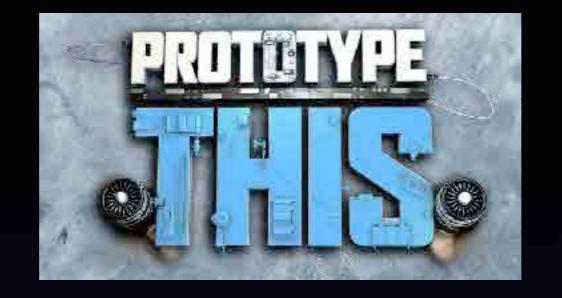


# Security Vulnerabilities of Autonomous, Unmanned and Driverless Vehicles

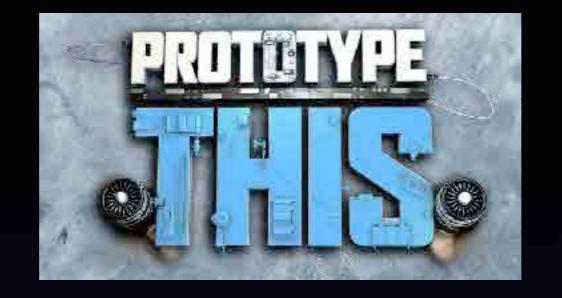




















Origins



Germany 1986 Ernst Dickmanns, VaMoRs

1995: Munich to Copenhagen in regular traffic, up to 175kph, vision only!

# Europe



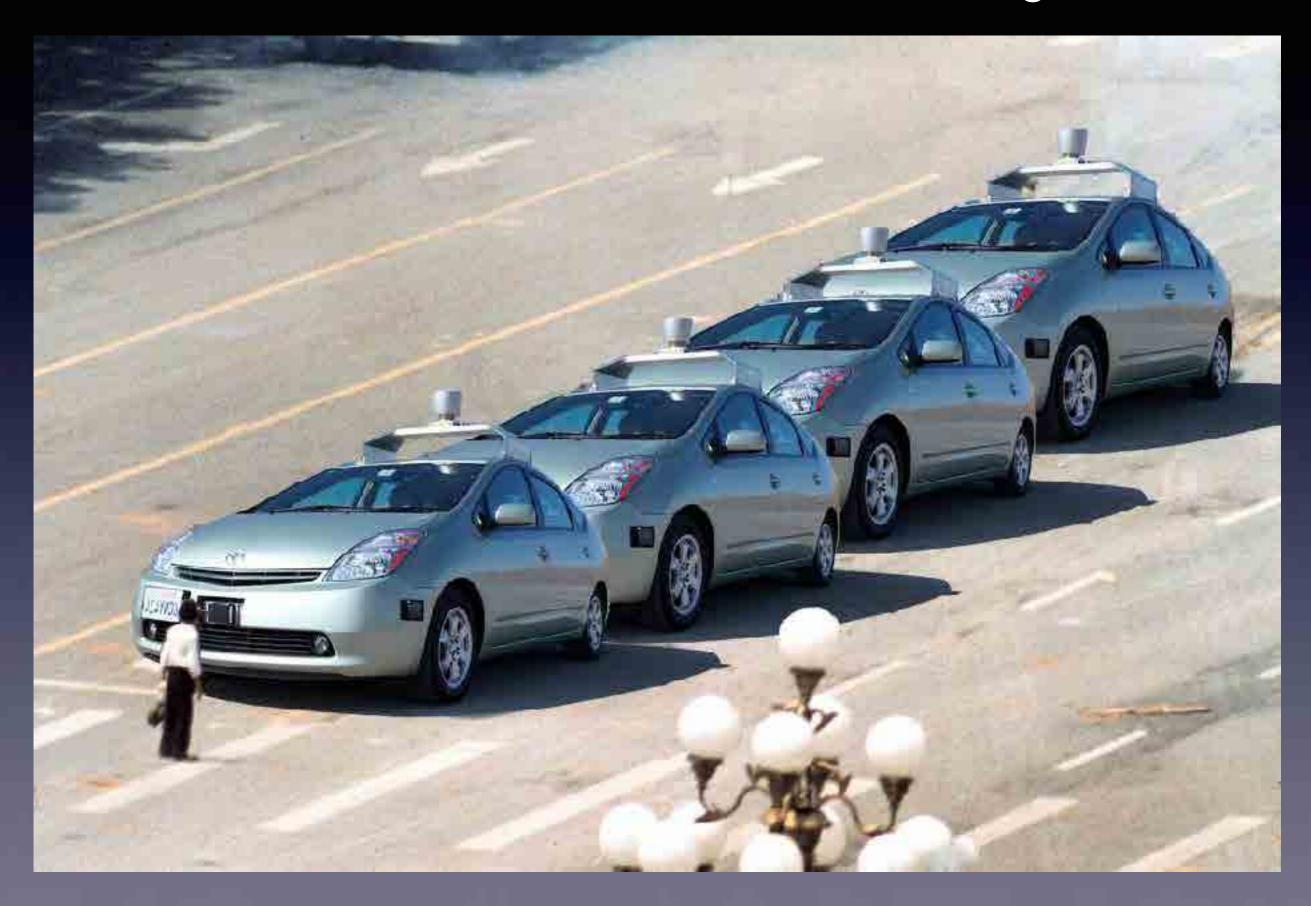
- UK: Nissan testing autonomous LEAFs in London since 2017
  - Jaguar Land Rover testing on public roads
  - Government promises £200 million research fund
- Sweden: Gothenburg driverless Volvo trials started Dec 2017 through 2018
  - Autonomous bus in northern Stockholm approved 2018
- Germany: BMW testing 40 vehicles in Munich
  - Promises to sell autonomous electric vehicle for autobahn in 2021
  - Autonomous bus trials in 2018 at Berlin hospital and Bad Birnach, Bavaria
- France: automated shuttles in Paris from 2017
  - Legislation to allow open road testing
- EU project AUTOPILOT: 2017-2019, 6 cities, €25,000,000

#### The Revolution Is Coming



- Advantages:
  - Energy efficiency
  - Time efficiency
  - New applications

#### The Revolution Is Coming





Transportation



Oceanography



Mapping



Filmmaking



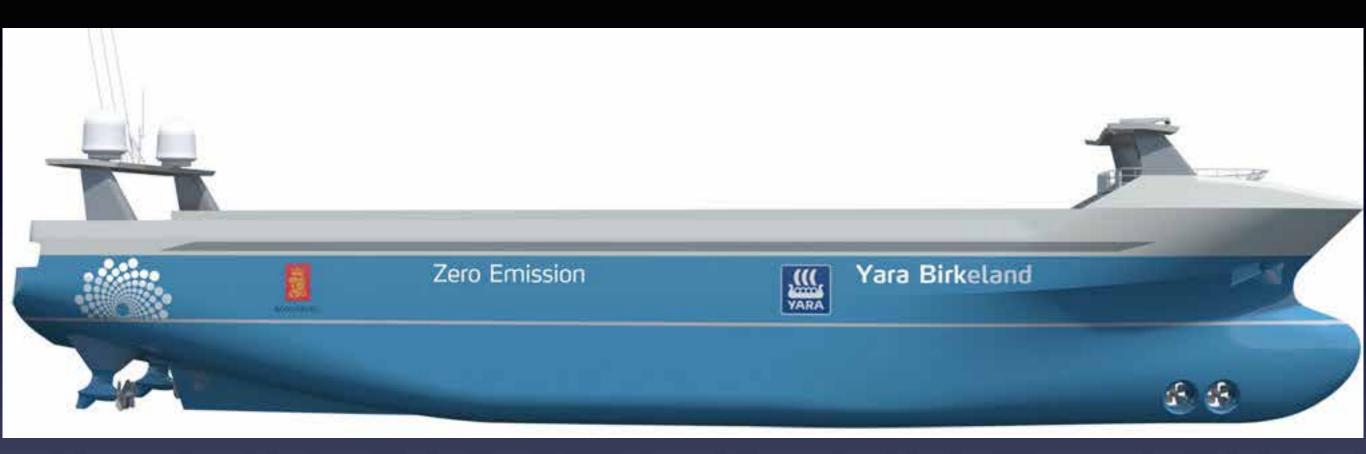
Powerline Inspection



Logistics



- Unmanned cargo shipping
- 75% of maritime accidents caused by human error
- Major technical challenge: dealing with hardware failure on long voyages



- Kongsberg Yara Birkeland
  - Zero emissions, autonomous capable
  - Replaces 40,000 annual truck trips
  - 2020: Manned operation & testing
  - 2021: Downcrewing
  - 2022: Fully autonomous operation

- Priorities:
  - Precision Agriculture
  - Self-Driving Cars
- Roadblocks:
  - Shared Infrastructure (Airspace, Roads)
  - Acceptance (Safety, Robustness)
- Let's Talk Failure!





