

## Learning-Based Cooperative Control of Multi-Robot Systems under DoS Attacks

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### Introduction

Distributed multi-robot systems are increasingly used in areas like environmental monitoring and warehouse automation, but their reliance on wireless ad hoc networks makes them vulnerable to cyber threats such as Denial-of-Service attacks. These attacks can disrupt communication, compromising system performance and stability. Traditional control methods often assume reliable communication and lack adaptability to such threats. To address this, we propose a resilient control framework that combines event-triggered consensus control with Proximal Policy Optimization reinforcement learning, enabling robots to adaptively manage control.

### Mathematical Formulas

The dynamics of robot  $R_i$  is described by

$$\begin{aligned} \dot{x}_i &= v_i \cos \psi_i \\ \dot{y}_i &= v_i \sin \psi_i \\ \dot{\psi}_i &= \omega_i \\ M_i \dot{v}_i &= -C_i(w_i)v_i - D_i v_i + \tau_i \\ M_i &= \frac{2}{r_i} \begin{bmatrix} m_{11i} + m_{12i} & 0 \\ 0 & b_i(m_{11i} - m_{12i}) \end{bmatrix}, v_i = [v_i, \omega_i]^T, \\ C_i &= \frac{2}{r_i} \begin{bmatrix} 0 & -b_i c_i w_i \\ c_i w_i & 0 \end{bmatrix}, \tau_i = [\tau_{vi}, \tau_{wi}]^T, \\ D_i &= \frac{1}{r_i} \begin{bmatrix} d_{11i} + d_{22i} & b_i(d_{11i} - d_{22i}) \\ d_{11i} - d_{22i} & b_i(d_{11i} + d_{22i}) \end{bmatrix} \end{aligned} \quad (1)$$

### Research Questions

In the presence of DoS attacks, communication links between certain agents may become unavailable for periods of time. Under these conditions, the main research questions we address are

- 1) How can robots maintain stable and efficient cooperation when communication is intermittently disrupted by DoS attacks?
- 2) Can a reinforcement learning framework learn to adaptively adjust both control parameters and communication strategies based on the observed attack patterns?
- 3) What theoretical guarantees can be established regarding the stability and convergence of the system under bounded DoS attack models?

### Figure

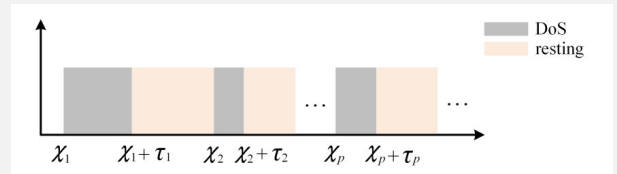


Figure 1. Denial-of-service attacks. Duration is the length of the interval over which communication is disabled. Resting time is length of the recovering interval between two consecutive attacks.

Denial-of-Service (DoS) attacks intend to block communication channels intermittently and prevent system (1) from being executed. In particular, both sensor-to-controller and controller-to-actuator channels are assumed to be blocked by DoS simultaneously.

### Methodologies

We propose a hybrid control framework that combines event-triggered consensus control with a deep reinforcement learning algorithm. The overall framework is designed as follows.

- 1) Each agent updates its control action only when certain state-dependent triggering conditions are met. This mechanism helps reduce unnecessary communication and improves resilience to disruptions.
- 2) An auxiliary module monitors the availability of communication links and estimates DoS attack patterns (e.g., frequency, and duration). This information is encoded into the agent's observation space.
- 3) To ensure that the proposed learning-based control framework is not only adaptive but also theoretically sound, we conduct a stability analysis under bounded DoS attack assumptions.

### Conclusion

We validate the proposed approach using a simulation environment based on Python and OpenAI Gym, with a custom multi-agent formation control scenario. Each agent controls its position in a 2D space and must maintain a predefined formation while experiencing random DoS attacks on its communication links. The baseline comparison includes conventional consensus control without attack mitigation, event-triggered control without learning and the proposed PPO-based adaptive control framework.