# **On the Realism of LiDAR Spoofing Attacks** against Autonomous Driving Vehicle at High Speed and Long Distance

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#### LiDAR is widely used as a primary sensor for Autonomous Vehicles (AVs)







#### LiDAR scans its surroundings by emitting lasers







## **Spoofing Attack in Physical World**



Autonomous driving system fails to detect a car in front and crashes into it.

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## Limitations when attacking driving AVs

L1. Lack of practical detection and tracking system capable of high speeds and long distances

L2. Lack of practical spoofing devices capable on public roads

L3. Lack of practical spoofing attacks against recent LiDARs

# **Previous Research (L1)**

L1. Lack of practical detection and tracking system capable of high speeds and long distances

#### Prior Attempt to Attack Moving Vehicles

	Maximum Speed	Maximum	Attack
	Maximum Speed	Attack Rang	ge on AD Vehicle
Ours	60 km/h	110 m	✓
Cao et al. [12]	5 km/h	$10\mathrm{m}$	-
Cao et al. [14]	0.4 km/h	$4\mathrm{m}$	-
Jin et al. [10]	0 km/h (running parallel)	$15\mathrm{m}$	-
	Low Speed	Close	Range

This is because of the lack of practical detection and tracking system

# **Previous Research (L2)**

L2. Lack of practical spoofing devices capable on public roads

#### Prior Attempt to Attack Moving Vehicles

	Maximum Speed	Maximum Attack Range	Attack on AD Vehicle
Ours	60 km/h	110 m	
Cao et al. [12]	5 km/h	$10\mathrm{m}$	-
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**Not Covered** 

No existing study performed closed-loop evaluation against AVs in the physical world

# **Previous Research (L3)**

L3. Lack of practical spoofing attacks against recent LiDARs

- New-Generation LiDAR with Pulse Fingerprinting (PF)
  - Prevents existing spoofing attacks
- However, there is still a lack of security studies on recent LiDARs (L3)

Potential vulnerabilities remain unclear





## **Limitations in prior works**

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## **Limitations in prior works**

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# RQ: Can LiDAR spoofing attacks actually have end-to-end safety impacts in practical AD scenarios?

L3. Lack of practical spoofing attacks against recent LIDAKS

## **Contributions**

- Design a novel LiDAR spoofing system for practical AD scenarios
  - Developed the MVS system, a powerful spoofer composed of three subsystems
  - Can aim at a target vehicle at 60 km/h from 110 meters away

#### Design new removal attack on New-Gen LiDARs w/ Pulse Fingerprinting

◆ A-HFR attack can remove ≥96% of points in attack angles

#### First to perform closed-loop attack evaluation in real-world AD scenarios

- ♦ Achieves ≥96% success rate on vehicles at 60 km/h up to braking distance
- Demonstrated closed-loop attack on a vehicle with a popular AD stack in real-world

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# **MVS System: Overview**

#### Consisted of 3 subsystems

- 1. Detection & Tracking System
- 2. Auto-Aiming System
- 3. LiDAR Spoofing System



- Consisted of 3 subsystems
  - 1. Detection & Tracking System





















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# **A New-Gen LiDAR's Feature: Pulse Fingerprinting**



Signal fingerprint consisting of two pulses allows for attack elimination

#### New Attack against New-Gen LiDARs: Adaptive HFR



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#### **Evaluation in the High-Speed Scenario**



## **Evaluation in the High-Speed Scenario**



## **Evaluation in the High-Speed Scenario**



#### **End-to-End Attack Evaluation**

#### End-to-end evaluation with a popular AD stack, Autoware.ai



Autoware.ai on PIXKIT

**Experimental Setup** 



Reset Left-Click: Notate. Middle-Click: Hove X/Y: Right-Click: Zoom, Shift: Hore options.

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et Left-Click: Rotate. Middle-Click: Move X/Y. Right-Click: Zoom. Shift: More options.







## **Limitations & Countermeasures**

#### Large Deployment Effort and Cost

- No major technical challenge to deploy our MVS system on public road
- However, it costs \$2.3k (device) + \$10k (FG, Power Supply, etc.)
- Need high engineering cost to build the system

#### Attack on uneven roads

- However, road should be even in high-speed scenarios
- Adding vertical tracking is not technically hard

#### Possible countermeasures

- Availability-check
- Multi-Sensor fusion

# Conclusion

- Investigate the safety and security impact of LiDAR spoofing attacks in the practical scenarios
  - Identify 3 research limitations
- Design a novel MVS system capable of practical speeds and distances
  - Can detect, track, and aim at the target LiDAR moving at high speeds
  - Reveal that spoofing attack can be deployed against high-speed (60km/h) vehicles
  - Demonstrate closed-loop attack on a vehicle with a popular AD stack
- Design a new practical removal attack: A-HFR
  - ♦ A-HFR shows the effectiveness against New-Gen LiDARs with pulse fingerprinting
- Performed Responsible Vulnerability Disclosure
  - Informed 5 LiDAR suppliers and 8 AD Companies
  - One car manufacturer asked to extend the embargo term to investigate the impact <sup>45/46</sup>

# Thank you!

#### For demos, data & other details, Please visit our project websites:

https://sites.google.com/keio.jp/keio-csg/projects/AttackonDrivingVehicle https://sites.google.com/view/av-ioat-sec/real-av-lidar-attack

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# **Appendix: Auto-Aiming System**

#### Consisted of 3 subsystems

2. Auto-Aiming System





At long distances, even small angular errors cause significant targeting deviations → Servo motor precision is crucial

# **Appendix: Auto-Aiming System**

- Consisted of 3 subsystems
  - 2. Auto-Aiming System
- Built the system using a <u>high-precision servo motor</u>
- Servo Motor: DYNAMIXEL MX-28R Resolution: <u>0.088°</u>





## **Appendix: High-speed evaluation results**

- MVS system can hide the victim with almost 100% until 20m away
  - Braking distance at 60km/h is over 20m without the reaction distance



MVS system has a significant impact on the safety implications that occur collision accidents