### Classic Failures

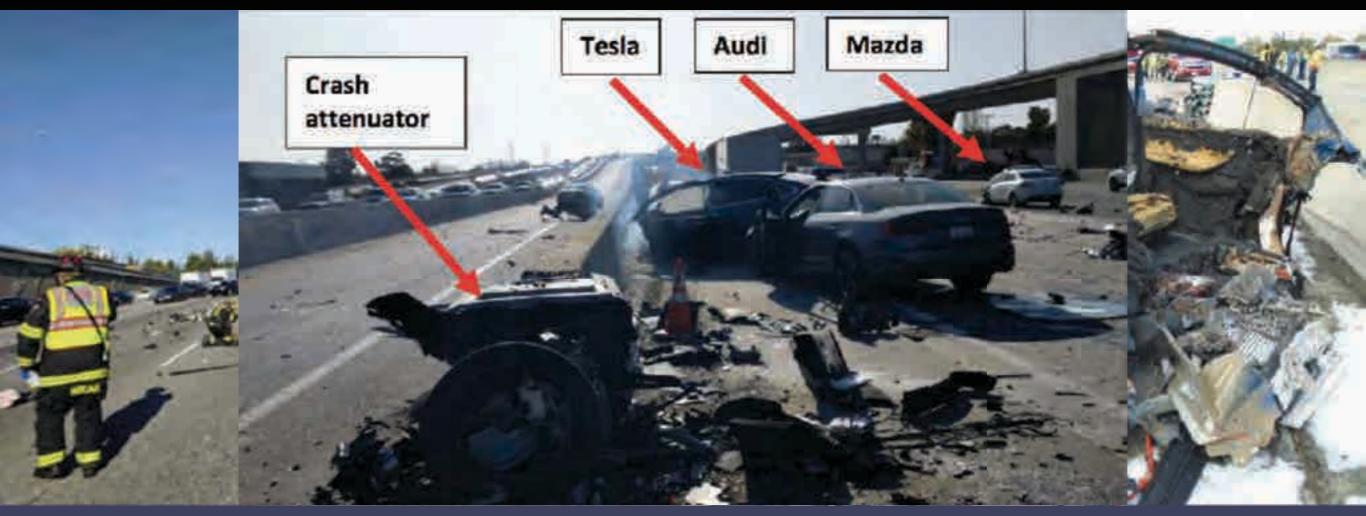






- Deciding what the robot "knows" is a constant battle
- Correct state estimation is key to decision making
- Successful exploits will most likely subvert state estimation

#### Classic Failures



Fatal Tesla Autopilot Accident US-101, March 2018

- Dynamic cruise control + autosteer lane following
- 120 kph impact with previously damaged crash attenuator
- Vehicle selected poor lane markings over lead vehicle
- Fragile decision making & edge cases abound

#### Autonomous Vehicle Logic Structures

**Activity Hierarchy** 



- Attacks lower in the stack defeat everything above
- More engineering effort spent on guaranteed robustness at lower levels
  - Lower layers may be juicier but harder targets

#### Autonomous Vehicle Logic Structures

#### **Examples**



Lifesaving Drone



Pizza Delivery

Mission Task Planners/ Reasoners

**Collision Avoidance** 

Control Loops, Stability Maintenance

Dynamic "bombing run" planner, impact point estimator

Navigation & Localization → GPS waypoint circuit

→ None!

Autopilot PID loops tuned for environmental conditions

Mission Task Planners/ Dispense pizza to credit card < Reasoners

Route planning from SLAMgenerated sensor map

Navigation & Localization

Dynamic obstacle discrimination & avoidance

Balancing, weight shifting <

**Collision Avoidance** 

Control Loops, Stability Maintenance

- Extremely vulnerable to collision
- High level logic depends on single sensor

Vulnerable to redirection, trapping and map-confusion attacks

Sensors

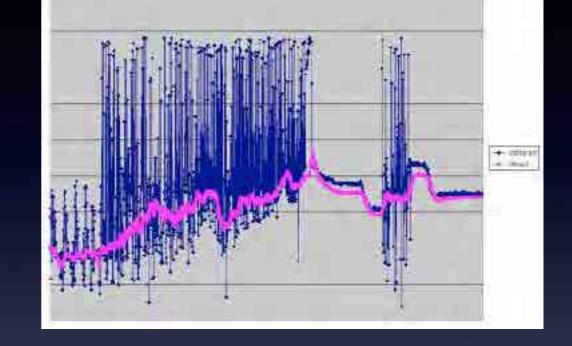
- Active vs Passive
- Common sensors:
  - GPS
  - LIDAR
  - Cameras
  - Millimeter Wave Radar
  - Ultrasonic Transducers
  - Digital Compass
  - IMU
  - Wheel Encoders
  - Doppler Velocity Logger (subsurface)
  - Scanning SONAR (subsurface)
  - Pressure Transducers (air & subsurface)





#### Sensors

- Sources of uncertainty:
  - Noise
  - Drift
  - Latency & update rate



- Uncertainty must be modeled under assumptions
- Sensor fusion:
  - Fused/registered data can be more useful than separate
  - What to do when sensors disagree?
- Robot robustness may come down to:
  - How smart is it at discounting 1 bad/spoofed sensor?

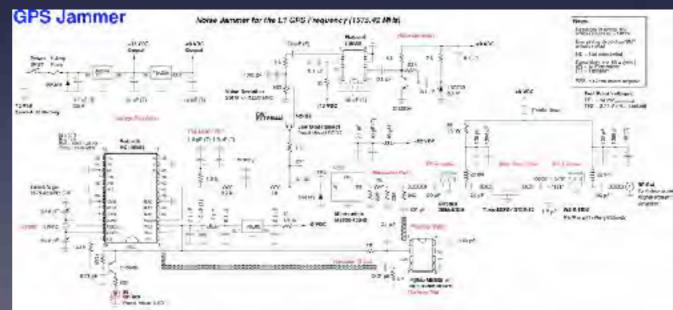
# Sensor Attacks



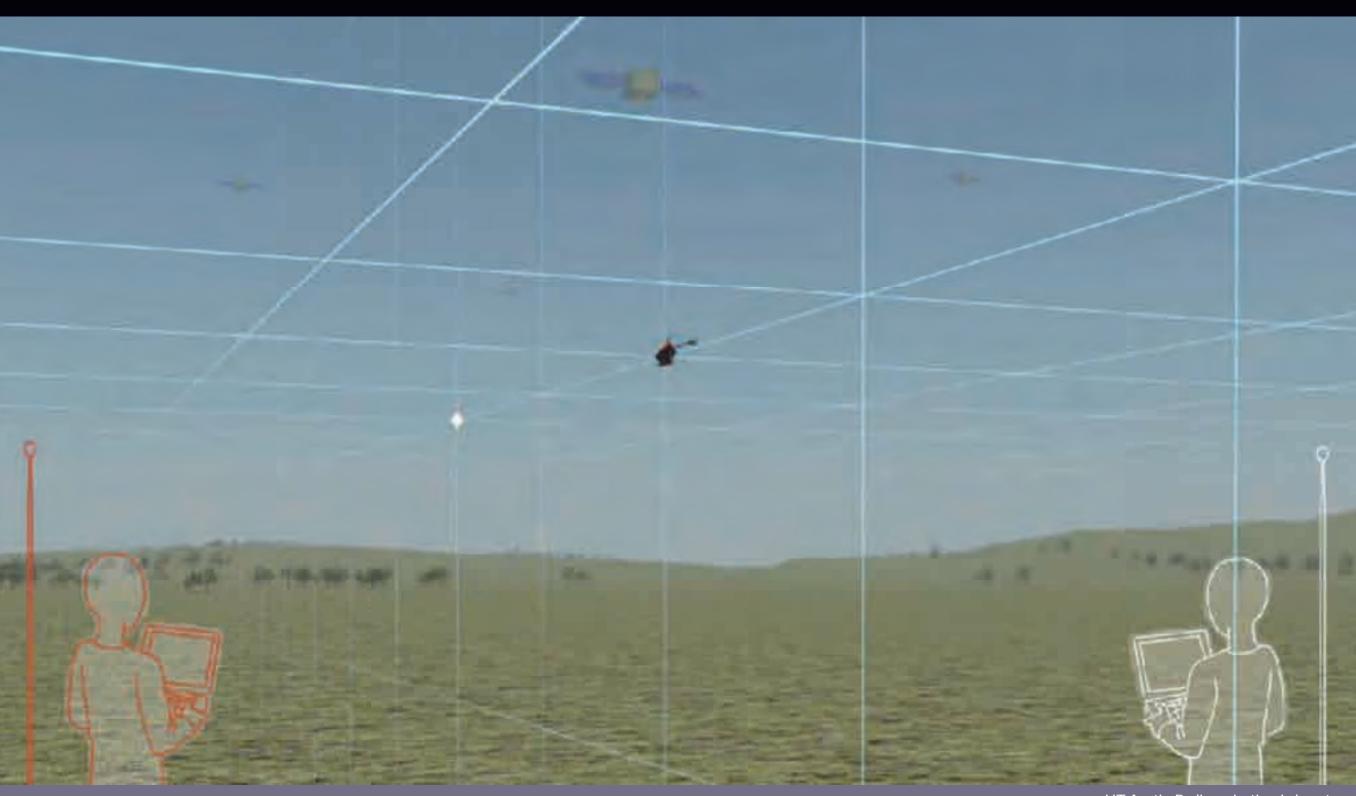
- 2 kinds:
  - Denial
    - Preventing sensor from recovering useful data
  - Spoofing
    - Causing sensor to retrieve specifically incorrect data
- Basic attack mode choice:
  - Attack sensors instantaneously
  - Attack aggregated sensor data



- Denial:
  - Jamming
- Spoofing:



• Fake GPS satellite signals at higher power















- Low Cost GPS Simulator Using BladeRF SDR
  - Qihoo360 Unicorn Team Huang & Yang, DEF CON 23

