Introductory Webinar NIST Automotive Cybersecurity Community of Interest

February 7, 2023

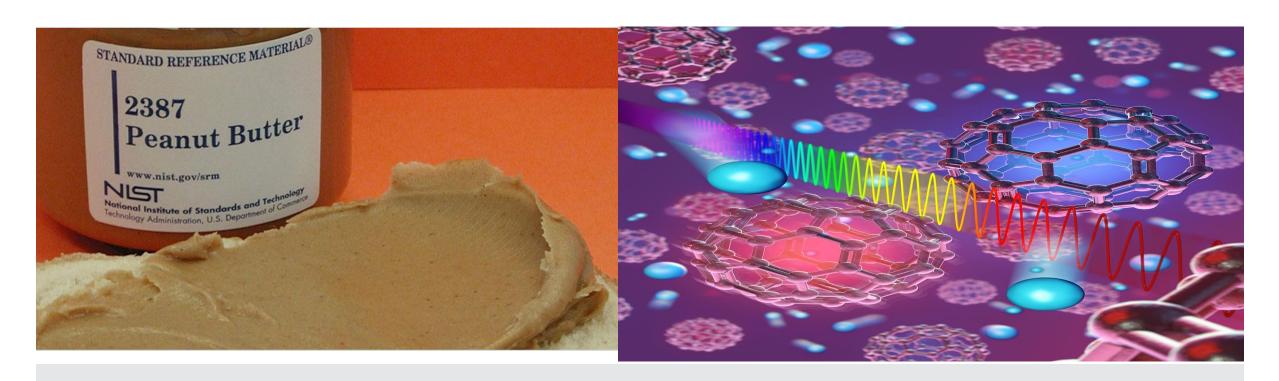


Agenda

- Introduction and the AutoSec COI Suzanne Lightman
- NIST AV Project
 Craig Schlenoff
- Supply Chain Project
 Jon Boyens
- Code Signing NISTIR and Post-Quantum Cryptography
 Andrew Regenscheid

- NIST Al Project
 Elham Tabassi
- Al Attack Taxonomy
 Apostol Vassilev
- Dioptra
 Harold Booth
- EVSE Project
 James McCarthy





ABOUT US

NIST Mission

To promote U.S. innovation and industrial competitiveness by advancing *measurement science*, *standards*, and *technology* in ways that enhance economic security and improve our quality of life



Automotive Cybersecurity Community of Interest (AutoSec COI)

- Provide a communication channel to the industry for NIST work
- Allow industry participants to engage with NIST on work that they find relevant
- Assist NIST in identifying possible areas of work that would enhance the cybersecurity of vehicles and the transportation sector



Procedures for NIST AutoSec COI



Periodic webinars on NIST work of interest to the community

Announcements of events and activities

Updates on on-going projects

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NIST's Automated Vehicle Effort

2/07/2023

Core Question: How Can NIST Advanced Standards and Support the Measurement of Automated Vehicles?





Scope and Process (FY22)

- Scope The Effort:
 - Focus on on-road (e.g., personal vehicles, long-haul trucking, service vehicles such as Uber/Lyft) automated vehicles



Department	Proposed areas of collaboration
US DOT/NHTSA	Assistance with SRI development for sensors
	 Safety-related measures development
	Cybersecurity metrics and measurement
	Communication system evaluation
	AI/ML implementation and measurement
	Provision of additional expertise
NSF	Assistance with tech transfer
	 Publicizing NSF-supported research by
	integration with NIST work
DHS	Provide expertise
GSA	Assistance with operational guidelines
DOD	Provide expertise
	Collaborative research in relevant areas
	o AI/ML
	 Supply chain
	 Cybersecurity measures
	o Workforce

- Don't Step on Other's Toes:
 - Landscape document lists and describes major AV efforts in other Federal agencies
- Leverage NIST's Strengths:
 - NIST AV efforts document lists and describes NIST AV efforts broken down into AI, cybersecurity, communications, perception, and safety
- Hear From Our Stakeholders!

SERI FY 2022 – Autonomous Vehicle Measurement Science, Standards, and Test Methods Program Ongoing Efforts at NIST

Milestone task: Map recommended efforts in on-road autonomous vehicles to existing NIST efforts to identify opportunity areas as well as existing areas that are not of high priority to our stakeholders.

Approach: Compare the challenges/opportunities uncovered at the NIST workshop with existing autonomous vehicle efforts at NIST.

Purpose

This document summarizes key priority areas from our stakeholders in the development of on-road autonomous vehicles (referred to as AVs throughout this document), as extracted from Deliverable #3. This document then maps ongoing NIST efforts in on-road autonomous vehicles with respect to the key priorities identified by our stakeholders.

Identification of high priority areas to our stakeholders

During the workshop, focus groups, and individual interviews conducted by NIST, the following five areas were highlighted by several stakeholders: a) Artificial Intelligence (AI), b) Cybersecurity, c) Communication, d) Sensor Perception, and e) Safety. The topics of high priority areas to address in AVs that were highlighted by the participants are listed below:

1. Artificial Intelligence:

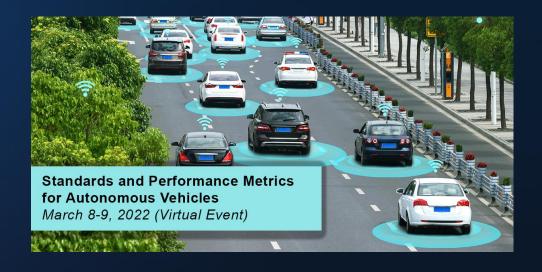
- a. Gaps in standards and metrology (including tests) for trustworthy AI for AVs, including:
 - i. Accuracy: This trustworthiness attribute captures the broad notion of whether the machine learning model is correctly capturing a relationship that exists within training data. False positive and false negative rates are often used to measure (aggregate) accuracy for tasks such as recognition, detection, or estimation. There is a need to measure the likelihood of failures and their system-level vehicle and driving environment impact.



How Can NIST Advanced Standards and Support the Measurement of Automated Vehicles?

To answer this question, NIST conducted the following:

- Conducted 65 one-on-one stakeholder interviews
- Facilitated 4 focus group meetings with 36 domain experts
- Hosted an automated vehicles workshop (811 attendees)
 - Workshop web site: https://www.nist.gov/news-events/events/2022/03/standards-and-performance-metrics-road-autonomous-vehicles
 - Workshop report:
 https://www.nist.gov/system/files/documents/noindex/2022/05/24/AV%2
 0Workshop%20Summary_Draft.pdf





OFFICE OF THE UNITED AND TECHNICAL AND TECHN

Kyle Davis and Andrew Beasley Biden-Appointed Strategic Policy Fellows Office of Science and Technology Policy





Nellie Abernathy
Director
Office of Policy and
Strategic Planning
Department of Commerce



Scott McCormick
President
Teleoperation Consortium



Tim Kurth
Chief Counsel (R)
Commerce of the House
Committee on Energy &
Commerce



Hussein Mehanna
Vice President of AI/ML
Cruise



Robyn Robertson
President & CEO of Traffic
Injury Research Foundation



Edward Straub
Executive Director of Automated
Vehicle Safety Consortium
SAE



Jack Weast
CTO, Corporate Strategy Office
Intel



Bert Kaufman
Head of Public Policy
and Regulatory Affairs
Zoox



Alberto Lacaze CEO Robotic Research



Dr. Trent Victor
Director of Safety Research
and Best Practices
Waymo



Katherine McClaskey
Program Lead for Advanced
Threats Security
CISA



Dr. Adam Campbell Senior Manager Safety Innovation and Impact Gatik Al



Organizations





































DIN























What did stakeholders request that NIST can help with?

