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**"VIRTUAL PROVING GROUNDS FOR AUTONOMY DEVELOPMENT: USING SIMULATION TO DRIVE INNOVATION AND RELIABILITY"** 

Gabe Monroe, PhD Geotechnical and Structures Laboratory US Army Engineer Research and Development Center (ERDC) 30 OCTOBER 2024

> Approved for Public Release Distribution Statement: A For More Information, contact erdcinfo@usace.army.mil

U.S. ARMY



US Army Corps of Engineers⊛

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## WHO AM I AND WHAT DO I DO?











- Name: Gabe Monroe
- From: Meadville, MS
- Academic Background:
  - B.S. Mechanical Engineering (MSU, 2012)
  - Ph.D. Mechanical Engineering (MSU, 2016)
- Position and Lab: Research Mechanical Engineer, Geotechnical and Structures Laboratory
- Career: Have been with ERDC 8 years. Started 3 days after graduating with PhD
- Expertise: Modeling and simulation (M&S) for autonomous vehicle development/experimentation
  - Vehicle dynamics
  - Sensor physics
  - Thermal modeling
  - 3D modeling
- Real Life: I'm a husband, dad, woodworker, 3D printing hobbyist, D&D player/DM

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## BACKGROUND



## **DOD REQUIREMENTS FOR MILITARY AUTONOMY**



	Human Control [1]						
	<ul> <li>"Autonomous and semi-autonomous weapon systems will be designed to allow commanders and operators to exercise <u>appropriate levels of human judgment</u> <u>over the use of force</u>."</li> </ul>				AUGUST OF DEPART		
	Compatible with Law				DoD Directive 3000.09 Autonomy in Weapon Systems		
	<ul> <li>"Persons who authorize the use of, direct the use of, or operate autonomous and semi- autonomous weapon systems will do so with appropriate care and <u>in</u> <u>accordance with the law of war</u>, applicable treaties, weapon system safety rules, and <u>applicable rules of engagement."</u></li> </ul>				<ul> <li>nent: Office of the Under Secretary of Defense for Policy January 25, 2023 Cleared for public release. Available on the Directives Division Website at https://www.esd.whs.mil/DD/.</li> <li>BoD Directive 3000.09, "Autonomy in Weapon Systems," November 21, 2012</li> </ul>		
	Proven Reliability				Approved by:         Kathleen H. Hicks, Deputy Secretary of Defense           Purpose:         This directive:           •         Establishes policy and assigns responsibilities for developing and using autonomous functions in weapon systems, including armed platforms that are remotely operated or		
	<ul> <li>"The weapon system has demonstrated appropriate performance, capability, reliability, effectiveness, and suitability under realistic conditions."</li> </ul>			<ul> <li>operated by onboard personnel.</li> <li>Establishes guidelines designed to minimize the probability and consequences of failures in autonomous and semi-autonomous weapon systems that could lead to unintended engagements.</li> <li>Establishes the Autonomous Weapon Systems Working Group.</li> </ul>			
	Ethically Designed and Implemented	d Implemented		Responsible,	]		
	<ul> <li>"The design, development, deployment, and use of systems incorporating AI capabilities is consistent with the DoD AI Ethical Principles and the <u>DoD</u> <u>Responsible AI (RAI) Strategy and Implementation Pathway</u>."</li> </ul>			Equitable, Traceable, <b>Reliable</b> , Governable"			

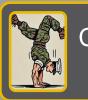
[1] DoD Press Release: "DoD Announces Update to DoD Directive 3000.09, 'Autonomy In Weapon Systems'", JAN 25, 2023



### **CASE STUDY: ROBUST AI IS HARD**







Crafty marines: 1 DARPA AI: 0



Crafty marines: 2 DARPA AI: 0



"The AI system had been trained to detect humans walking, not humans somersaulting, hiding in a cardboard box, or disguised as a tree. So, these simple tricks, which a human would have easily seen through, were sufficient to break the algorithm."