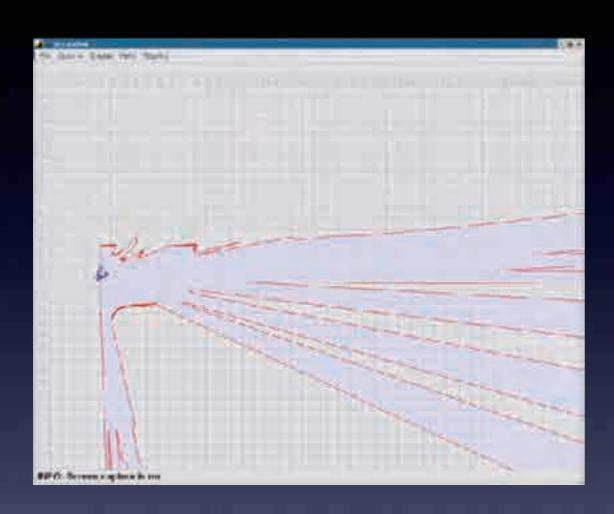


# UAV Takedown!



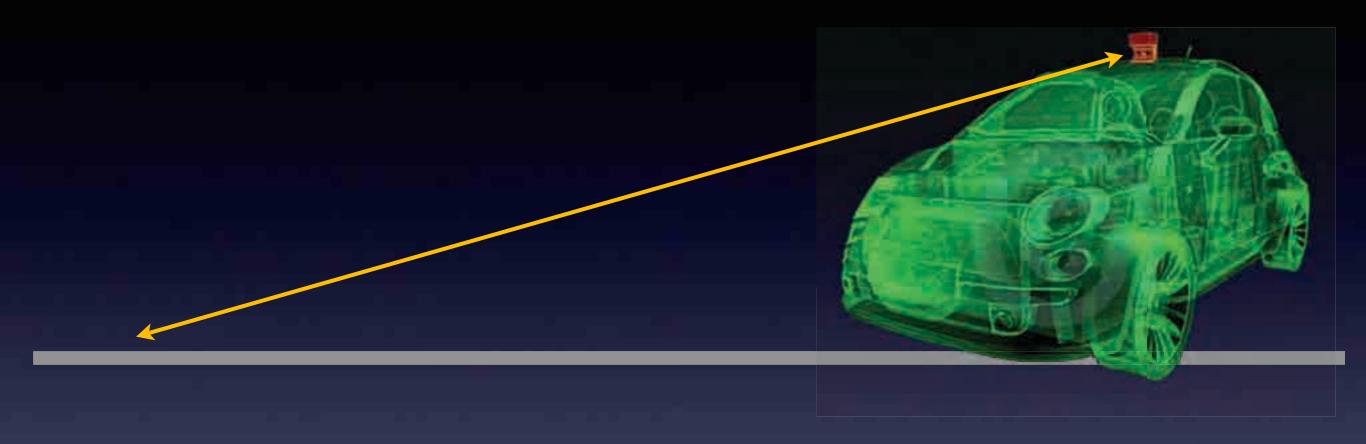


- Originally industrial monitoring sensors
- Mechanically scanned operation
- Primarily for collision avoidance & map building
- Denial:
  - Active overpowering
  - Preventing return signal
- Spoofing:
  - Manipulating absorbence/reflectivity
  - Active spoofing



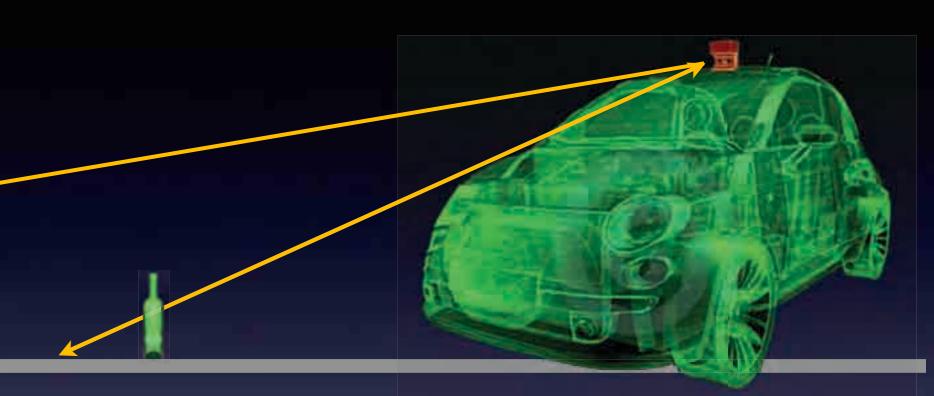


- 2D sensor highly orientation dependent
  - Inclines can look like obstacles
  - May miss low obstacles & discontinuities

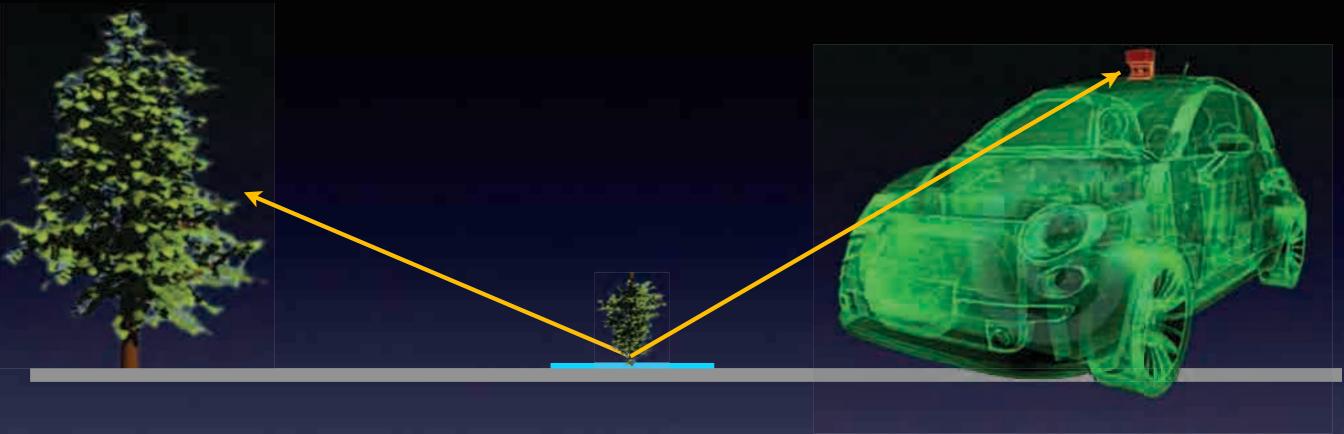


- Active emission sensor
  - Can only see what returns a signal
  - No return = nothing there
  - Most of the world returns no data

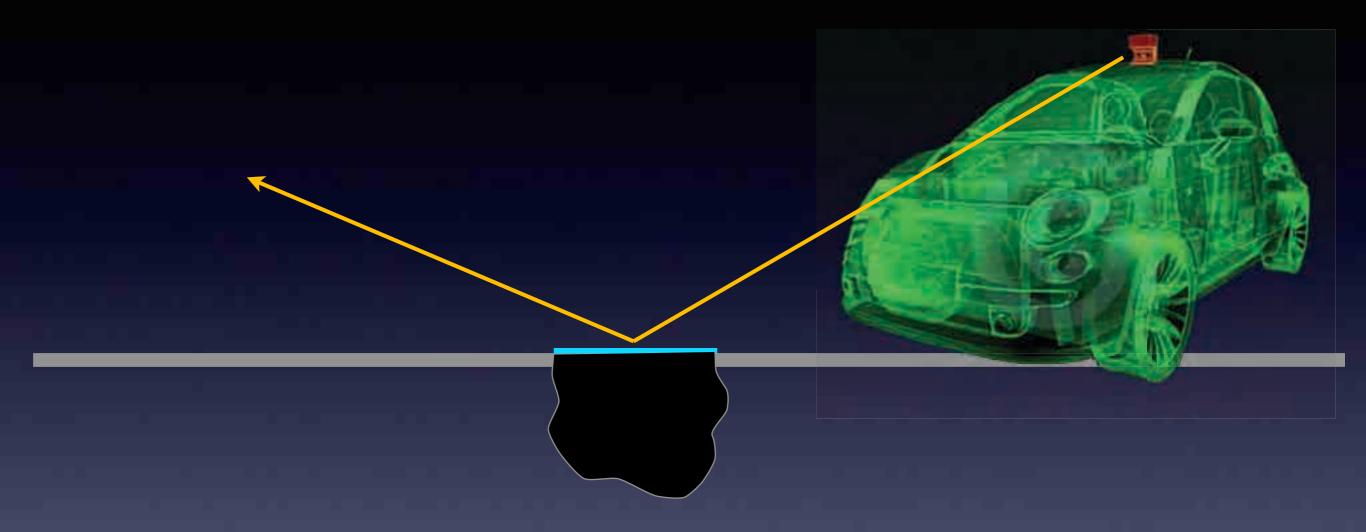




- Absorbent things look like nothing
  - Also transparent



- Reflective things can confuse laser
  - Faraway things brought near
  - Loss of return looks like ditch



- Reflective things can confuse laser
  - Faraway things brought near
  - Loss of return looks like ditch

في اعتقادي أن إفساد هذه الإسمار الوجية يعتمد على نابته أسياء السحين راي عام مناهض للهجمات دروع الجواسيس - تكتيكات التمويه والتضليل [ وهي كالتالي

(1) تكتيكات التمويه والتصليل هي محموحة خبرات جمعتها من تجارب بن

- 1 لكشف نوايا وسيمة الطائرة يمكن من خلال جهاز " سكاي كرابر " روسي الصنع الدخول على موجات وترددات الطائرة بدون طيار والجهاز متوفر في الأسواق وبسعر 2595 دولار ويتطلب خبرة في الحاسوب.

