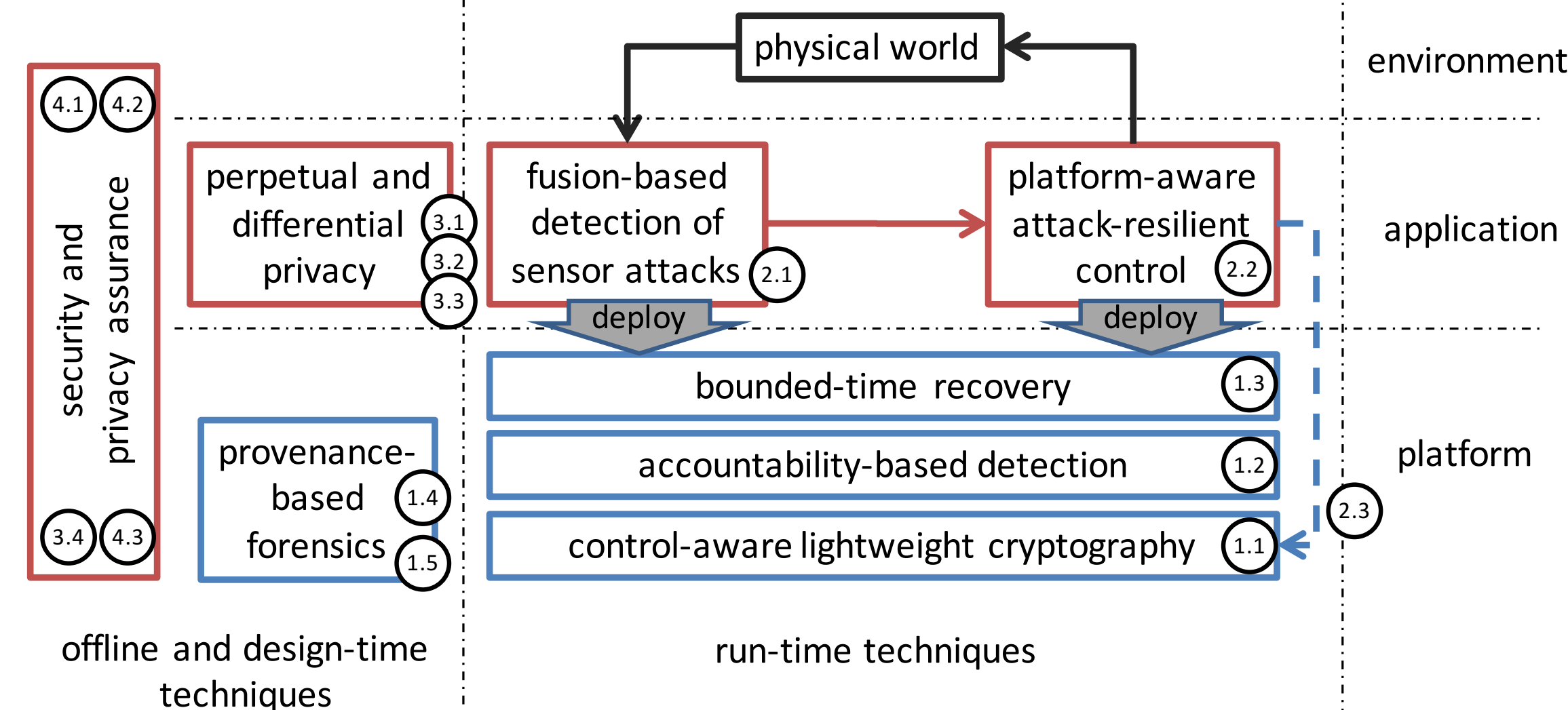
- Model potential workarounds as hazards and apply risk analysis
- Incorporate users' mental models into model-based design of CPS

## Project Overview

**Goals of the project:** to develop a framework in which the mix of prevention, detection, recovery and robust techniques work together to improve the security and privacy of CPS.