Create and enforce a baseline for AV safety systems
testing

Enforce sensor specs that should be used in AVs

Create regulation on periodic testing and updating

Define the data that should be **measured** before, during, and after operation of automated vehicles

Provide reference materials for what infrastructure investment state and local governments should invest in

Collect **standardized** data from the DoT from accidents to develop representative testing environments

Provide classification and levels for AV components

Develop novel individual and fused sensor measurement science solutions for vehicles

Help define **testing** guidance for stakeholders to meet regulatory agency requirements

Develop mitigation standards for adversarial Al

Develop AV simulation-based measurement science

Advance **standards** with SAE, 3GP, and Teleoperation Consortium

Develop measurement science for traffic infrastructure that can support AVs

Develop **metrics** to identify what aspects of AVs should be measured to ensure safety

Create **test models** and **measurement science** for AV communications

Foster a community of stakeholders to agree on common taxonomies and standards

Be a one-stop-shop for pointers to relevant autonomous vehicle **standards**

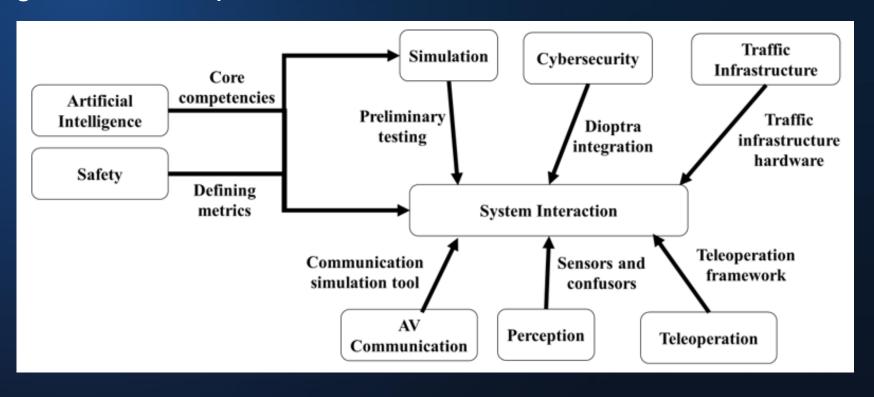
Measure how different parts of an AV work together

"Do you know that NIST cybersecurity framework? Just do that for autonomous vehicles."



The NIST AV Program/Implementation Plan

- Developed a 44-page Program Plan for possible NIST AV focused efforts
- Specific efforts include:
 - Systems Interaction
 - Artificial Intelligence
 - Communications
 - Cybersecurity
 - Perception
 - Safety Quantification
 - Simulation
 - Teleoperation
 - Traffic Infrastructure





NIST Strategic and Emerging Research Initiatives (SERI) Project October 2022 – September 2024

System Level Testing

- a) Assessing Automotive Sensor Perception

 Develop a sensor testbed facility that stakeholders can

 use for characterization of their automotive sensors.
- b) Minimizing Risk in Al

 Develop a simulation testbed for testing and minimizing
 risk for Al algorithms used in on-road automated vehicles.
- c) Measuring Cybersecurity

 Develop a testbed for measuring adversarial machine learning and defensive mitigations.
- d) Evaluating Communication Technologies

 Develop a simulation tool for stakeholders to validate
 testing methods that assess vehicle communications

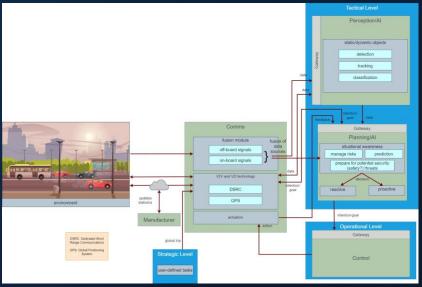


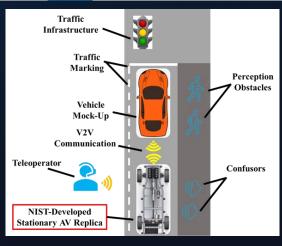


NIST Strategic and Emerging Research Initiatives (SERI) Project October 2022 – September 2024

Complete Vehicle Behavior Based on System Interaction

- Develop a testbed to evaluate system interaction in automated vehicles in a subset of SAE's behavioral competencies.
 - Maintaining a lane
 - Changing lanes
 - Navigating intersection
 - Navigating unstructured roadways
 - Navigating parking
 - Responding to other vehicles
- Perturb the system at points and determine the effect on the overall AV performance. For example:
 - Degrade communications between the test vehicle and the environment
 - Simulate a cybersecurity attack on some portion of the system
 - o Introduce compromised sensor input
- Planning a workshop for the September 2023 timeframe to discuss progress.







Testing Approach



Simulation



Structured Environment



Test Track



Join our Google Group to stay up to date!

Email <u>autonomousvehicles+subscribe@list.nist.gov</u> from the email address that you would like to have added to the mailing list

OR

Go to https://groups.google.com/a/list.nist.gov/g/autonomousvehicles and click the "Ask To Join" button



Cybersecurity Supply Chain Risk Management (C-SCRM)

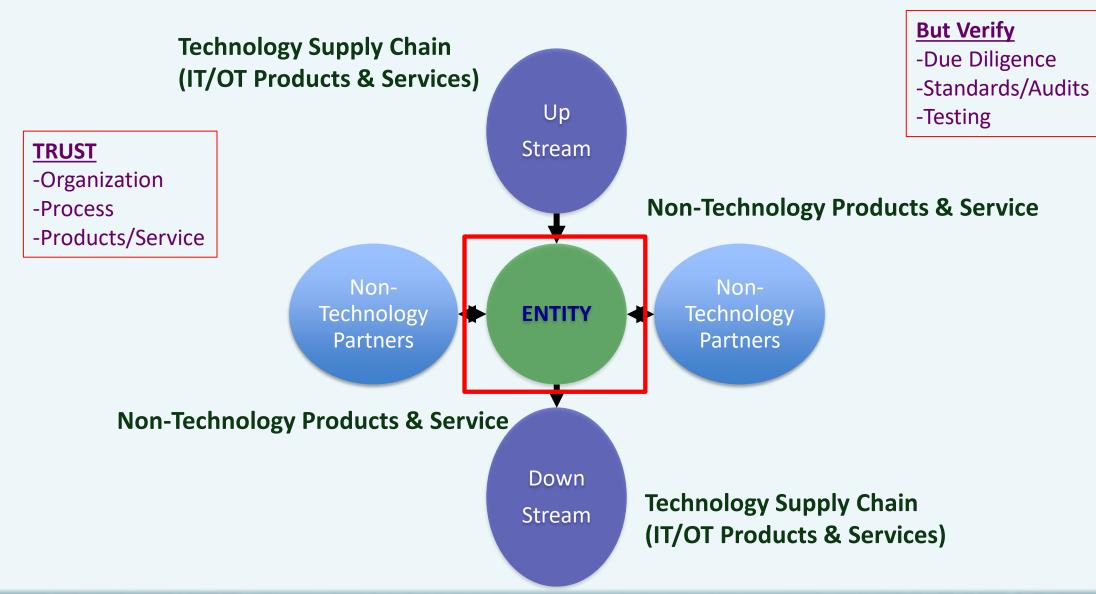
Jon Boyens

Computer Security Division

IT Laboratory



Technology and Non-Technology Dependencies



Cybersecurity Risks in Supply Chains

- Counterfeit products
- Hardware or software delivered with vulnerabilities, malware or inserted post-delivery
- Third and Nth Party Vulnerabilities in systems and networks used by supply chain partners
- Insider Threat (including non-adversarial)
- Poor quality manufacturing, development, maintenance, or disposal practices
- Cybersecurity risks in NON-technology products and services