- 2 استخدام أجهزة تبث تريدات أو حزمة ترددات الأجل قطع الإتصال أو التشويش على التريدات التي تستخدم في السيلرة على الطائرة وقد كان للمجاهدين تجارب ناجحة باستخدام جهاز " الراكال " روسي الصنع .

- 3 وضع الرجاج العاكس فوقي السيارة أو فوق المبلي أو تكميره ونشره في المكال.

- 4 توزيع تشكيلة من القناصين السهرة الإصطياد الطقرات بدون طيار وخاصة الإستطلاعية الأنها تطبر على علو مذخفض 6 كيلو وما دون .

- 5 للتشويش على الإتصالات الألكترونية يمكن استخدام " دينموا " رفع المياة العادي وتزويده بعمود نحاسي بأكثر

عن 30 متر .

- 6 استخدام التشويش والتخليل بأجهزة الإتصال وتكون في وضع إتصال دائم وخاصة الأجهزة القديمة جدا حيث ان نبنباتها قوية جدا ويمكن استخدام أشراك خداعية لجذب أجهزة البحث الألكتروني فأفكار بسيطة كالذي فعله الجيش اليوغسلافي عندما استخدمو الجهرة الميكر وويف " الفرن " في جذت وتضليل صواريخ النيتو المزودة باجهزة بحث كهرومغناطيسي

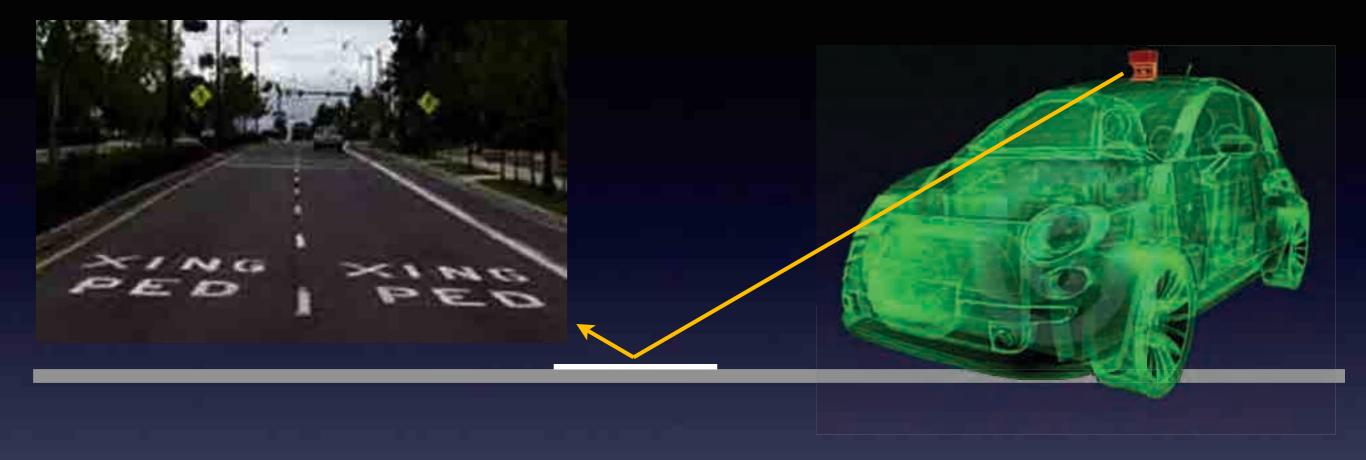
-7 النويه العام وعدم استخدام المقرات الكانعة.

- 8 اخذ العلم بوجود الطائرة عبر شبكات استطلاع موزعة بشكل جيد ثم التعميم على كافة التشكيلات بايقاف كل التحركات في المنطقة.

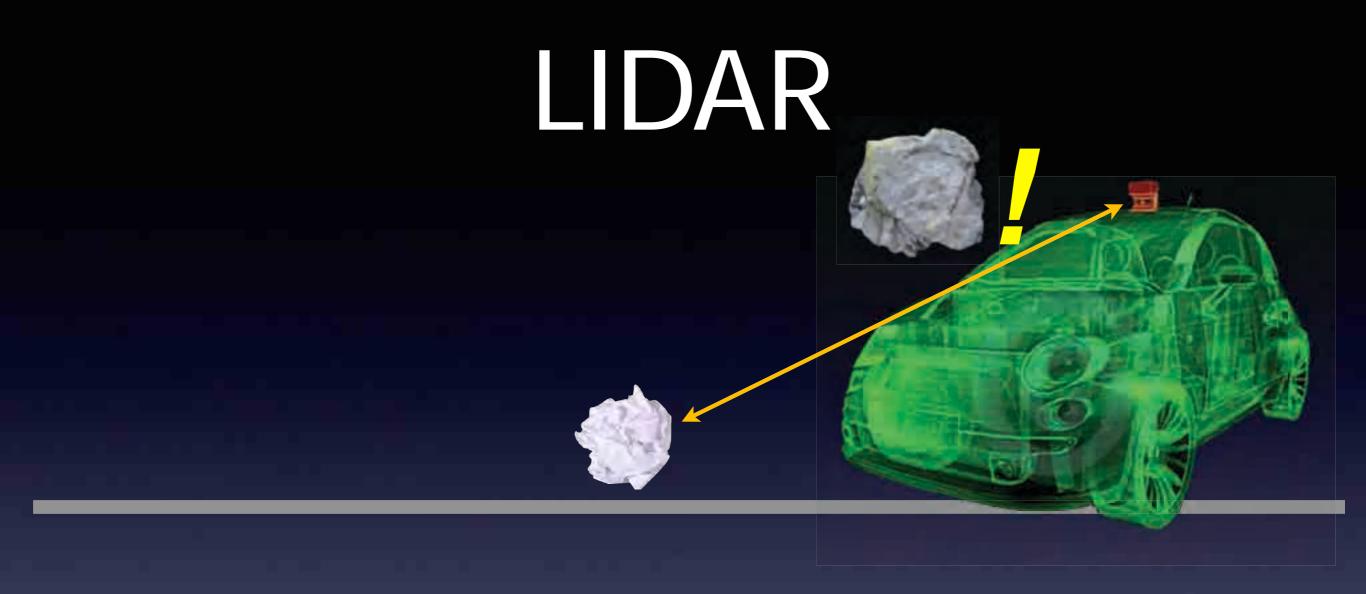
- 9 الإختفاء عن الرؤية المباشرة وغير المباشرة وخاصة في الليل . - 10 الإختفاء في الأماكن كثيفة الأشجار لأنها قضل وسيلة للإختفاء من الطقرات .

- 11 اللجوء إلى الأساكن غير المضاءة بأشعة الشمس كظل المبالي والأشجار.

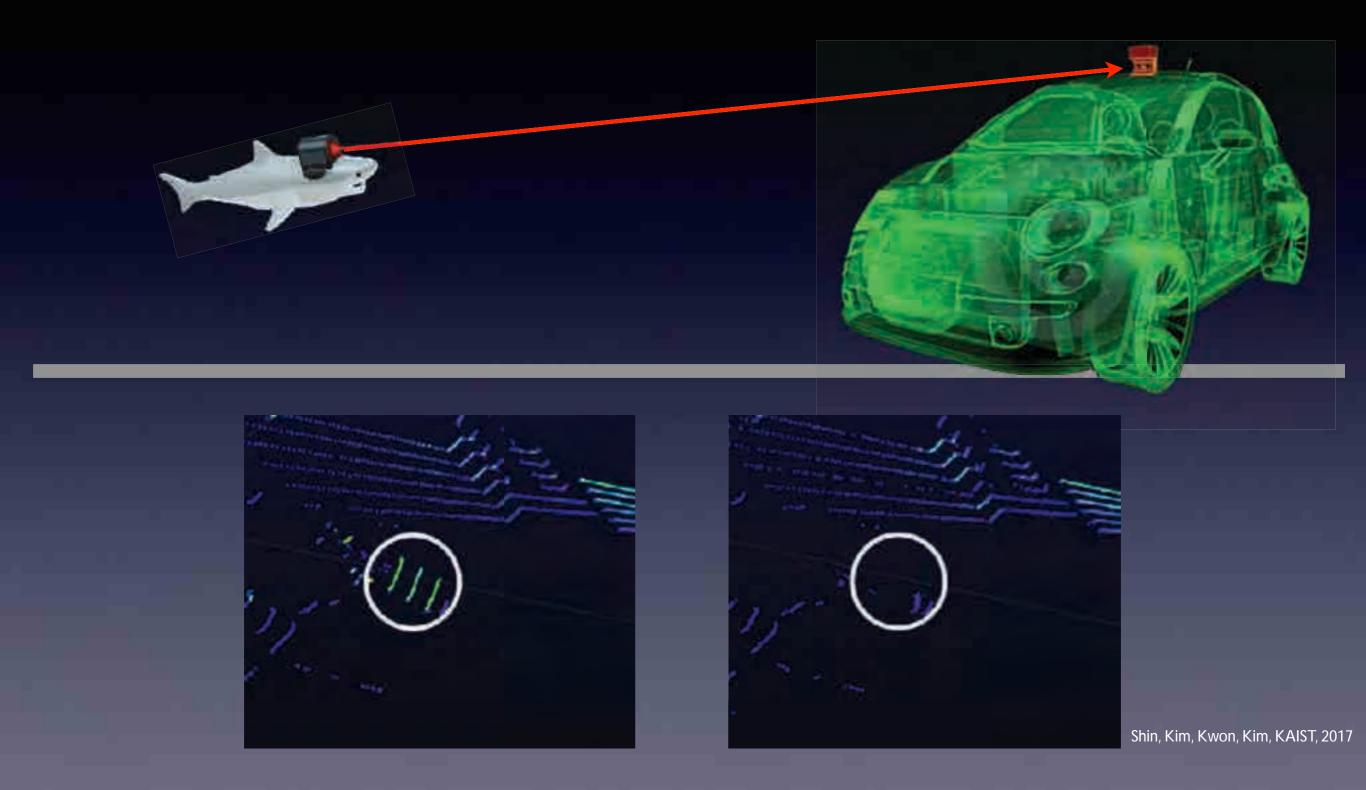
Use of reflective materials • to thwart laser designators



