# Resilience Of Multi-robot Systems To Physical Masquerade Attacks

# Hello! I'm Kacper

SafeThings Workshop May 23rd, 2019



Kacper Wardega



Roberto Tron



Wenchao Li





# SECURITY & PRIVACY

# Exposé! Security of Industrial Robots (Quarta et. al. S&P'17)

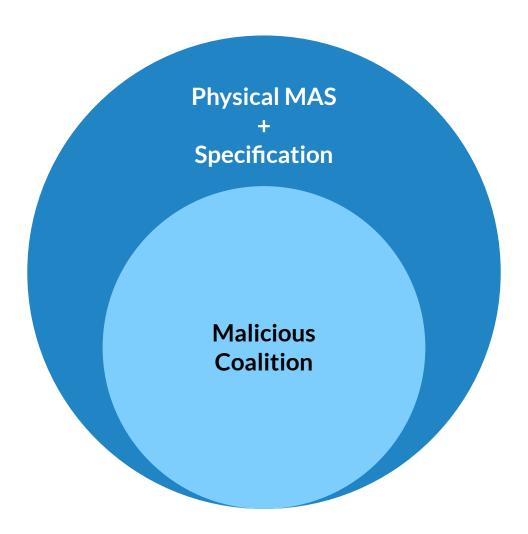
- Easy to hack
- Easy to cause damage
- Many different settings





Spoofing location can also cause harm!

#### Physical Masquerade Attack



#### MAPF problem

Robots, reach, avoid.

#### Single malicious agent

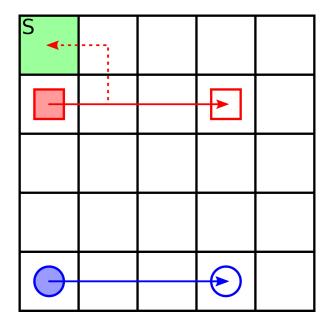
Reach a secure location.

#### Stealth!

+ Inter-agent observations.

A new, unstudied problem!

Other domains include UAV patrolling and unstructured monitoring.



Vulnerable

#### Threat Model

#### **Power**

The attacker has full control of a single robot.

#### **Limitations**

The attacker inherits the control-actions of non-compromised robots.

#### **Information**

Sensor capabilities and planned routes are common knowledge.



### Questions

How much of a concern are physical masquerade attacks? How can designers defend against these attacks?

#### Two cases:

Discrete space

Discrete actions

Adjacent observations

**Continuous space** 

Displacement dynamics

Radius-based observation

## >90%

Of all conventionally-obtained plans are vulnerable to physical masquerade attack.

#### OBSERVATION PLANNING

By leveraging inter-agent observations, designers can implement monitoring for physical masquerade attacks.

#### Observation Planning: Example

FROM	ТО	TIME
Α	В	3
В	Α	3
•••	•••	•••
F	A	24

#### Monitoring Guarantee

# Plan Observe Report Plan the set of expected following the motion observations. Run the system, Issue an alarm on unexpected or missing observations.

#### Challenges

#### **Enhanced Conflict-Based Search**

Complete & optimal decentralized planner.

How can I speed the discovery of plans with monitoring guarantees using conflicts?

#### A\*-esque

Heuristic-guided centralized planner.

What heuristics even make sense to use? What are the properties of plans with monitoring guarantees?

# Discrete Space EF-SMT (Z3) Continuous Space MIQCP (GUROBI)

$$egin{aligned} \left(orall t \in \mathbb{N}_T, j \in \mathbb{N}_R \setminus i^*
ight) \ \left(\phi\left(x_j^t, x_{i^*}^t
ight) \iff \phi\left(x_j^t, y^t
ight)
ight) \end{aligned}$$

The attacking agent must not violate the observation plan

#### Optimal & complete planning with monitoring guarantees!



## 4-connected grid

**EF-SMT** 

(Z3)

## **Continuous Space**

MIQCP

(GUROBI)

#### Optimal & complete planning with monitoring guarantees!



4-connected grid

**EF-SMT** 

(Z3)

**Continuous Space** 

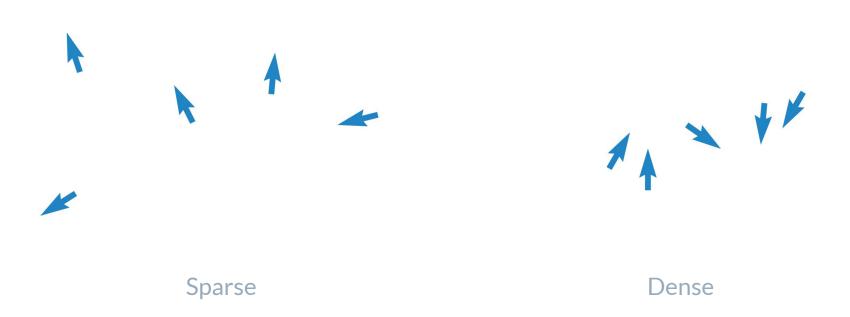
MIQCP

(GUROBI)



Check vulnerability of existing plans.

#### Observation



Traditional MAPF algorithms leverage sparsity. Planning with monitoring guarantees is achieved through dense solutions.



## Scalability

How can I efficiently handle large environments and many agents?



## Collusion

How can I handle situations with multiple compromised agents? Are there logics to reason about unknown coalitions?

# Thanks! Questions?

## Q1: Efficient planning & impact on performance?

Q2: How to model collusion?