C-SCRM Resources

- ➤ Draft SP 1800-34a/b/c: Validating the Integrity of Computing Devices (NCCoE Public-Private Collaboration)
- ➤ SP 800-161 Revision 1, Cybersecurity Supply Chain Risk Management Practices for Systems and Organizations (May 2022)
 - Includes guidance stemming from EO 14028, e.g. SBOMs, OSS, Vulnerability Management, Enhanced Vendor Risk Assessments
- > SP 800-218, Secure Software Development Framework. (February 2022)
- NISTIR 8276, Key Practices in Cyber Supply Chain Risk Management (February 2021)
- ➤ Integrate C-SCRM into other NIST guidance, e.g. NIST SPs 800-53r5 and 800-37r2, NIST Cybersecurity Framework
- ➤ Software and Supply Chain Assurance (SSCA) Forum: bringing industry, academia, and government together since 2003

EO 14028 Section 4 Tasks and Timelines



Day 0 – May 12, 2021

EO 14028 issued



Day 45 – June 26, 2021

Publish definition of "critical software" (4g)



Day 180 -

Nov 8, 2021

Publish preliminary guidelines for enhancing SW SC security (4c)



Day 360 -

May 8, 2022

Publish additional guidelines, including review/update procedures (4d)

Solicit input from stakeholders (4b)



Day 30 -

June 11, 2021

Publish guidance outlining security measures for critical software (4i)

Publish guidelines recommending minimum standards for vendor testing of SW source code (4r)



July 11, 2021

Issue guidance identifying practices that enhance security of SW SC (4e)

Initiate pilot programs, identifying IoT cyber & secure SW development practices or criteria for consumer labeling programs (4s, 4t, 4u)

Day 270 -

Feb 6, 2022

Review & submit summary report of pilot programs (4w)



Day 365 -

May 13, 2022

NIST SP 800-218, Secure Software Development Framework (SSDF) Practice Groups



Elements of an SSDF Practice



Practices	Tasks	Notional Implementation Examples	References
Identify and Confirm Vulnerabilities on an Ongoing Basis (RV.1): Help ensure that vulnerabilities are identified more quickly so that they can be remediated more quickly in accordance with risk, reducing the window of opportunity for attackers.	RV.1.1: Gather information from software acquirers, users, and public sources on potential vulnerabilities in the software and third-party components that the software uses, and investigate all credible reports.	Example 1: Monitor vulnerability databases ⁹ , security mailing lists, and other sources of vulnerability reports through manual or automated means. Example 2: Use threat intelligence sources to better understand how vulnerabilities in general are being exploited. Example 3: Automatically review provenance and software composition data for all software components to identify any new vulnerabilities they have.	BSAFSS: VM.1-3, VM.3 BSIMM: AM1.5, CMVM1.2, CMVM2.1, CMVM3.4, CMVM3.7 CNCFSSCP: Securing Materials—Verification EO14028: 4e(iv), 4e(vi), 4e(vii), 4e(ix) IEC62443: DM-1, DM-2, DM-3 ISO29147: 6.2.1, 6.2.2, 6.2.4, 6.3, 6.5 ISO30111: 7.1.3 OWASPSAMM: IM1-A, IM2-B, EH1-B OWASPSCVS: 4 PCISSLC: 3.4, 4.1, 9.1 SCAGILE: Operational Security Task 5 SCFPSSD: Vulnerability Response and Disclosure SCTPC: MONITOR1 SP80053: SA-10, SR-3, SR-4 SP800181: K0009, K0038, K0040, K0070, K0161, K0362; S0078

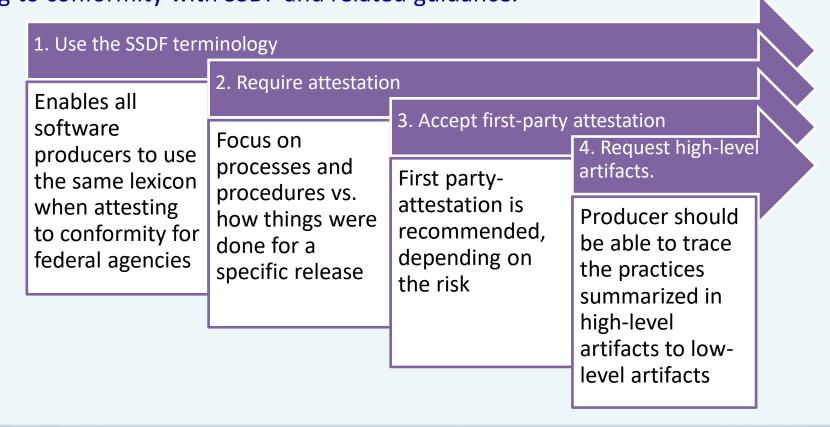
Task: An individual action (or actions) needed to accomplish a practice

Implementation Example: An example of a type of tool, process, or other method that could be used to implement this task

Reference: An established secure development practice document and its mappings to this task

Secure Software Attestation Guidance

The EO directs NIST to issue guidance identifying practices that enhance the security of the software supply chain for producers and purchasers and then directs OMB to require federal agencies to comply with NIST guidelines with respect to software procured after the date of the order. NIST has guidance for attesting to conformity with SSDF and related guidance.



SP 800-161 Revision 1, Appendix F EO 14028 Sections 4(c)/(d) Response Guidance for Software Supply Chain Security

Software supply chain security concepts are a critical sub-discipline within C-SCRM

Available online to allow for update to guidance.



EO through the lens of 800-161

EO Critical Software & Measures

Software Verification

SSDF & Attestations

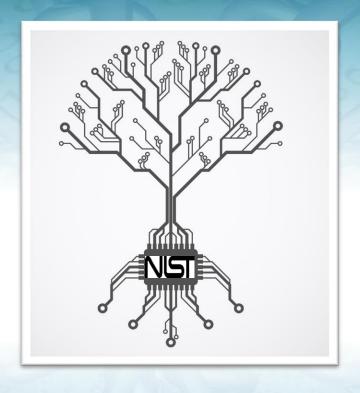
Emerging Concepts

Software Bill of Materials (SBOM)

Enhanced Vendor Risk Assessments

Open Source Software Controls

Vulnerability Management



Email: scrm-nist@nist.gov

Visit: http://scrm.nist.gov

CRYPTOGRAPHIC TECHNOLOGIES:

Quantum-Resistant Algorithms and Code Signing

Andrew Regenscheid Cryptographic Technology Group Murugiah Souppaya Computer Security Division