- Reflectance is also a feature
  - Road line detection
  - Can fake road markings invisibly to human



Solid looking objects look solid

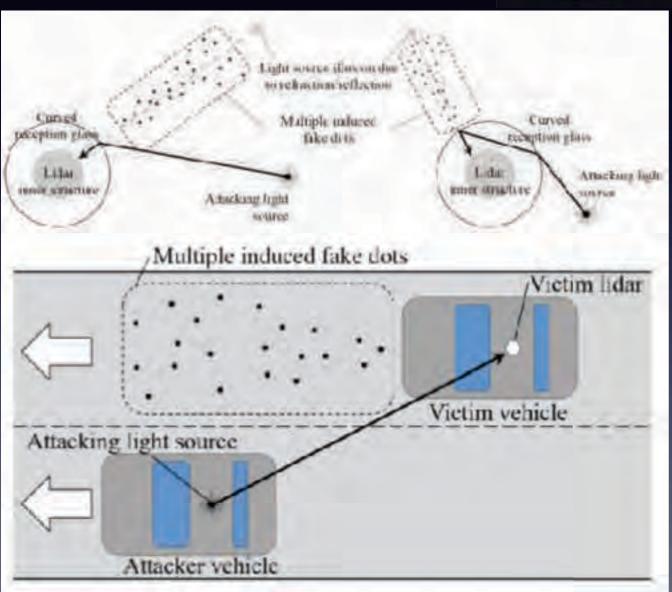


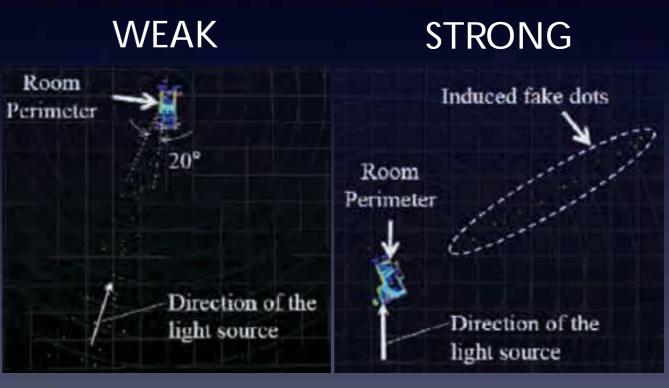
• Denial: strong source overpowers LIDAR in a certain area

#### LIDAR





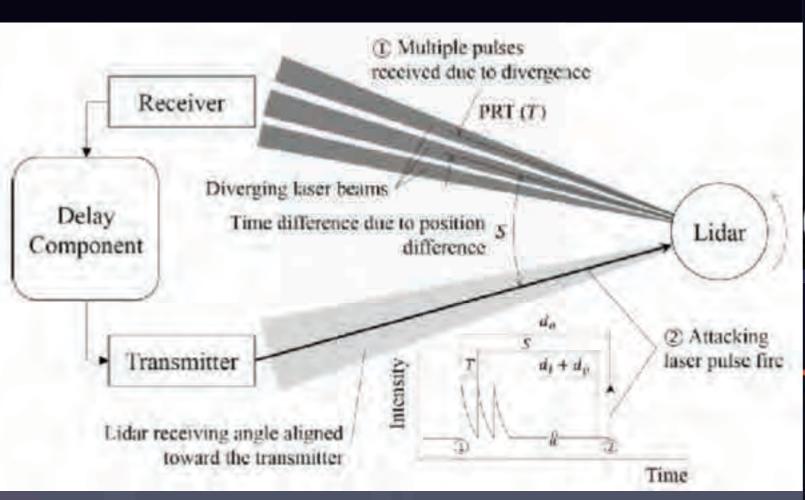




Shin, Kim, Kwon, Kim, KAIST, 2017

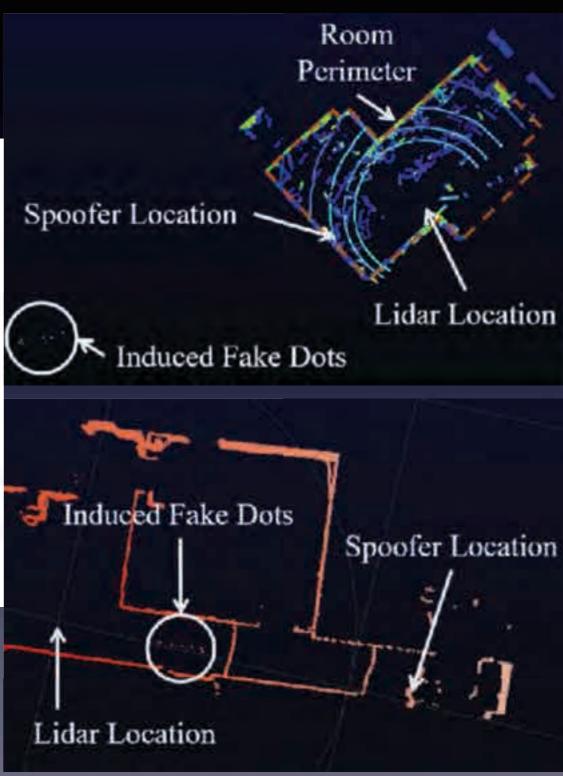
- Spoofing: weaker sources cause false returns
  - Can exploit curved glass refraction to alter location of false returns
  - Depends on source strength

#### LIDAR



Shin, Kim, Kwon, Kim, KAIST, 2017

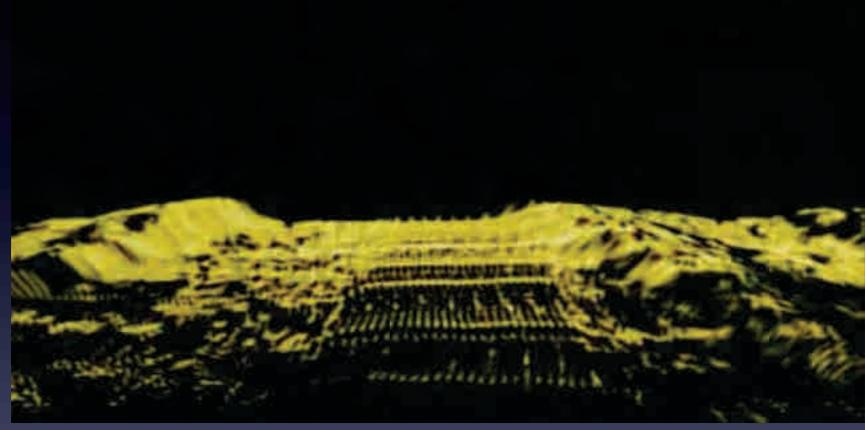
- Spoofing: Relay attack
  - Timing is critical for placement of fake returns



# Tesla Autopilot



### Cameras



- Specialized object detection (including signs and lane markings)
- Sometimes stereo for (noisy!) depth map
- Colorizing LIDAR
- Denial:
  - Easily dazzled
- Spoofing:
  - Camouflage techniques
  - Color assumptions
  - Repeating patterns

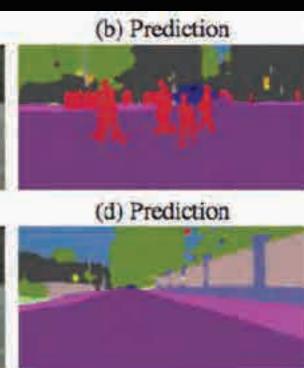
#### Cameras



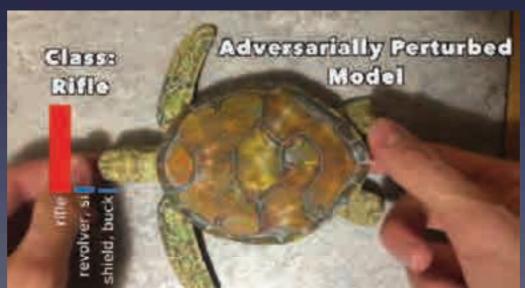








Eykholt et al., 2018



Fischer et al., 2017

Athalye et al., 2018

- Spoofing deep learning recognition models
  - Crafted adversarial examples
  - So far generally white box techniques
  - Do not currently work reliably in face of parametric distortions