#### **Proven Reliability**

 "The weapon system has demonstrated appropriate performance, capability, reliability, effectiveness, and suitability under realistic conditions."

[2] Paul Scharre, "Four Battlegrounds: Power in the Age of Artificial Intelligence," 2023, ISBN 978-1324074779

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## THE LIMITATIONS OF PHYSICAL AUTONOMY TESTING AND EVALUATION (T&E)



#### Time

- Many developers may have months with only a handful of prototypes
- Testing centers only have weeks

#### Money

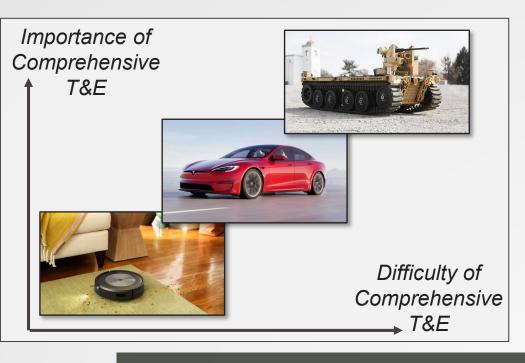
- Traditional T&E regimes can cost millions
- Autonomy requirements still being developed

#### Control

- Unable to control physical elements
- Tests have limited repeatability and narrow operational applicability

#### Risk

- Exploring behavior in dynamic environment (e.g. pedestrians, traffic, wildlife) is dangerous
- Damage to exquisite platforms during testing can delay completions



#### Testing like this is insufficient ... if this is where you operate.





# ERDC's Synergy



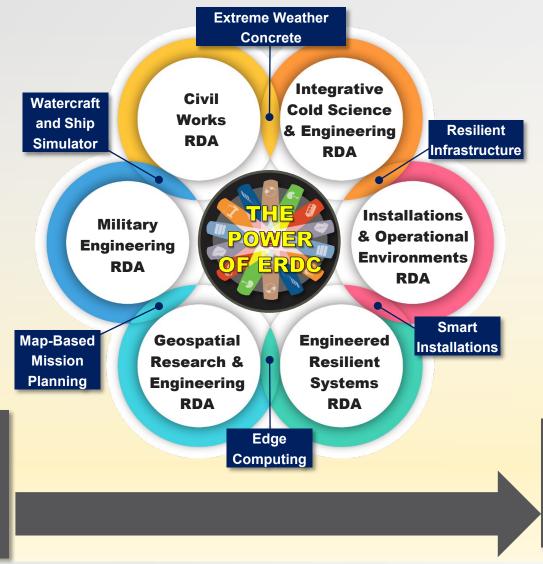
We Excel at Extending Innovation Across Different Mission Spaces

### Watercraft and Ship Simulator: Civil Works



A civilian pilot practices guiding barges down a river

The same Watercraft and Ship Simulator Facility and research team that supports our Navigation mission in Civil Works R&D....



### Watercraft and Ship Simulator: Military Engineering



A Warfighter pilot practices nearshore maneuvers

... also supports our Warfighters as they plan logistics-over-the-shore operations overseas.

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## SIMULATIONS FOR AUTONOMOUS VEHICLES



# VIRTUAL AUTONOMOUS NAVIGATION ENVIRONMENT (VANE)



### Purpose

• Is a <u>suite</u> of tools that are modular, extensible, and distributable to DoD