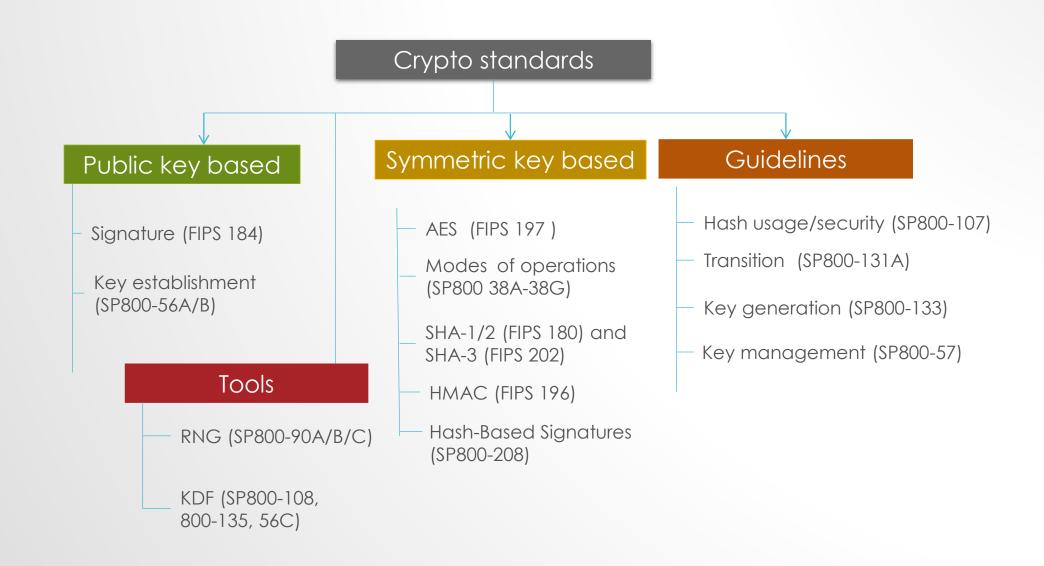
NIST CRYPTOGRAPHY PROGRAM





CRYPTOGRAPHY STANDARDS

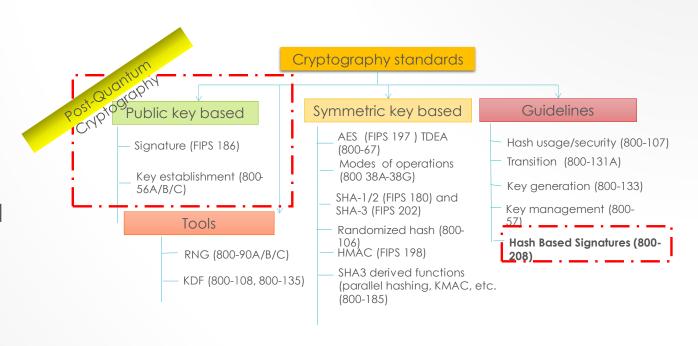




CRYPTOGRAPHY STANDARDS



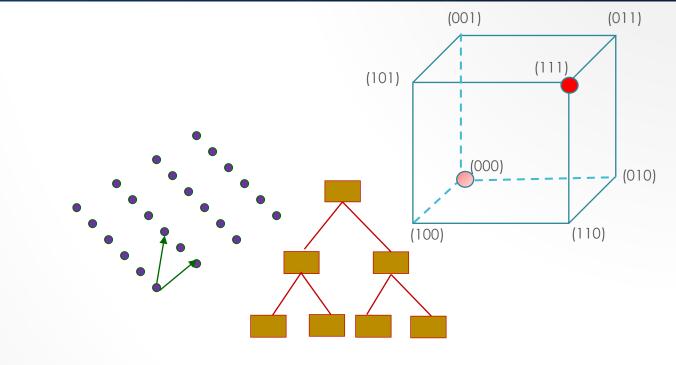
- Shor's Algorithm
 Efficiently (polynomial-time) solve problems underpinning current public key cryptosystems
 - Factorization—RSA
 - Discrete Logarithms
 ECDSA, Diffie-Hellman
- The well-deployed key establishment and digital signature algorithms will need to be replaced to prepare for quantum era
- Quantum computing also impacted security strength of symmetric key based cryptography algorithms – manageable by increasing key size

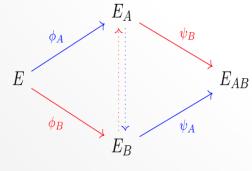


POST-QUANTUM CRYPTOGRAPHY



- PQC has been a very active research area in the past decade
- Some actively researched PQC categories include
 - Lattice-based
 - Code-based
 - Multivariate
 - Hash/Symmetric key -based signatures
 - Isogeny-based schemes





$$p^{(1)}(x_1,\ldots,x_n) = \sum_{i=1}^n \sum_{j=i}^n p_{ij}^{(1)} \cdot x_i x_j + \sum_{i=1}^n p_i^{(1)} \cdot x_i + p_0^{(1)}$$

$$p^{(2)}(x_1,\ldots,x_n) = \sum_{i=1}^n \sum_{j=i}^n p_{ij}^{(2)} \cdot x_i x_j + \sum_{i=1}^n p_i^{(2)} \cdot x_i + p_0^{(2)}$$

$$p^{(m)}(x_1,\ldots,x_n) = \sum_{i=1}^n \sum_{j=i}^n p_{ij}^{(m)} \cdot x_i x_j + \sum_{i=1}^n p_i^{(m)} \cdot x_i + p_0^{(m)}$$

SELECTED PQC ALGORITHMS



Key Encapsulation	Digital Signatures
Lattice-Based: • CRYSTALS-Kyber	Lattice-BasedCRYSTALS-DilithiumFalcon
	Hash-BasedSPHINCS+

4th round KEMs

- o Classic McEliece
- o BIKE
- o HQC
- o SIKE

Onramp signatures

New call for additional signatures preferably for signatures based on non-lattice problems.

Due: June 1, 2023

PQC MIGRATION



- National Security Memorandum on Promoting United States Leadership in Quantum Computing While Mitigating Risks to Vulnerable Cryptographic Systems
 - "Mitigating the Risks to Encryption. ... To mitigate this risk, the United States must prioritize the timely and equitable transition of cryptographic systems to quantum-resistant cryptography, with the goal of mitigating as much of the quantum risk as is feasible by 2035."
- NIST will provide transition guidelines to PQC standards
- NIST National Center of Cybersecurity Excellence <u>Migration to Post-Quantum Cryptography Project</u>

NCCOE OVERVIEW



National Cybersecurity Center of Excellence (NCCoE)

Accelerate adoption of secure technologies: collaborate with innovators to provide real-world, standards-based cybersecurity capabilities that address business needs



DEFINE



ASSEMBLE



BUILD



ADVOCATE

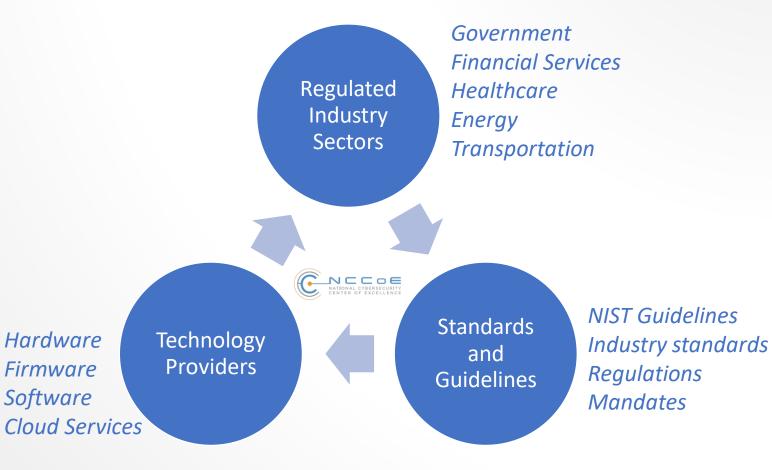
Hardware

Firmware

Software

Practice Guide SP 1800

Engagement Model



NCCOE- MIGRATION TO PQC PROJECT



- Complement NIST PQC standardization effort
- Tackle challenges with adoption, implementation, and deployment of PQC
- Engage with the community including industry collaborators and across government to bring awareness to the issues involved in migrating to postquantum algorithms
- Coordinate with standard developing organization and government and industry sectors community to develop guidance to accelerate the migration
- Leverage automated tools to discover use of quantum vulnerable cryptography within an organization in hardware, firmware, software, protocols, and services and use a risk-based approach to prioritize their replacement
- Perform interoperability and performance tests across different technology and protocols to include TLS, QUIC, code signing, public key certificates, hardware security modules, etc.



MIGRATION TO POST-QUANTUM CRYPTOGRAPHY

The National Cybersecurity Center of Excellence (NCCoE) is collaborating with stakeholders in the public and private sectors to bring awareness to the challenges involved in migrating from the current set of public-key cryptographic algorithms to quantum-resistant algorithms. This fact sheet provides an overview of the Migration to Post-Quantum Cryptography project, including background, goal, challenges, and ootential benefits.

BACKGROUND

The advent of quantum computing technology will render many of the current cryptographic algorithms ineffective, especially public-key cryptographs, which is widely used to protect digital information. Most algorithms on which we depend are used worldwide in components of many different communications, processing, and storage systems. Once access to practical quantum computers becomes available, all public-key algorithms and scribtal to begin planning for the replacement of hardware, software, and services that use public-key algorithms now so that information is protected from future attacks.