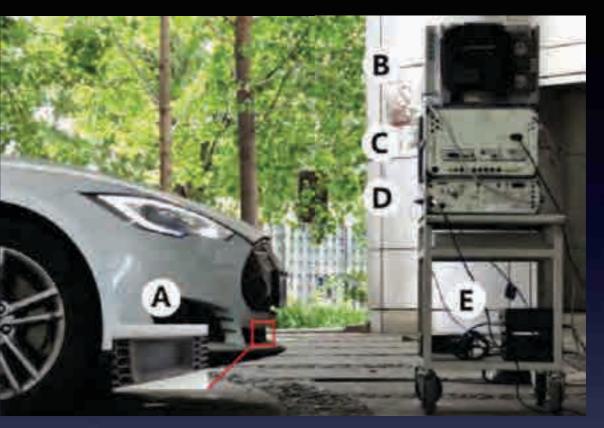
# MWW RADAR



- Collision avoidance
- Lower resolution than laser
- Most things very reflective
- Denial/spoofing:
  - Jamming
  - Chaff
  - Overhead signs

#### MMW RADAR



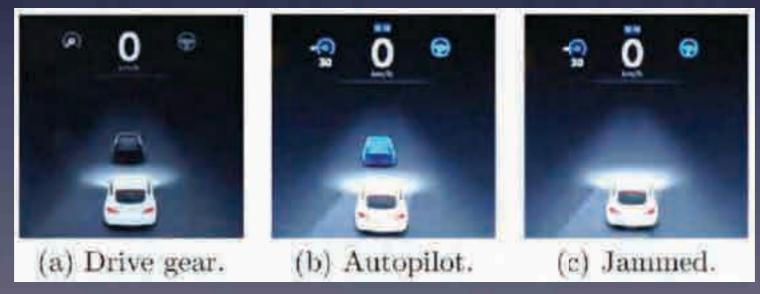


Oscilloscope

Signal Analyzer

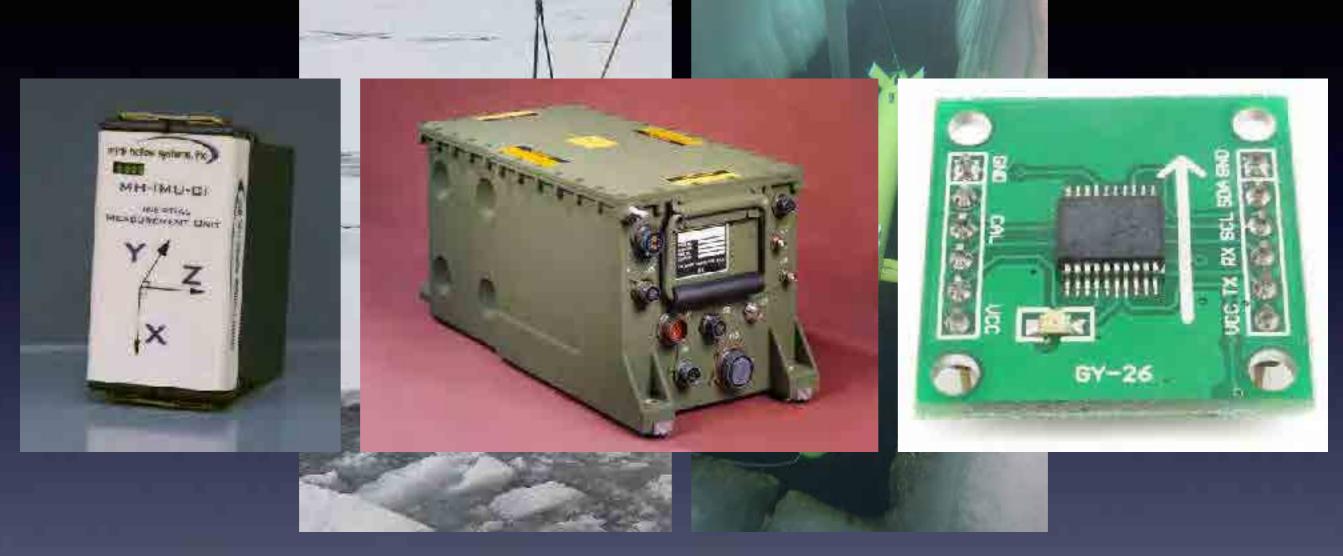
Signal Generator

Harmonic Mixer Frequency Multiplier



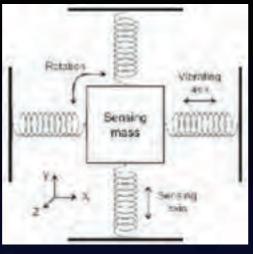
- Jamming: Contactless Sensor Attacks
  - Liu, Yan, Xu, DEF CON 24
  - Spoofing & relay attacks theorized but not performed

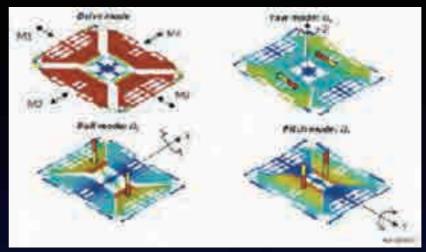
# IMU & Compass

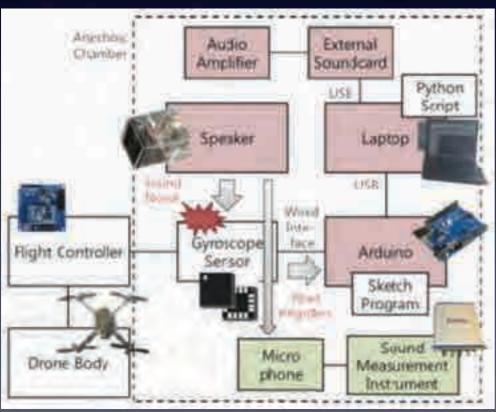


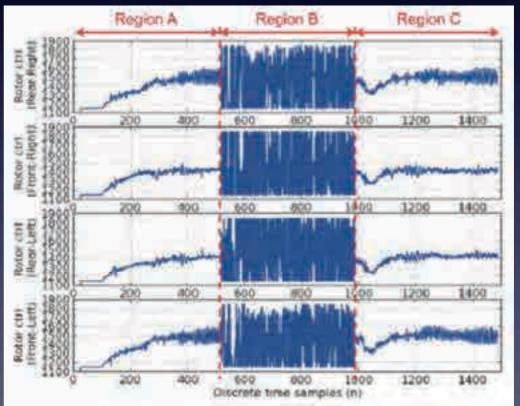
- Primary navigation sensor for some systems
- High fidelity models available
  - Typical cumulative error: 0.1% of distance traveled
- Denial/spoofing:
  - Extremely difficult to interfere with
  - Physical attacks with magnetic fields, thermal drift

# IMU Acoustic Attacks









Son et al., KAIST, 2015

- MEMS gyroscope vibrates & has resonant frequency
  - Can be perturbed with external acoustic source
    - Similar to well-known attacks on spinning hard disks
  - Successfully POC'd by crashing flying multirotor UAV

# Wheel Odometry

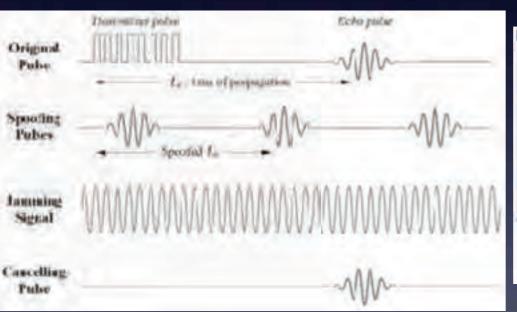


- Encoders
- Useful to know true speed & when stopped
- Attacks:
  - Change wheel diameter
  - Slippery surface
  - Removal may cause unpredictable behavior or stoppage

# Ultrasonic Sensors









Contactless Sensor Attacks (Liu, Yan, Xu, DEF CON 24)

- Automated parking sensor
- Only used at low speed
- Attacks:
  - Jamming
  - Spoofing
  - Cancellation

# Bond vs Robots



- GPS Jammer
- Smoke/Dust/Vapor
- Lightweight decoy obstacles
- Chaff
- Glass caltrops
- Oil slick

