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# **Secure Distributed Consensus Control for Multi-Robot Systems**

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#### **Motivation**

- Multi-robot systems is commonly operated through supervisory control in unprotected communication channels.
- Applications run on an open source framework that is fully accessible to unauthorized users.

These natures makes itself more vulnerable to cyberthreats.

#### **Countermeasurement Against Attacks**

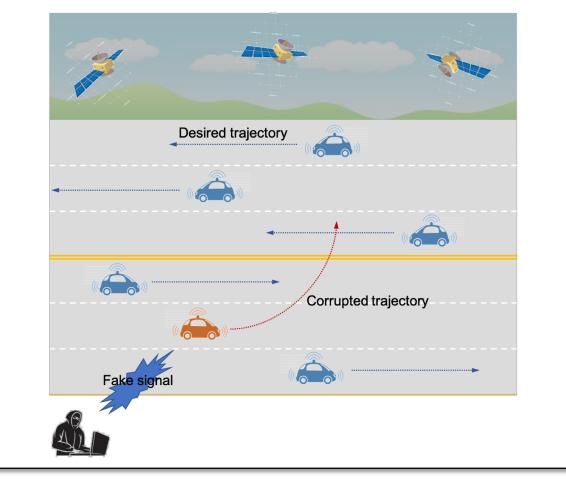
Switching Consensus Control to achieve  $\lim_{k \to \infty} ||x_i - x_j|| = 0$ •

**Consensus Protocol 1:** If any of robots is identified under *deception attack*, assign more weight to the robots in normal operation than the compromised robots.

$$\iota_k = L \sum_{i=1}^N a_{ij} (x_i - x_j)$$

Minimize the negative effects of attacks.

• Illustration of a signal spoofing attack

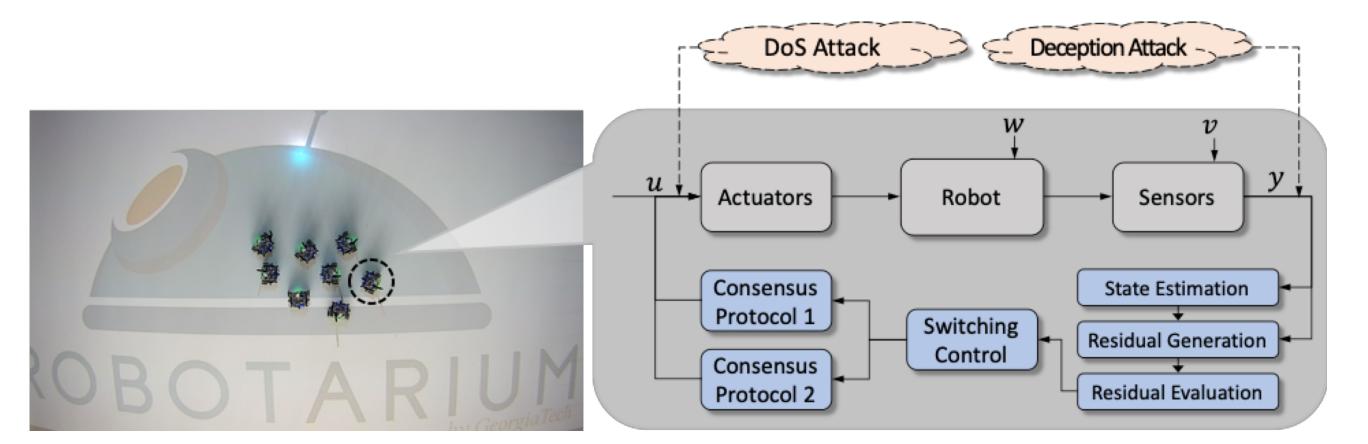


#### **Research Questions**

- 1) Is a robot able to *identify* attacks solely?
- 2) If so, is the robot able to **counteract** them?

## **Threat Model**

- **Deception attack:** the possibility of compromising the integrity of control packets or measurements, altering the behavior of sensors and actuators.
- **Denial of Service (DoS) attack:** compromise the availability of resources by jamming the communication channel.



**Consensus Protocol 2:** If any of robots is identified under *DoS attack*, reassign the compromised robots as followers by reconfiguring the communication topology.