CHALLENGES

- Organizations are often unaware of the breadth and scope of application and function dependencies on public-key cryptography.
- Many, or most, of the cryptographic products, protocols, and services on which we depend will need to be replaced or significantly altered when post-quantum replacements become available.
- Information systems are not typically designed to encourage supporting rapid adaptations of new cryptographic primitives and algorithms without making significant changes to the system's infrastructure—requiring intense manual effort.
- The migration to post-quantum cryptography will likely cretae many operational challenges for organizations. The new algorithms may not have the same performance or reliability characteristics a legacy algorithm due to differences in key size, signature size, error handling properties, number of execution steps required to perform the algorithm, key established process complexity, etc. A truly significant challenge will be to maintain connectivity and interoperability among organizations and organizational elements during the transition from quantumvulnerable alexitoms to number the second control of the control of the number of the control of the contro

OAL

The initial scope of this project will include engaging industry to demonstrate the use of automated discovery tools to identify instances of quantum-vulnerable public-key algorithm use, where hey are used in dependent systems, and for what purposes. Once the public-key crytography components and associated assets in the enterprise are identified, the next project element is prioritizing those applications that need to be considered first in migration planning.

Finally, the project will describe systematic approaches for migrating from vulnerable algorithms to quantum-resistant algorithms across different types of organizations, assets, and supporting technologies.

BENEFITS

The potential business benefits of the solution explored by this project include:

• helping granizations identify where, and how, public-key aleg-

- rithms are being used on their information systems
 mitigating enterprise risk by providing tools, guidelines, and
- mitigating enterprise risk by providing tools, guidelines, and practices that can be used by organizations in planning for replacement/updating hardware, software, and services that use PQC-vulnerable public-key algorithms
- protecting the confidentiality and integrity of sensitive enter prise data
- supporting developers of products that use PQC-vulnerable public-key cryptographic algorithms to help them understand protocols and constraints that may affect use of their products

DOWNLOAD PROJECT DESCRIPTION
This fact sheets provides a high-level overview o
project. To learn more, visit the project page:
https://www.nccoe.nist.gov/crypto-apility-consi



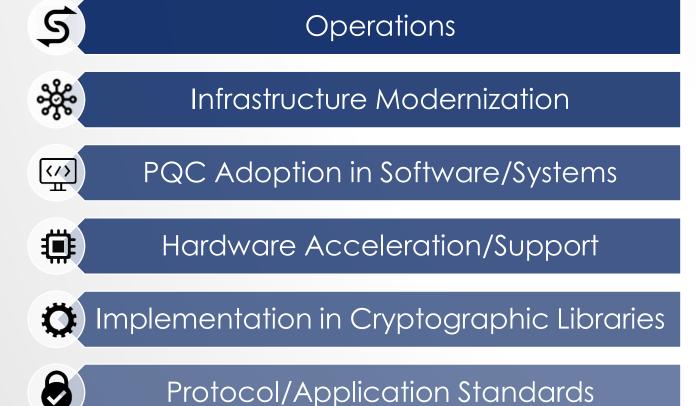
HOW TO PARTICIPATE

As a private-public partnership, we are always seeking insights from businesses, the public, and technology vendors. If you have questions about this project or would like to join the project's Community of Interest, please email applied-crypto-pac@nist.gov.

https://www.nccoe.nist.gov/crypto-agility-considerations-migrating-post-quantum-cryptographic-algorithms

MUCH WORK REMAINS





 $\mathbb{Z}_q[X]$ Algorithm Standards

CODE SIGNING SYSTEMS



NIST Whitepaper:

Security Considerations for Code Signing

Topics:

- Code signing overview
- Architectures and use cases
- Description of roles
- Major Threats
- Recommended security practices

https://doi.org/10.6028/NIST.CSWP.01262018

NIST Cybersecurity White Paper

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Security Considerations for Code Signing

David Cooper Andrew Regenscheid Murugiah Souppaya Computer Security Division Information Technology Laboratory

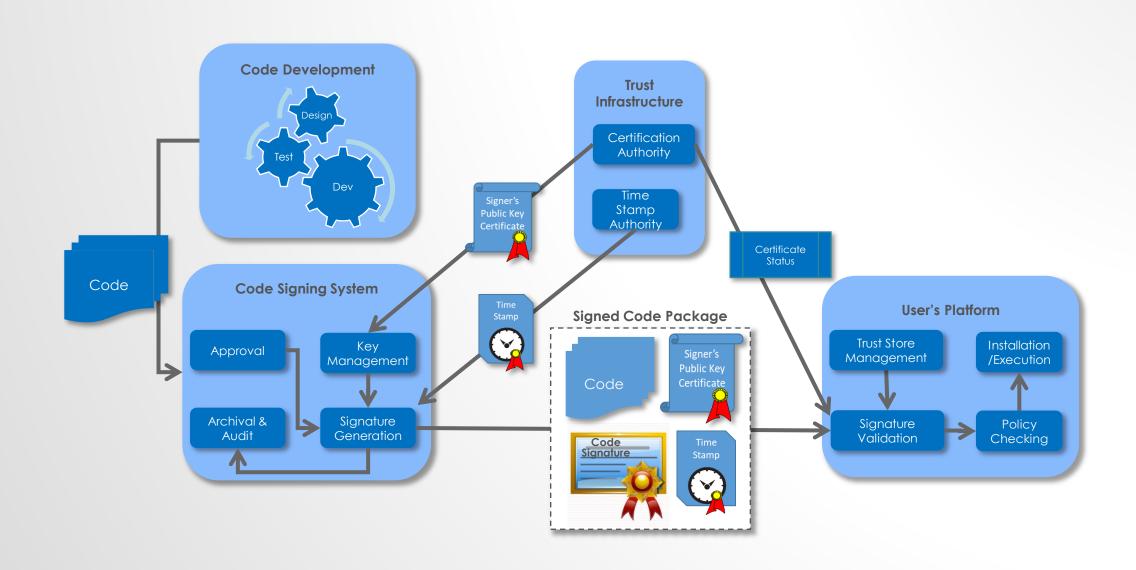
Christopher Bean Mike Boyle Dorothy Cooley Michael Jenkins National Security Agency Ft. George G. Meade, Maryland

January 26, 2018



CODE SIGNING





CODE SIGNING RECOMMENDATIONS



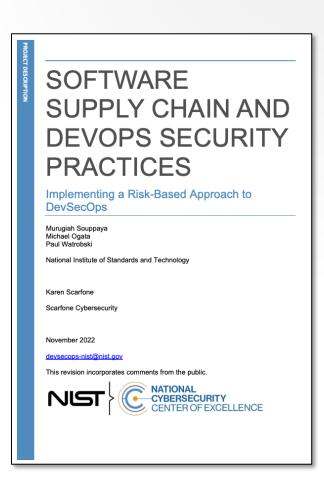
- Identify and authenticate trusted users
- Separate roles and require two-party control
- Establish policies and procedures for reviewing, vetting and approving code
- Isolate and protect the Code Signing System
- Separate development, testing, and production infrastructures
- Utilize auditing and periodically review logs
- Develop revocation/recovery mechanisms for cases of key compromise or unauthorized signing



NCCoE – DevSecOps Project

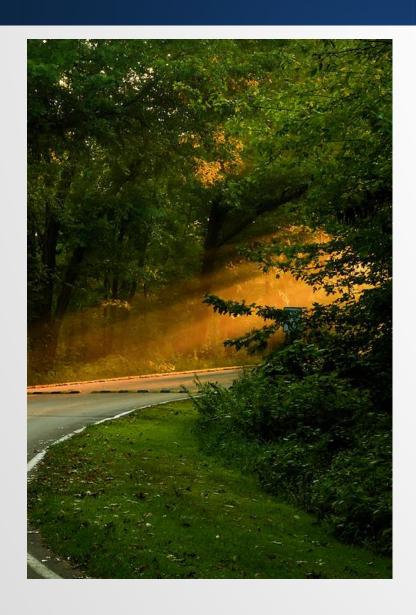


- Develop an applied risk-based approach and recommendations for secure DevOps and software supply chain practices consistent with the Secure Software Development Framework (SSDF), Cybersecurity Supply Chain Risk Management (C-SCRM), and other NIST, government, and industry guidance
- Apply these DevSecOps practices in proof-of-concept use case scenarios that will each be specific to a technology, programming language, and industry sector to produce practical and actionable guidelines that meaningfully integrate security practices into development methodologies
- Integrate automated security tools into the DevOps pipeline (development, integration, testing, build, and distribution)



https://www.nccoe.nist.gov/projects/software-supply-chain-and-devops-security-practices