### Scope

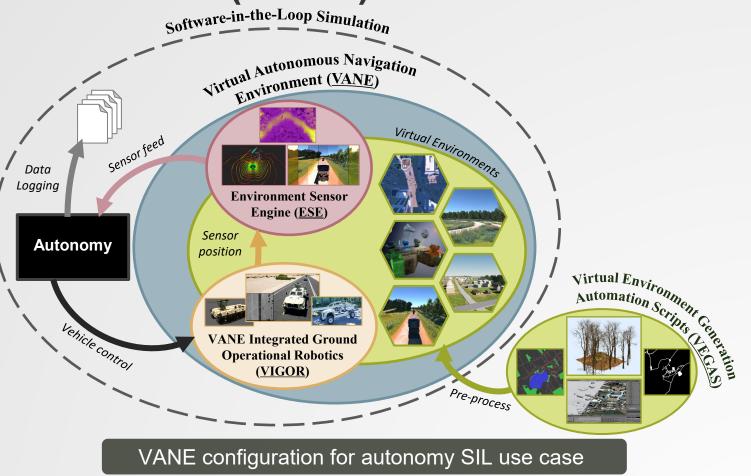
 Provides both real-time and high-fidelity simulation capabilities for ground vehicles (wheeled or tracked) and sensors

### Capability

 Supports the full robotics development cycle by performing autonomy-in-the-loop simulations

### Advantage

 Allows virtual evaluation of sensors and autonomous vehicles in various environmental conditions

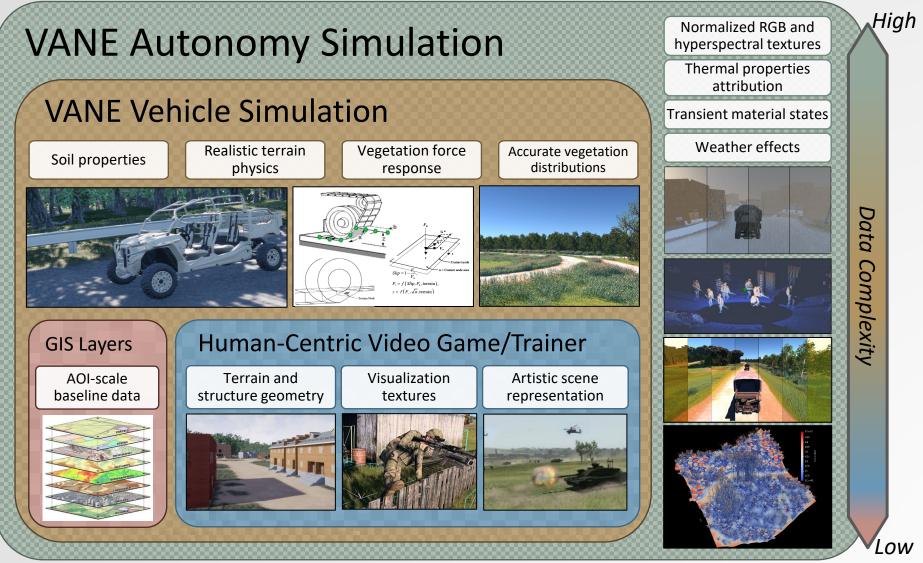


Virtual testing of sensors and autonomous vehicles in various environmental conditions to augment physical testing and ensure a robust system while saving time and money



# VIRTUAL ENVIRONMENT REQUIREMENTS FOR AV SIMULATIONS







## **VANE VEHICLES-TERRAIN INTERACTION**



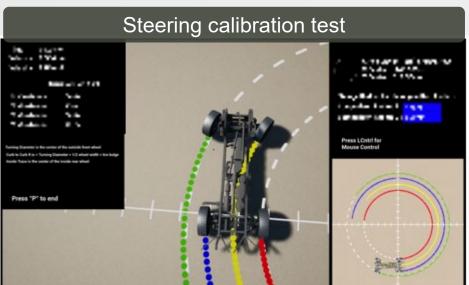
#### Vehicles-Terrain Interaction Validation