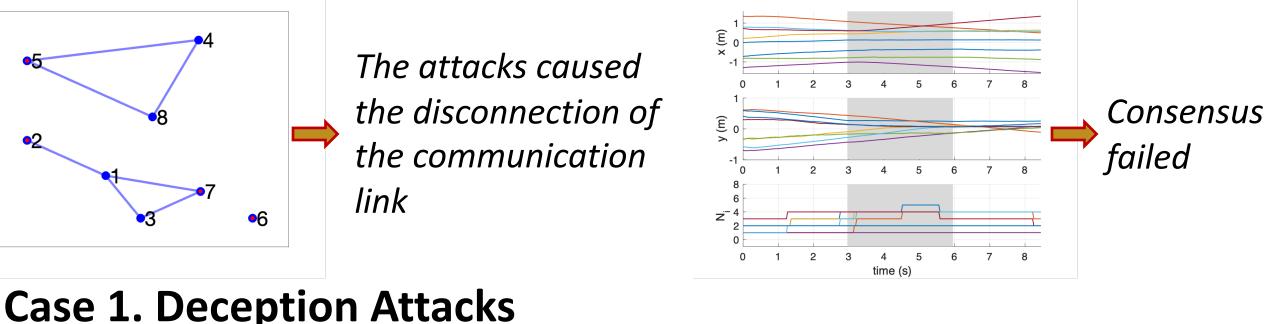
$$u_{k,f} = L \sum_{i=1}^{N} a_{ij} (x_i - x_j)$$

Make the leaders to guide the followers.