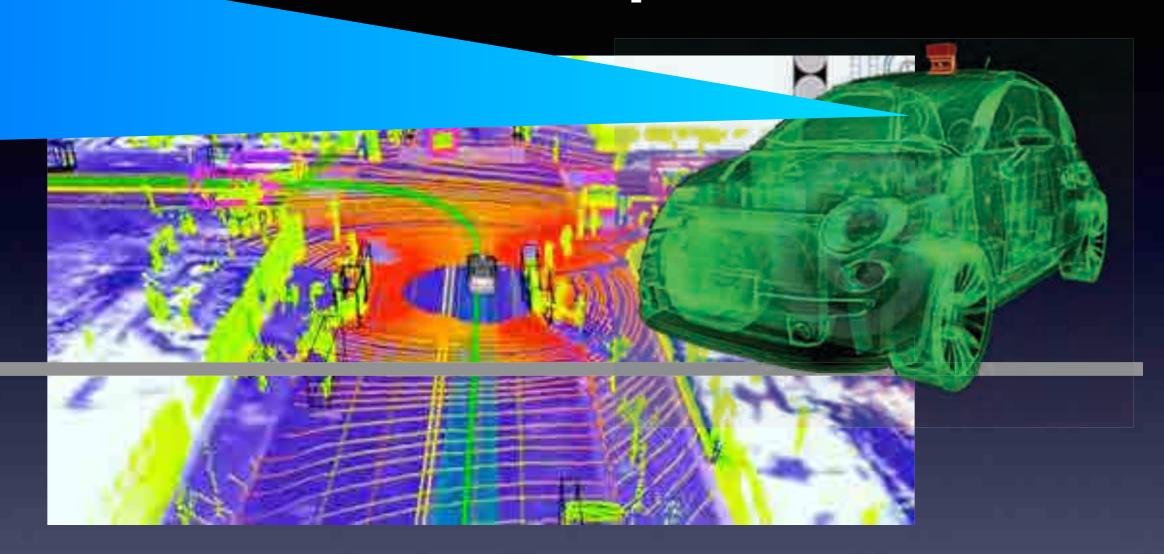
# Bond vs Robots



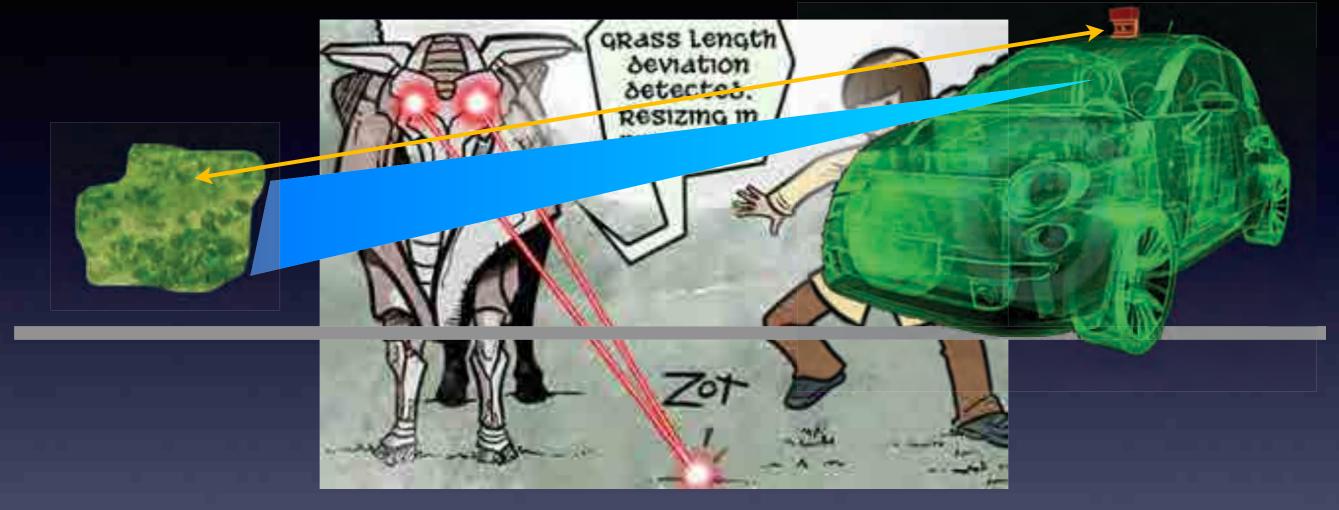
- Active LIDAR Jammer/Spoofer
- Active Radar Jammer
- Acoustic Blaster
- Adversarial Turtle Dispenser



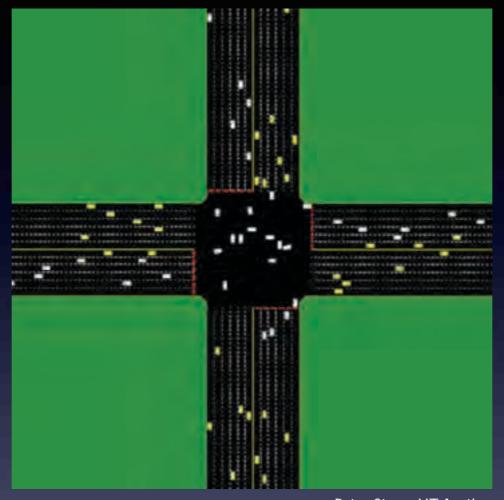
- Great emphasis on preacquired map data
- Often considered to be reference ground truth
- Reduces recognition load
  - Traffic lights
  - Vegetation
  - Other speed control & traffic management features



- Traffic lights
  - Camera knows where to look
  - Difference in robot vs human assumptions



- Vegetation
  - Colorized LIDAR
  - Transmission classifier
- Overhanging foliage
- Map dependence may exacerbate brittleness of discrimination rules



Peter Stone, UT Austin

- Map requires constant updates
- Local map:
  - Vulnerable to unexpected real world features
- Remote map:
  - Vulnerable to denial (4G jamming)
  - Vulnerable to spoofing (MITM attack, standard cellular intercept techniques)

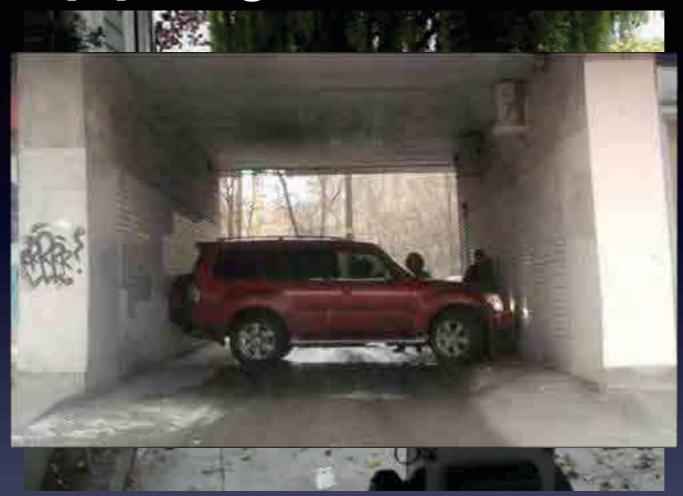
#### Exploiting the Logic Structure





- Goal: Maximize uncertainty
  - Requiring manual assistance
  - Confusing/annoying occupants
  - Inconveniencing other road users
- Concentrate on fragile maneuvers
- Attacker has access to map too

# Trapping/Redirecting



- Attacks at collision avoidance & navigation layers
- Force robot to postpone high level tasks
  - Moving obstacles
  - Obstacle swarms
  - Artificial stop signs
- Human driver wouldn't notice, robot can't ignore

#### Clobbering



- Goal: make robot run into something
- Subvert collision avoidance
  - Incapacitate vehicle
  - Damage/remove sensors
- Subtle map deviations
- Imitate light vegetation
- Simulate obstacles at speed
- Disguise entrance walls with reflective/absorbent material within GPS noise
- Dynamic obstacles under overhead signs

Would you buy a self-driving car that couldn't drive itself in 99 percent of the country? Or that knew nearly nothing about parking, couldn't be taken out in snow or heavy rain, and would drive straight over a gaping pothole?

If your answer is yes, then check out the Google Self-Driving Car, model year 2014.

— MIT Technology Review, August 2014

### V2V



Administration

NHTSA www.nhtsa.gov

DOT HS 812 014

August 2014

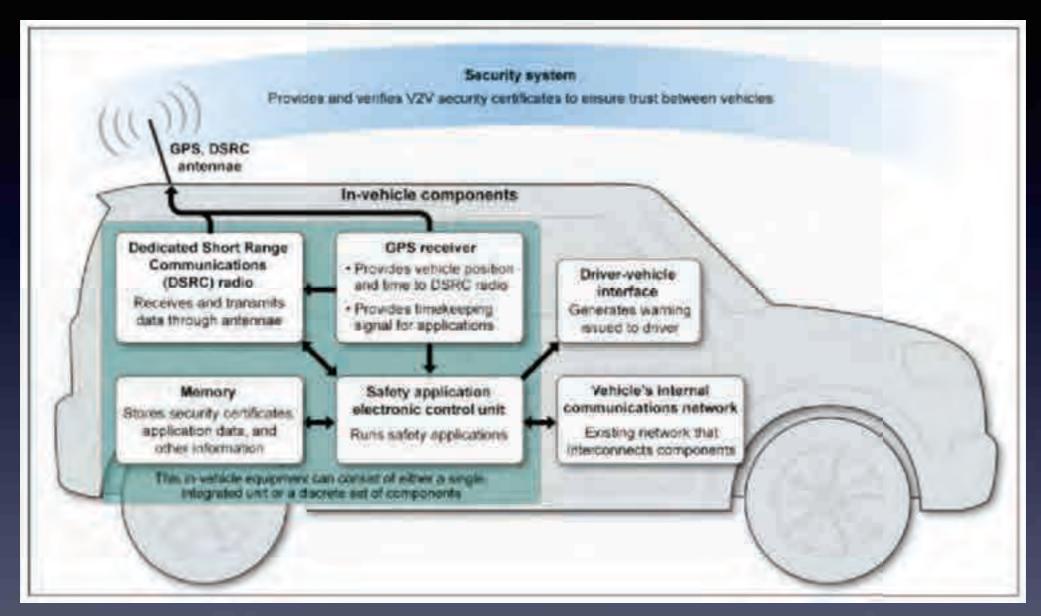
Vehicle-to-Vehicle Communications: Readiness of V2V Technology for Application

#### V2V Components

Scenario and warning type		Scenario example	
Rear end collision scenarios	Forward collision warning Approaching a vehicle that is decelerating or stopped.		
	Emergency electronic brake light warning Approaching a vehicle stopped in roadway but not visible due to obstructions.		
Lane change scenarios	Blind spot warning Beginning lane departure that could encroach on the travel lane of another vehicle traveling in the same direction; can detect vehicles not yet in blind spot.		
	Do not pass warning Encreaching onto the travel tane of another vehicle traveling in opposite direction can detect moving vehicles not yet in blind spot.		
Intersection sceparin	Blind intersection warning Encreaching onto the travel lane of another vehicle with whom driver is crossing paths at a blind intersection or an intersection without a traffic signal.		