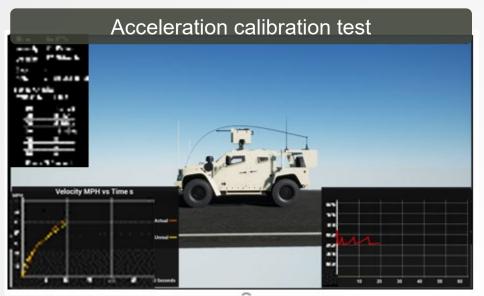
- Virtual vehicle performance metrics determined with VANE implementations of standardized vehicle tests
  - Acceleration, NATO double lane change, braking, steering, ride-shock, etc.
- Vehicle models calibrated by comparing virtual test data with production verification test reports
- Terrain properties based on mobility metrics from ERDC field test data
- Lumped parameter models used for vehicles and terrain for simulation speed



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Accurate and real-time vehicle models provide surrogates for autonomy to control during simulations



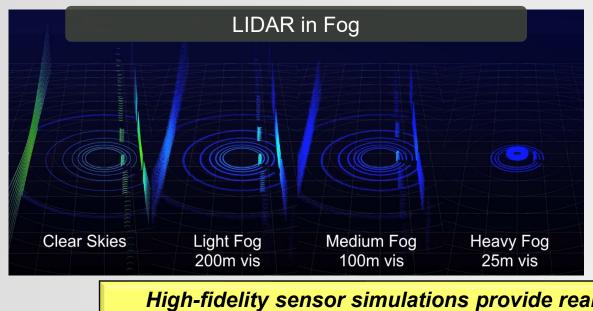




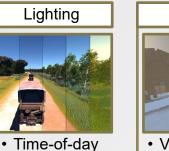
## **VANE SENSORS AND WEATHER EFFECTS**



- High-fidelity sensor models generate realistic synthetic sensor data
  - Replicates common sensor error found in real world
- Includes environmental effects that can degrade sensor perception
  - Weather, lighting, polarization, etc.
- Can vary fidelity/complexity to balance accuracy and speed of simulations
- Can generate labeled training data for algorithm development



#### Current Key Environmental Factors in VANE



- Variable rainfall rate Shadows
  - Wind effects
- Atmosphere haze

Polarization

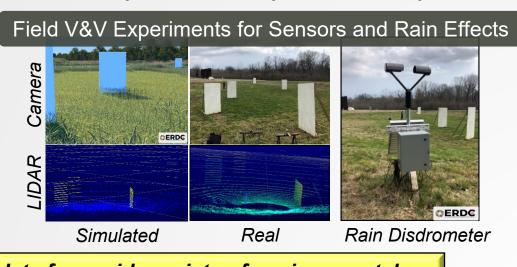






 Vehiclegenerated dust Wind effects

- density Beam/fog options for
  - fidelity vs. performance



High-fidelity sensor simulations provide realistic data for a wide variety of environmental conditions at a fraction of the time and cost of physical experiments

Variable fog



## SYNTHETIC TRAINING DATA

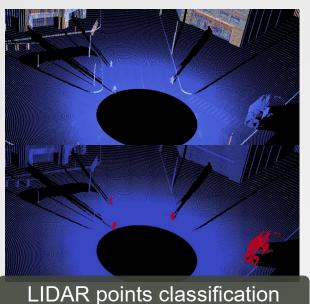


### Importance

- Machine Learning algorithms are advancing rapidly for UxV navigation and for intelligence analysis
- Detection and classification algorithms are only as robust as their training datasets

## Impact of VANE

- Effective algorithms require ~1000s of labeled training images (manual labeling takes weeks/months)
- VANE can rapidly generate ~10,000 ground-truth training images (automated in hours/days)