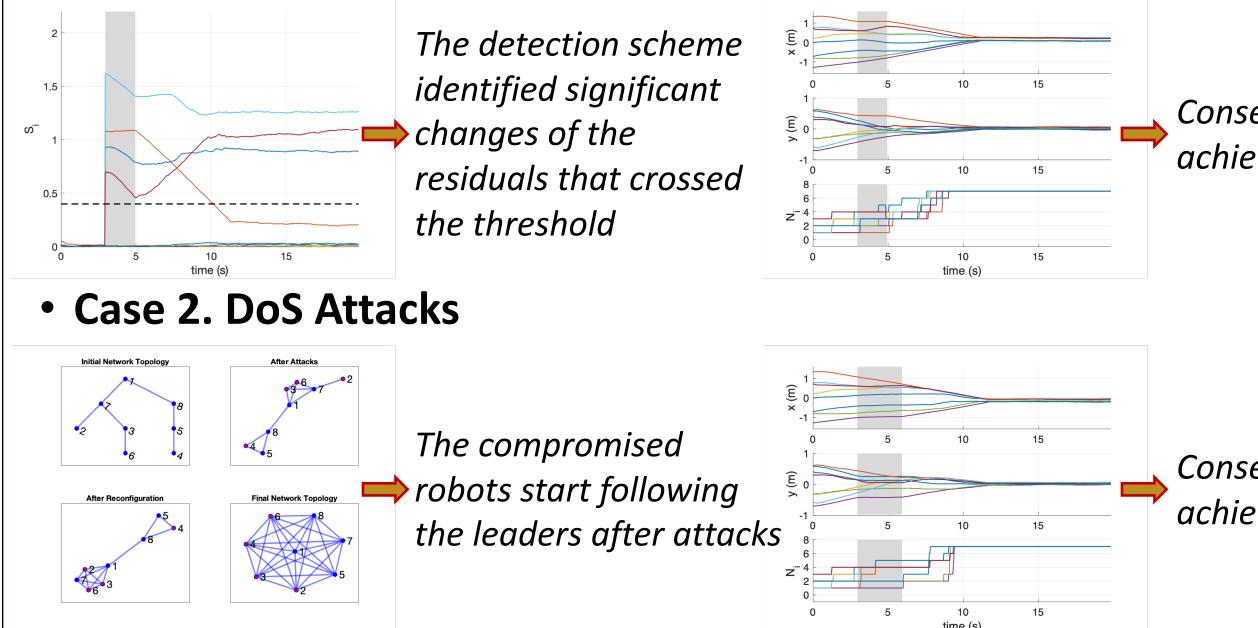
#### **Experimental Validation**

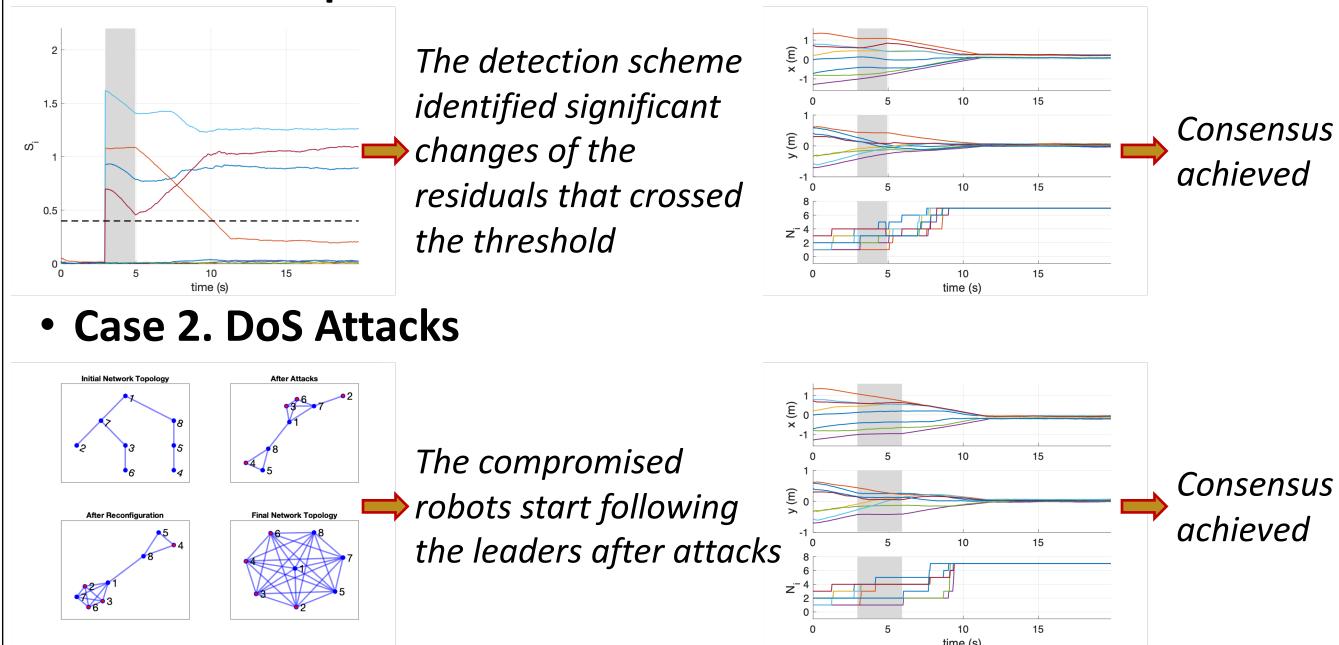
• While the team is trying to reach consensus at a common point, two types of attacks are injected into 4 arbitrarily selected robots when the global clock reached 3 seconds.

#### • Case 0. Deception Attacks without the countermeasure



#### • Case 1. Deception Attacks



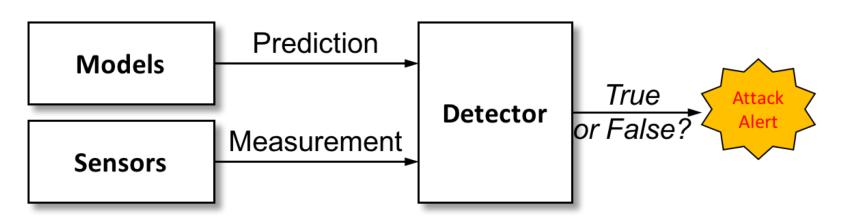


If there is an attack, actuators would not be able to respond to the robot correctly, which may lead to disastrous consequences.

### **Threat Identification**

#### Model-based identification Scheme

Robot's dynamics model allow us to predict it's normal behaviors.



An attack will cause deviations at the physical layer, resulting unexpected alterations (**Prediction**  $\neq$  **Measurement**).

#### Detection Mechanism

Identifying the alterations is to distinguish between two hypotheses:  $H_0$  – the normal case,  $H_1$  – the abnormal case where a change has taken place.

The proposed countermeasure enabled the robot team to **reach** consensus at a common point without losing any robots and **connectivity** in the presence of more than one robot under attacks.

#### Acknowledgement



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#### References

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- S. Lee, Y. Cho, and B.-C. Min, "Attack-Aware Multi-Sensor Integration Algorithm for Autonomous Vehicle Navigation System," 2017 IEEE International Conference on Systems, Man, and Cybernetics (SMC), Banff, Canada, October 2017, pp. 3739-3744.