WRAP UP

Post-Quantum Cryptography

- Prepare for future migration to quantum-resistant cryptography
- Identify current algorithms/schemes used
- Assess suitability of emerging standards

Code Signing Systems

- Tailor guidelines for automotive use cases
- Software supply chain code development through software updates

PQC STANDARDIZATION PROJECT



2010-2015

NIST PQC project team builds First PQC conference

2016

Determined criteria and requirements, published <u>NISTIR 8105</u> Announced call for proposals

2017

Received 82 submissions
Announced 69 1st round candidates

2018

Held the 1st NIST PQC standardization Conference

2019

Announced 26 2nd round candidates, NISTIR 8240

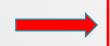
Held the 2nd NIST PQC Standardization Conference

2020

Announced 3rd round 7 finalists and 8 alternate candidates. NISTIR 8309

2021

Hold the 3rd NIST PQC Standardization Conference



2022 Make 3rd round selection and draft standards

2023 Release draft standards and call for public comments

FIRMWARE UPDATES



NIST SP 800-193, Platform Firmware Resiliency Guidelines & NIST SP 800-147, BIOS Protection Guidelines



Protection

- Firmware updates are authenticated using digital signatures
- Critical data only updated through authorized channels and checked for validity



Detection

- Verify integrity of *firmware* during boot
- Validate critical data via inspection before use (where possible), or detect signs
 of boot failures (e.g., watch dog timers)



Recovery

- Capability to restore code/data through automated or manual means
- Firmware recovery images verified through digital signatures (like an update)
- Capability to backup known-good copies of critical data



NIST Al project

Elham Tabassi











Machine Learning is Risky

The **NIST AI RMF** identifies many different sources of risk:

- > Inherent: e.g., unwanted bias, errors in the data, implementation flaws in the model, cybersecurity flaws in the platform on which the ML models is deployed.
- Adversarial: deliberate actions by motivated experienced adversaries aiming to disrupt/evade/compromise the operation of the model or its output.



Image credit: Pavel Vinnik, Shuttershock, Portswigger LTD.



Machine Learning ATTACK TAXONOMY

Three main attacker goals/objectives:

- Integrity violation
- Availability breakdown
- Privacy Compromise

Goals require different attack surfaces/capabilities to exploit

- train data control,
- test data control,
- label control,
- source code control,
- model control,
- query access,
- · etc.

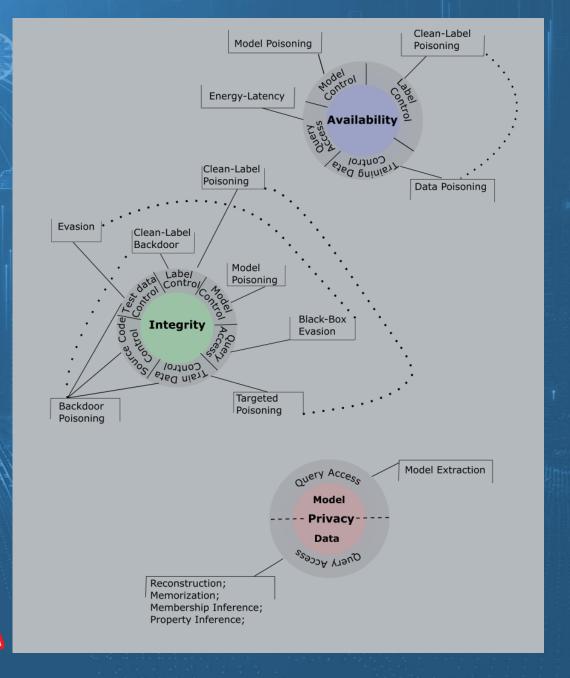
Multitude of attacks

• each specialized for particular targets and attack surface

ML models can be attacked at all stages of their lifecycle

from design to learning to deployment and use







Autonomous Vehicle Physically-realizable attacks

Specifically designed perturbations of objects in the vision of the car that can evade vision classifiers in various physical environments

Human Eye Invisibale/Neglectible markings on road cause the vehicle the veer off into the opposite traffic lane

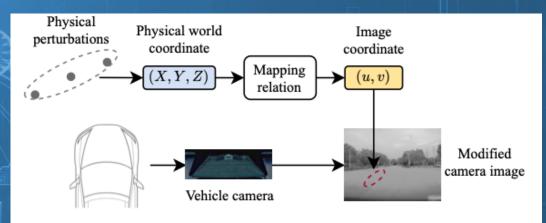
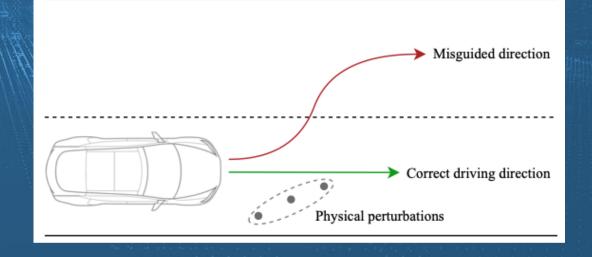


Figure 4: Mapping the coordinate of (X,Y,Z) on markings in physical world to the coordinate of (u,v) on perturbations in digital world.

Images credit: Pengfei Jing1, Qiyi Tang, Yuefeng Du, Lei Xue, Xiapu Luo, Ting Wang, Sen Nie, Shi Wu, <u>"Too Good to Be Safe: Tricking Lane Detection in Autonomous Driving with Crafted Perturbations"</u>, USENIX 2021.





Potential Mitigations



cognitive intelligence

No *information-theoretic* guarantees for mitigations!



Adversarial Training

The most robust approach

- Due to Goodfellow et al. in 2015
- Substantially improved by Madry et al. in 2018
- but costly, computationally & otherwise
- It may come at the cost of one accident at a time



Randomized smoothing

Provable L₂ robustness

 robust smooth classifier based on most-likely predictions under Gaussian noise perturbation



Formal Verification

Good potential

Ongoing concerns

- Scalability
- Costs
- Restrictions on supported operations
- Reliance on assumptions that can be circumvented in practice



Machine Learning INSIDER ATTACKS

Backdoor poisoning:

- Train data control
- Test data control
- Source code control

TROJANS

Some <u>computationally</u> undetectable



Shafi Goldwasser, Michael P. Kim, Vinod Vaikuntanathan and Or Zamir. Planting Undetectable Backdoors in Machine Learning Models, <u>arXiv</u>, 2022





Adversarial Machine Learning A TAXONOMY OF ATTAKS AND MITIGATIONS

Coming soon to the NIST AI Resource Center

- Joint effort with Prof. Alina Oprea
- Broad coverage, beyond automotive
- Replaces the old draft published in October 2019.