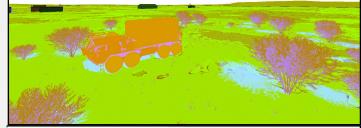


### Tracking Tracking Multiple Object Labeling Versatile labeling

#### VANE::ESE RGB Camera Image



Ground Truth Image



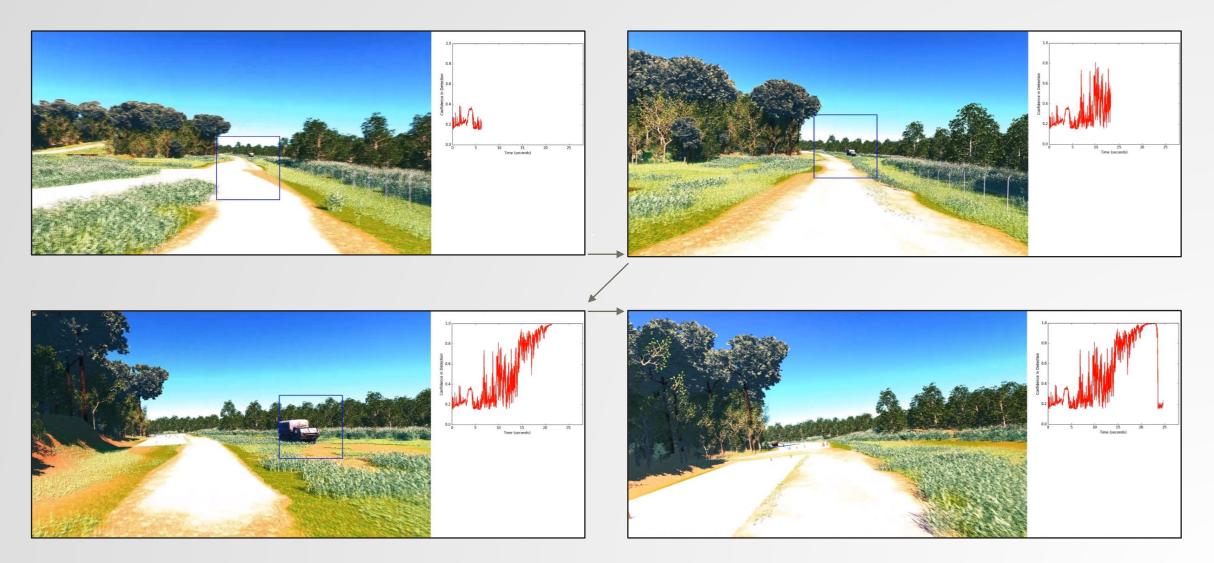
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	98	0		SM RaisedLookOutStand GraylingSFOB.obj
ł	117	0	0	SM_YellowGateRight_GraylingSFOB.obj
I	137	0	0	SM_ObservationTower_Grayling.obj
I	156	0	0	surface
I	176	0	0	trees
I	196	0	0	grass
I	215	0	0	HEMTT_full_static.obj
I	255	0	0	Sky
I	0	8	0	chainlink.bmp
I	0	17	0	metal.bmp
I	0	25		quad_front.bmp
ł	0	34	0	tin_buiding.bmp
			F	ully labeled ESE image

M&S-enabled machine learning algorithm development by providing synthetic data with sufficient entropy and metadata to fulfil the object detection and classification training needs



# EXAMPLE OF OBJECT DETECTION WITH VANE DATA (VIDEO SCREENSHOTS)







## **SOFTWARE-IN-THE-LOOP (SIL) SIMULATIONS**

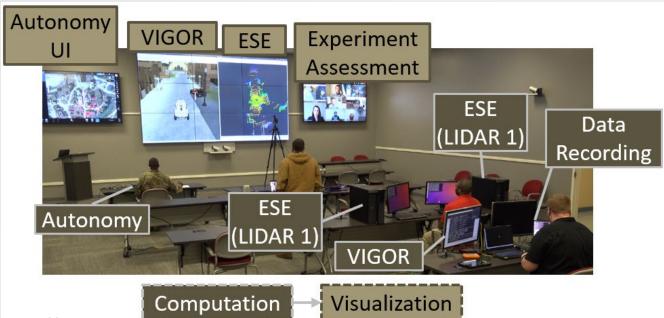


#### **Overview**

- SIL simulations combine environment, vehicle, and sensor models into comprehensive M&S architecture
- Allows for development or evaluation of autonomy without requiring physical system or test ranges