• Just warnings for now!

#### V2V Components



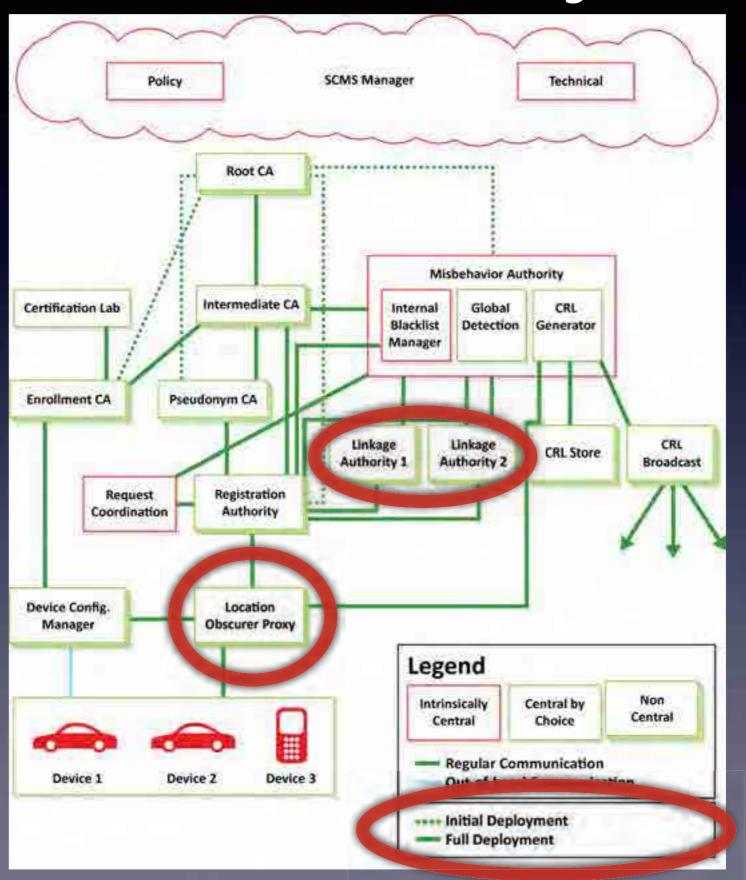
- Both on-board and roadside communicators
- DSRC: Omnidirectional, 300m range, 200-500 bytes
- Basic Safety Message (BSM) protocol
  - Not encrypted
  - PKI authenticated (signed via certificates)

#### V2V Transmissions

Part I		
Data Frame (DF)	Data Element (DE)	
Position (DF)	2000 2009 2001 80100	
	Latituda	
	Elgyation*	
	Loughtudo	
	Positional accuracy*	
Motion (DF)		
	Transmission state*	
	Speed	
	Steering wheel angle	
	Heading*	
	Lengitudinal accelerations	
	Vertical acceleration	
	Luteral acceleration	
	Yaw rate*	
	Brake applied status	
	Traction control state	
	Stability control status	
	Auxiliary brake storus	
	Brake status net available	
	Antilock brake sterus	
And the last discount of the l	Pind e Jucea applied	
Vehicle size (DF)		
	Vehicle within	
	Vehicle length  "Required in Safety Pilot Model Deployure	

- Part I: Core
  - Part II: Appended when changed, vehicle-specific
  - Note unencrypted GPS
    - Spoofing feedback?

#### V2V Security



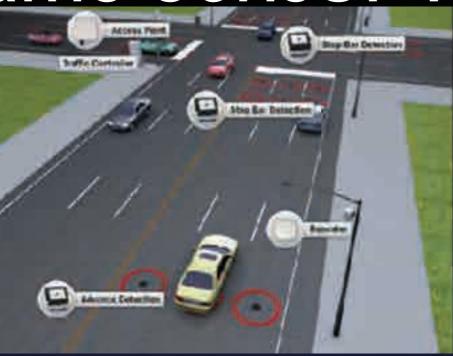
#### V2V Bottom Lines



- Careful rollout: 11 year development
- Slow & steady rollout: 37 years to full fleet
- Tracking/Privacy more immediate concern than other malicious attacks
- Standard PKI concerns, many yet TBD
- No direct control imminent (robots might get there first)

Traffic Sensor Flaws



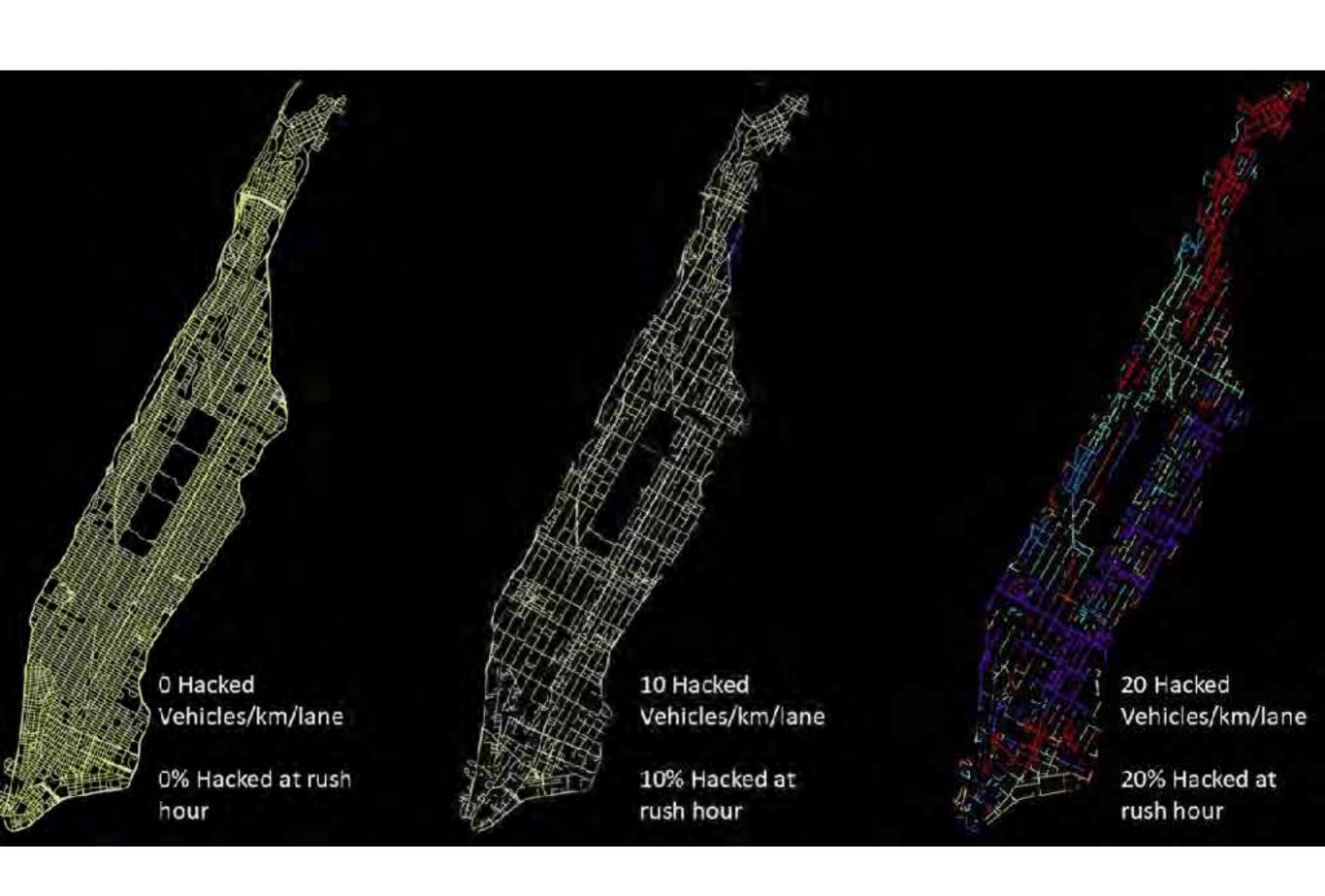








- V2V/V2I aims to avoid mistakes of current traffic sensors
  - Hacking US Traffic Control Systems, Cesar Cerrudo @IOActive, DEF CON 22
    - No encryption/authentication, wireless transmission in cleartext
    - Firmware updates neither encrypted nor signed
- No doubt will make others!



#### Remember...



Driverless vehicles are cool!

Don't do any of these things!

Don't hassle the Lieff!

Don't haxOr the Bots!