Adversarial Machine Learning

A Taxonomy and Terminology of Attacks and Mitigations

Alina Oprea
Northeastern University

Apostol Vassilev Computer Security Division Information Technology Laboratory

This publication is available free of charge from: https://doi.org/10.6028/NIST.AI.100-2

February 2023



U.S. Department of Commerce Gina M. Raimondo, Secretary

National Institute of Standards and Technology

Laurie E. Locascio, NIST Director and Under Secretary of Commerce for Standards and Technology



CONTACT US



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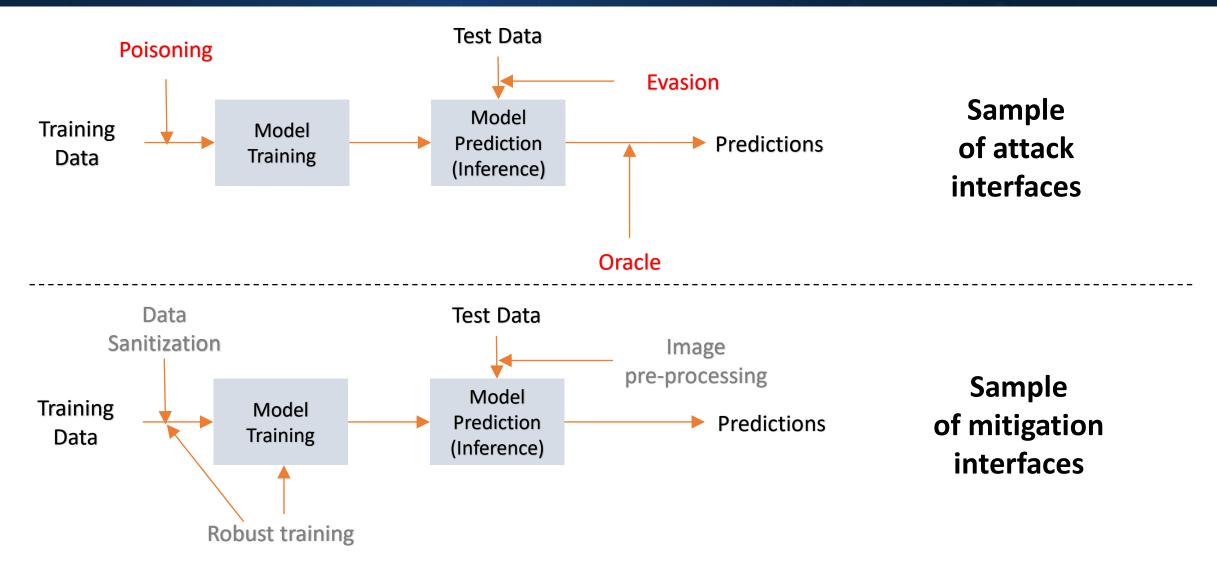


Dioptra

Test Platform for Machine Learning Systems

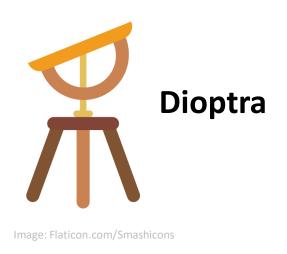
Attack and Mitigation Interfaces in the Model Lifecycle





Scenario testing, Parameter Sweeping, Evaluation





- Shallow Net
- AlexNet
- LeNet
- ResNet50
- VGG16
- ...

Training Architecture



- Patch augmentation
- Poison Frogs
- Adversarial training
- ...

Data Augmentation



- Spatial smoothing
- Defensive distillation
- ...

Inference preprocessing



- MNIST
- Fruits360
- ImageNet
- ...

Dataset



- Fast Gradient Method
- Pixel Threshold
- Patch
- Membership Inference
- ..

Attack on trained model



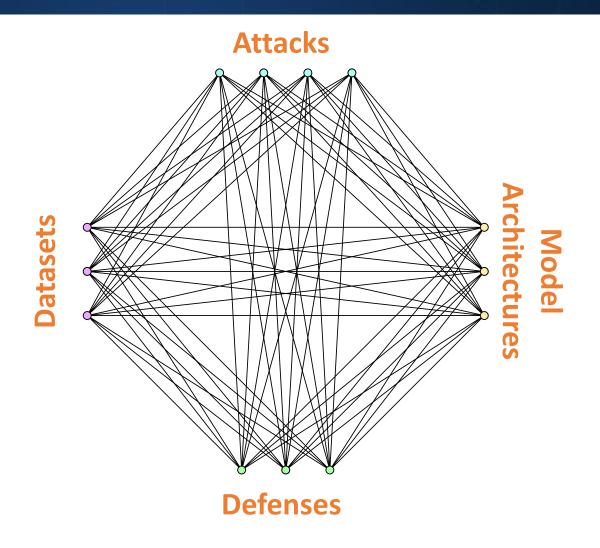
- Clean accuracy
- Adversarial accuracy
- Robustness radius
- ...

Metric



Use Case Exploration





DIOPTRA IN A NUTSHELL



- • •
- Tool/application/testbed for creating, tracking and running machine learning experiments (jobs)
- Modular and extensible at both the architectural (microservices) and software (plugins) level







Software Development Kit (SDK)