UGV path comparison of multiple real and virtual experiments



### VANE Payoff

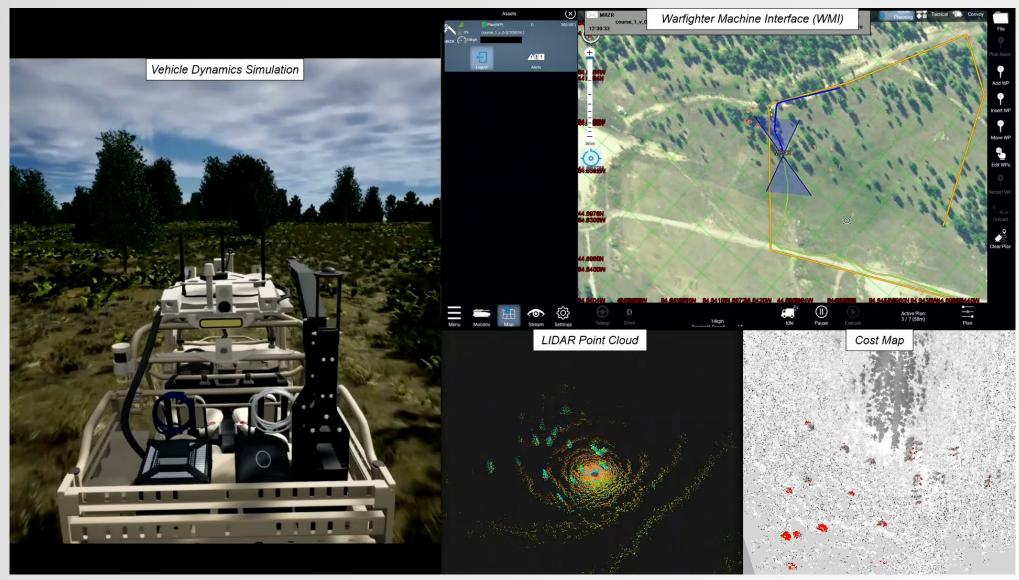
- Same communication protocols (e.g. ROS) as physical systems
- High-fidelity sensor-feed for autonomy to process
- Validated vehicle models for Autonomy to control
- Realistic virtual world impact autonomy behavior and performance
- Parameterized testing in low-cost, zero-risk virtual environment

Augment physical experiments with virtual evaluation of AGVs in diverse conditions



## **VANE SIL SIMULATIONS**









## **OTHER USE CASES**



### **ERDC M&S SUPPORT TO SANDHILLS REMOTE BREACHING EXPERIMENT**



*Project Objective*: Rapidly develop a simulation tool for virtual teleoperation of multiple current and near-future platforms in digital twins of Ft Liberty test ranges to augment the limited time combat engineers have with physical platforms

#### VANE-RBS: Remote Breaching Simulator

- Leveraged on-going work being done in support of Army robotics to expedite development
- Constructed multi-user architecture to enable virtual breaching operations in a shared simulation environment
- Coordinated with combat engineers to replicate physical Sandhills Project vignettes
- Enables units to develop TTPs and gain experience related to remote breaching operations



State-of-the-art simulation with realistic vehicle models in complex virtual environments decreases cost, time, and risk



Virtual experimentation of novel operational concepts augments physical training and accelerates human machine integration for combat engineering

Logging and playback of vehicle positions and obstacle locations enables robust AARs and data analysis

Synthetic IR image of Maury PZ obstacles

On-going work to integrate ERDC's high-fidelity thermal simulations into VANE-RBS UAV model



Digital twins of Ft. Liberty ranges enhance training by allowing virtual parameterization of obstacles and scenarios