## Overview of Technical Areas of Research

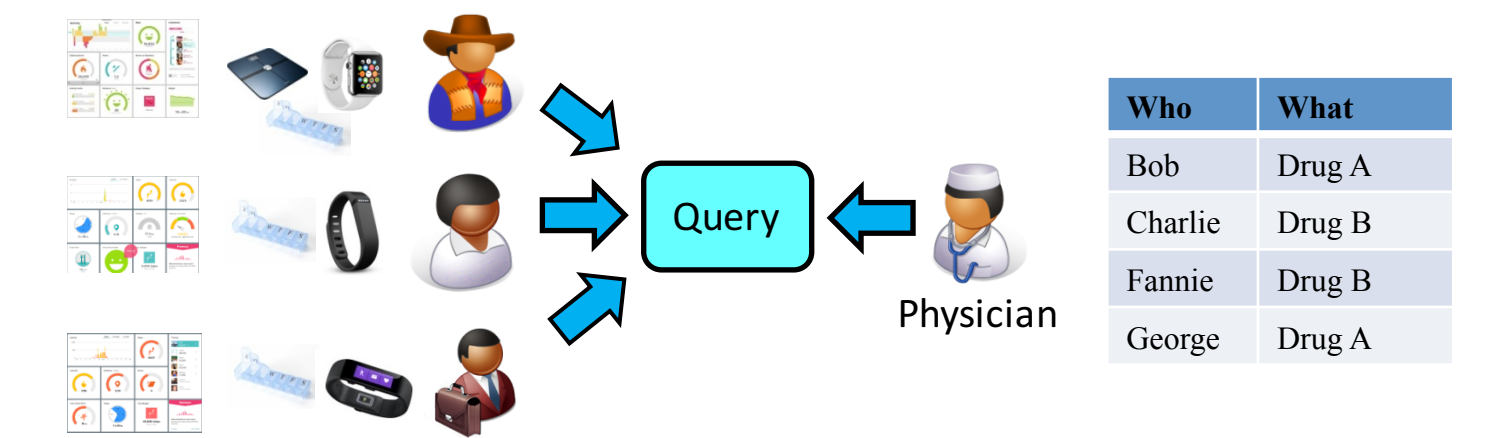


## Team

- |                           |                       |                         |
|---------------------------|-----------------------|-------------------------|
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This Project is supported by NSF CNS-1505799 and Intel-NSF Partnership for Cyber-Physical Systems Security and Privacy. <https://rtg.cis.upenn.edu/cps-security>

## Working with Sensitive Data



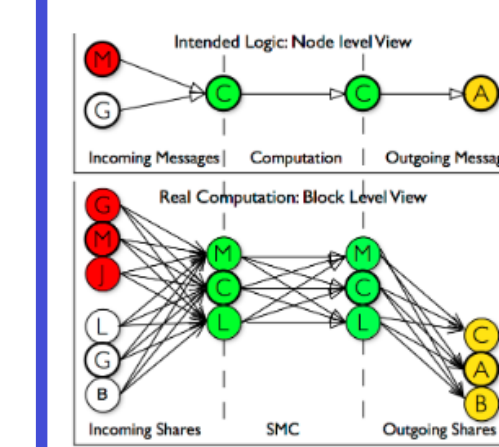
Example: "Does drug X work better during rest periods, or during heavy exercise?"

**Problem:** Differential privacy guarantees for distributed systems while processing continuous data streams.

### Approaches

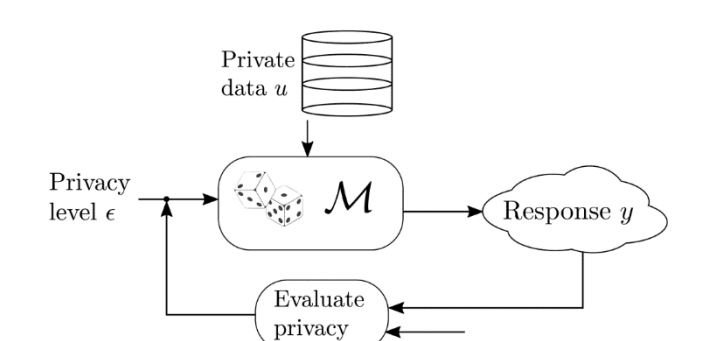
Distributed queries for differential privacy

Run-time differential privacy



A privacy-preserving mechanism that allows online relaxing privacy.

- data never leaves user domain



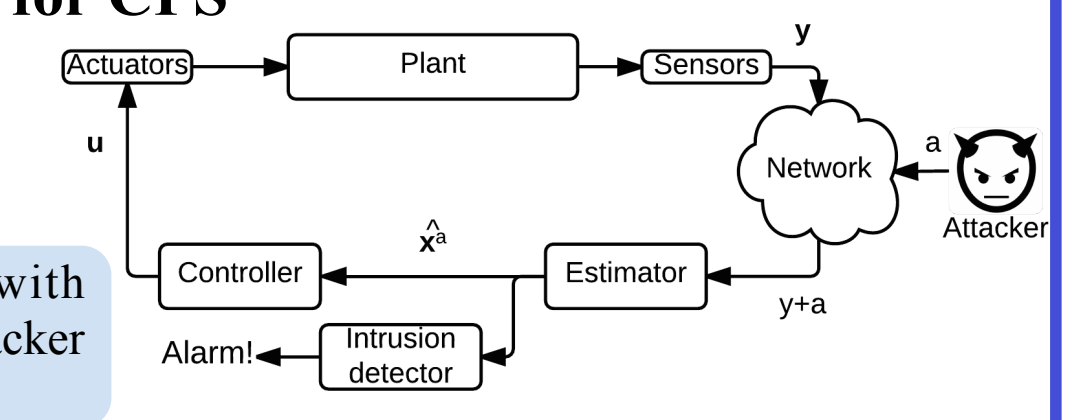
## Security-Aware Control Design Attacks on Control Systems

**Attack-Resilient State Estimation for Noisy Dynamical Systems**  $P_{0,\omega} : \min_{\tilde{e}, x} \|\tilde{e}\|_{l_2, l_0}$   $P_{1,\omega} : \min_{\tilde{e}, x} \|\tilde{e}\|_{l_2, l_1}$   
**Formal robustness guarantees for the optimal  $l_0$  and convex  $l_1$  estimator**  $\tilde{y} - O x_0 - \tilde{e} = \tilde{w}$   $\tilde{w} \in \Omega$

### Relaxing Integrity Requirements for CPS

Sporadic integrity enforcement: If at step  $k$ , sensor integrity is enforced (e.g., with the use of MAC), then  $\mathbf{a} \downarrow k = 0$ .

**Theorem [Jovanov&Pajic'16]:** Even with sporadic sensor integrity enforcement, the attacker cannot introduce unbounded estimation error.



**Limiting attack effects:** Trajectory following study - attack induced estimation error < 5 cm when <20% of CAN packets contain MAC

### Optimization and Control using Partially Homomorphic Encryption

Privacy-aware cloud-based optimization over sensitive data:  
 - Agents encrypt information before sending to untrusted cloud  
 - Cloud computes optimal solution without learning the sensitive data or the final solution