Examples / Demos



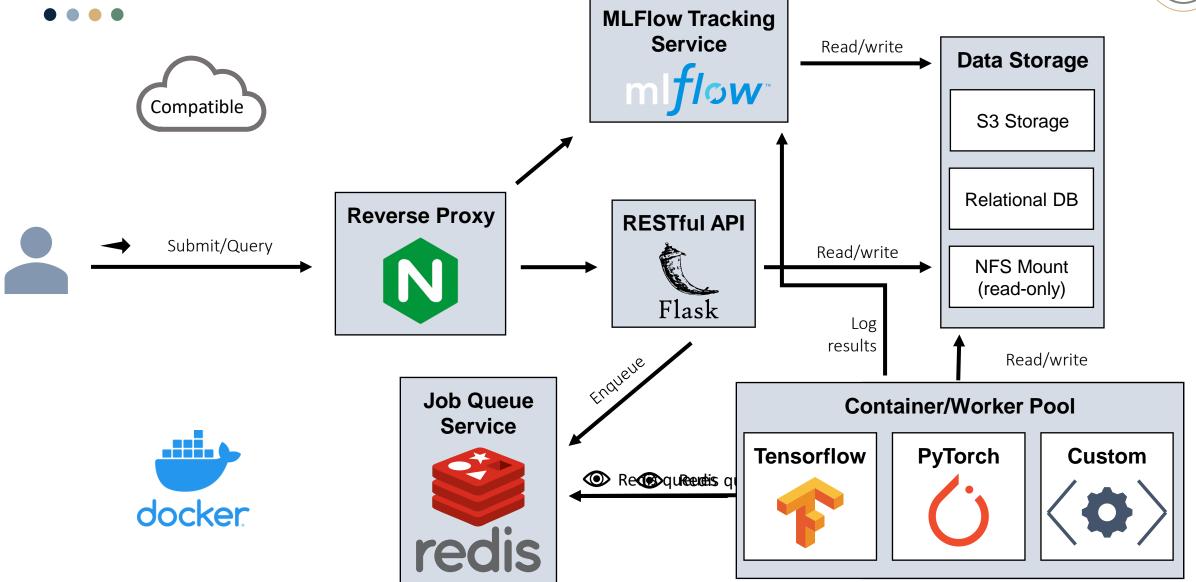
Built-in Task Plugins



Documentation

MICROSERVICES ARCHITECTURE ENABLES FLEXIBLE DEPLOYMENT

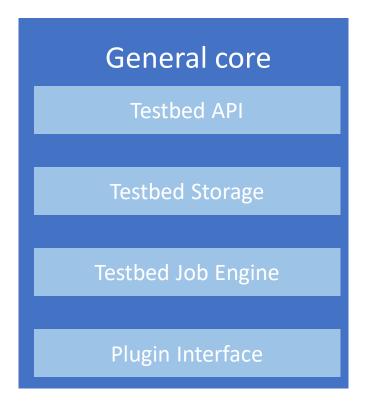




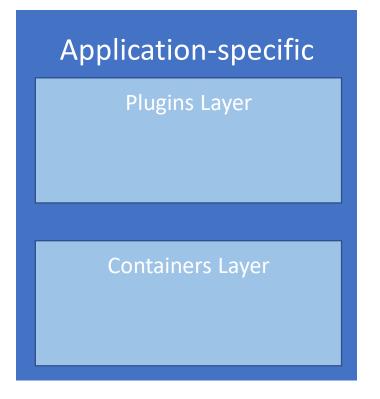
A MODULAR DESIGN AT THE ARCHITECTURAL AND SOFTWARE LEVEL



• • •



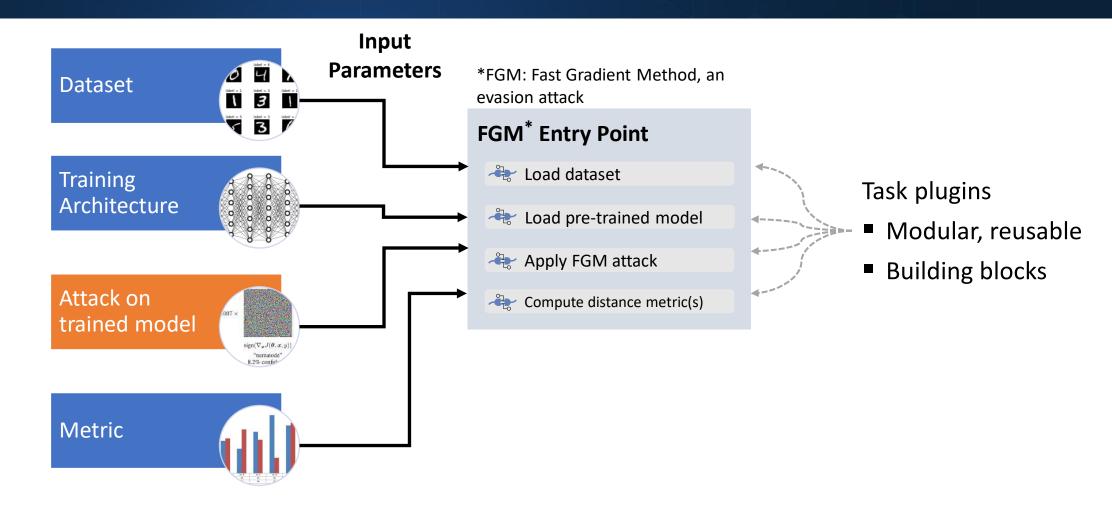
Flexible, able to be repurposed to meet needs in other projects



Specific use cases are implemented as plugins and customized containers

Running A Job

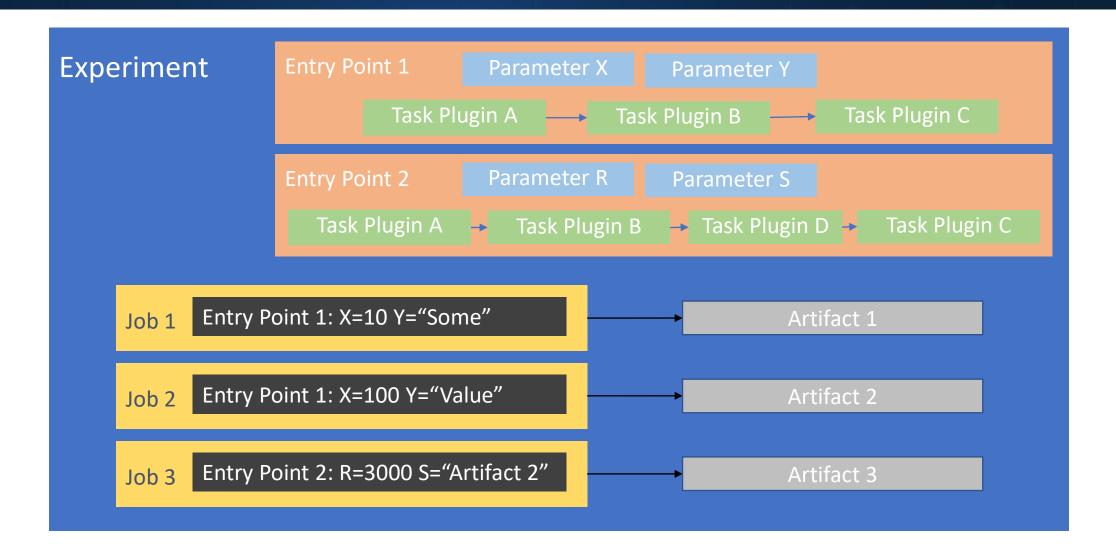




Entry Point = Script + Parameters

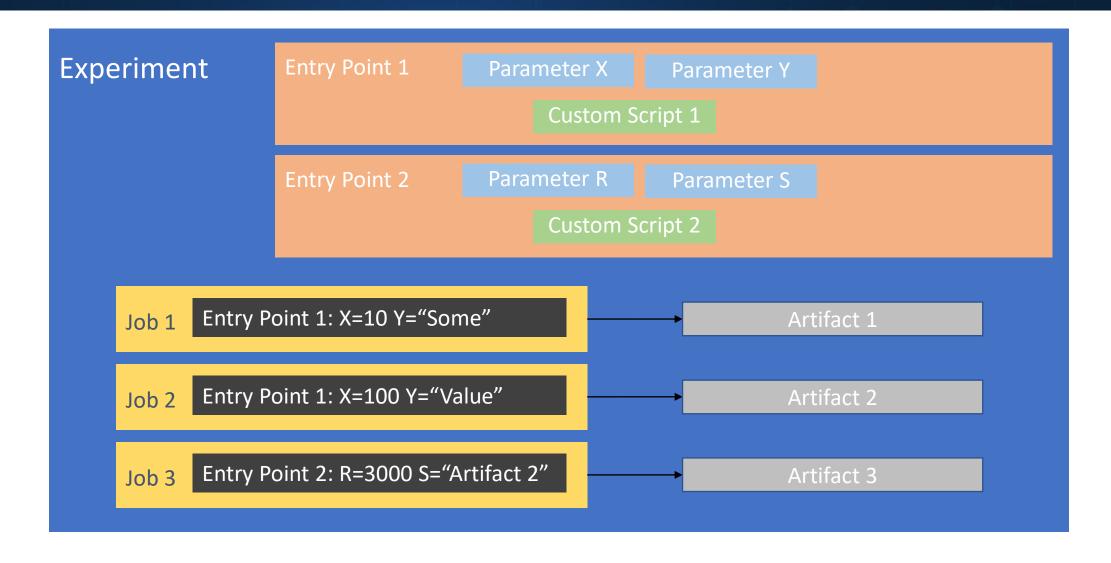
Anatomy of an Experiment





Anatomy of an Experiment







Repository:

https://github.com/usnistgov/dioptra

Questions: dioptra@nist.gov

Electric Vehicle (EV) Fast Charging Vehicle (XFC) Cybersecurity Framework Profile



Background & Purpose: The EV XFC infrastructure ecosystem relies on multiple connected subsystems including eXtreme Fast Charging, Electric Vehicle, XFC Cloud or Third-party Operator, and XFC and Utility-Building Networks. The U.S. Department of Energy's (DOE) Vehicle Technologies Office (VTO) and Office of Cybersecurity, Energy Security, and Emergency Response (CESER) have funded a collaborative project through the National Institute of Standards and Technology's (NIST) NCCoE to establish Cybersecurity Framework Profile for EV XFC infrastructure. The primary stakeholders initiating the effort include DOE, NIST, and the Electric Power Research Institute (EPRI). This effort will provide users with a national, risk-based approach to managing cybersecurity activities for EV XFC systems.

Next Steps:

- Host EV XFC project kickoff on Thursday, February 16th from 2pm-3:30pm ET
 - Event link: https://www.nccoe.nist.gov/get-involved/attend-events/nccoe-learning-series-electric-vehicle-ev-extreme-fast-charging-xfc
- Begin meetings with the community to develop Cybersecurity Framework Profile on Thursday, February 23rd from 3pm-4pm ET
 - Invite will be sent to those on the community of interest email soon

How to participate and engage with us:

Join our community of interest by emailing us at Evxfc-nccoe@nist.gov

Website page:

https://www.nccoe.nist.gov/projects/cybersecurity-framework-profile-electric-vehicle-extreme-fast-charging-infrastructure