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## AUTONOMY T&E GOAL: M&S INFORMED PHYSICAL TESTING

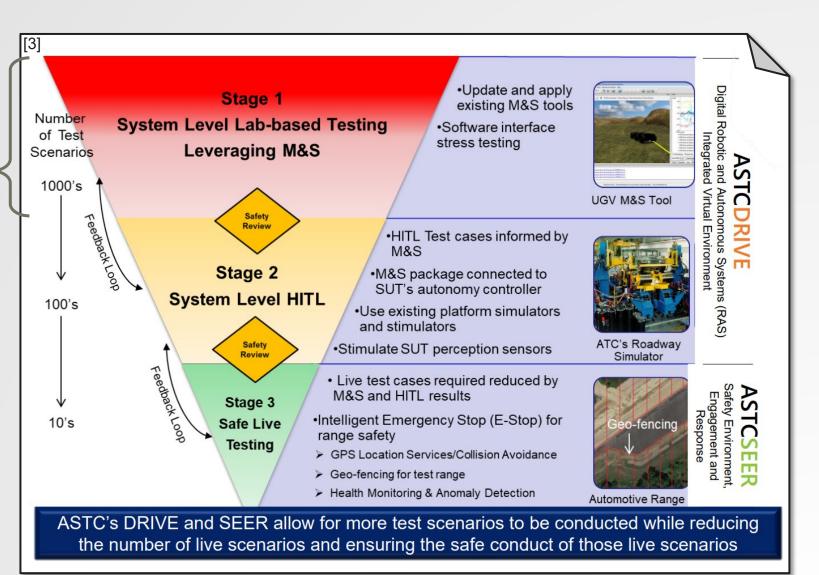


**Existing Case Study** 

- Aberdeen Test Center (ATC) is leading the Autonomous System Test Capability (ASTC) program to address autonomous safety testing
  - Leveraging VANE::ESE for sensor simulation
- Reduces the vehicles' required time on the test courses while accrediting the safety of the autonomy
- Enables ATC to do more with the time and money available
  - E.g. Current system can "run a typical Leader Follower test phase in 2.5 hours collecting 192 GB of test data, reducing the cost by 98%, and the carbon foot print by 3,200 gallons of fuel" <sup>[3]</sup>

[3] J. Whitt, P Bounker, "The Use and Benefits of Modeling and Simulation with Autonomous Vehicle Testing", U.S. Army Aberdeen Test Center

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## **ADDITIONAL RESOURCES**





Power of ERDC Podcast Ep. #8: Modeling and Simulation for Unmanned Ground Vehicles (ERDC, Audio, 2021)



ERDC Modeling and Simulation in Support of Unmanned Ground Vehicles (ERDC, Video, 2022)



*The Sandhills Project: 1.0* (20<sup>th</sup> EN BDE, Video, 2023)



*Wired for War: The Robotics Revolution and Conflict in the 21<sup>st</sup>*, P. W. Singer, 2009



VIRED

*Army of None: Autonomous Weapons and the Future of War*, Paul Scharre, 2018



The Kill Chain: Defending America in the Future of High-Tech Warfare, Christian Brose, 2020



*Four Battlegrounds: Power in the Age of Artificial Intelligence*, Paul Scharre, 2023

# **THANK YOU!**

### **Gabe Monroe, PhD**

**Research Mechanical Engineer Geotechnical and Structures Laboratory U.S. Army Engineer Research and Development Center** U.S. Army Corps of Engineers

> john.g.monroe@usace.army.mil 601-634-4015



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# Delivering Innovation



**ERDC's Research and Development Areas (RDAs)** 

## **RESEARCH & DEVELOPMENT AREAS**



**CIVIL WORKS** 



MILITARY ENGINEERING



ENGINEERED RESILIENT SYSTEMS



**INSTALLATIONS** 

**& OPERATIONAL** 

**ENVIRONMENTS** 



GEOSPATIAL RESEARCH & ENGINEERING



## CORE COMPETENCIES

SPECIALIZED ERDC KNOWLEDGE THAT ENABLES OUR RESEARCH AND DEVELOPMENT AREAS



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