

RISK AND RESILIENCE BOOTCAMP





ADVERSARIAL RISK ANALYSIS

This module introduces adversarial risk analysis



ADVERSARIAL RISK ANALYSIS

- Modern risk environments
 - Such as cybersecurity, fraud prevention, counter-intelligence, regulatory strategy, and operational resilience require more than static risk models
 - Traditional risk assessments often assume passive threats
 - In reality, many risks involve intelligent adversaries who actively adapt, probe, and innovate which constantly changes the risk landscape
- Adversarial Risk Analysis (ARA)
 - Provides a dynamic approach that models attackers' motivations, capabilities, and likely behaviors alongside defensive strategies

ROBUST SYSTEMS

- A system is robust when it has
 - "The ability to cope with errors during execution and to handle erroneous input"
- Three types of robustness
 - *Safe*: when the system can detect, respond to or prevent accidental harm
 - *Secure*: when the system can detect, respond to or prevent intentional harm
 - *Survivable*: when the system is both safe and secure

SOFTWARE ENGINEERING

- Focuses on eliminating defects
 - To remove any faults that prevent the software from working as specified
 - To ensure the software handles the normal and reasonable situations and inputs correctly, including invalid inputs
- Does not focus on intentional attacks
 - Attacks usually involve attempting to put the system into an abnormal situation or unusual state
 - Attacks also usually involve bizarre, unreasonable and highly unusual inputs
 - Not the type of inputs that would be thought of when looking at normal operations
 - Also, the inputs may occur with a volume and velocity that would stress the system
 - The imposed stress would cause the system to go into an unstable state

SECURITY ENGINEERING

- A security flaw is
 - A defect in or a feature of the software that can be exploited by an attacker
 - A defect that is fixed for normal operations (i.e. safe) may still be a security flaw
 - Not all defects are security flaws
 - Only defects that can be exploited are security flaws
- A vulnerability is
 - A set of circumstances that allow an attacker to exploit a security flaw

SECURITY ENGINEERING

- A mitigation is the removal of a vulnerability either
 - By fixing the underlying security flaw; or
 - Developing a workaround that prevents attackers from accessing the security flaw
- Not all security flaws can be fixed
 - The cost of fixing the flaw may be prohibitive
 - The flaw may be complex or involve multiple components which means it may be a systemic problem, not a defect

SECURITY: PREVENTIVE PLANNING

- Design with the objective that the system will eventually be accessible from the public internet
 - Even if there are no immediate plans to do so
- Use a common authentication and authorization pattern, preferably based on existing security components
 - Avoid creating a unique solution for each system
- Least privilege
 - Access and authorization should be assigned to system clients based on the minimal amount of access they need to carry out the functions required

SECURITY: PREVENTIVE PLANNING

- Maximize entropy (randomness) of security credentials
 - Use API Keys rather than usernames and passwords for API
 - Balance performance with security with reference to key lifetimes and encryption/decryption overheads
 - Standard secure coding practices should be integrated
- Security testing capability is incorporated into the development cycle
 - Continuous, repeatable and automated tests to find security vulnerabilities in APIs and other applications during development and testing

SECURITY: USE CVE

- CVE = Common Vulnerabilities and Exposures.
 - An international, community-driven effort that identifies and catalogs publicly known cybersecurity vulnerabilities
 - Each vulnerability is assigned a unique CVE ID (e.g., CVE-2024-12345).
 - Managed by the CVE Program,
 - Overseen by MITRE Corporation
 - Sponsored by the U.S. Department of Homeland Security (DHS CISA).
- Goals of CVE
 - Provide a single, standardized identifier for vulnerabilities
 - Eliminate confusion caused by multiple vendors using different names for the same issue
 - Enable security tools, databases, and services to reference vulnerabilities consistently
 - Serve as the foundation for related resources like the NVD (National Vulnerability Database)

SECURITY: USE CVE

- How CVE IDs are assigned
 - A researcher or vendor finds a vulnerability
 - They request a CVE ID from a CVE Numbering Authority (CNA) (e.g., Microsoft, Red Hat, Apache, or MITRE)
 - Once confirmed, the vulnerability is published with its CVE ID
- Example CVE Record
 - CVE-2023-4863
 - *Description:* A heap buffer overflow in the WebP image library (libwebp)
 - *Impact:* Remote code execution when processing malicious images
 - *References:* Links to Google advisory and patches
 - *Status:* Published

SECURITY: USE CVE

- How risk assessments should use CVE
 - *Monitor.* Stay aware of new vulnerabilities in the software in use
 - *Use* CVE feeds or vendor advisories
 - *Assess Risk.* Cross-check with NVD for CVSS severity ratings
 - *Patch.* Apply vendor updates or mitigations as soon as possible
 - *Document.* Track CVEs relevant to your systems for compliance reports
 - *Integrate.* Use automated tools (e.g., pip-audit for Python, OWASP Dependency-Check for Java/Maven) that map library vulnerabilities to CVE IDs

RED TEAM VS. BLUE TEAM

- A Red Team emulates real-world adversaries
 - Their goal is to
 - Identify vulnerabilities
 - Exploit weaknesses
 - Bypass controls
 - Validate the organization's defensive readiness
 - Think creatively and asymmetrically

RED TEAM VS. BLUE TEAM

- A Red Team emulates real-world adversaries
 - Simulate the strategies of motivated threat actors such as:
 - Cybercriminals
 - Insider threats
 - State-sponsored attackers
 - Competitors
 - Fraudsters
 - Red Team mindset
 - “What would I do to break this system? How can I cause maximum impact at lowest cost?”

RED TEAM VS. BLUE TEAM

- Blue Team (Defender Perspective)
 - The Blue Team represents the defenders responsible for:
 - Protecting assets
 - Detecting threats
 - Responding to incidents
 - Strengthening resilience
 - Analyzing attack paths and closing gaps
 - They maintain controls, monitor systems, and ensure compliance with risk and security frameworks
 - Blue Team mindset
 - “How do we detect and prevent attacks? What controls fail under pressure? How do we reduce impact when controls break?”

RED-BLUE INTEGRATION

- Advanced risk analysis uses Red Team and Blue Team insights in combination
 - Red Team identifies realistic threat behaviors
 - Blue Team validates control effectiveness
 - Results feed directly into risk assessments, scenario analysis, control optimization, and investment decisions
- This interplay creates a continuous improvement cycle
 - Known as Purple Teaming
 - A collaboration model where both sides learn and adapt

ADVERSARIAL RISK ANALYSIS

- Adversarial Risk Analysis (ARA)
 - Mathematical and strategic framework designed to address situations where risks arise from strategic interactions between intelligent opponents
 - Unlike traditional risk assessment, which treats threats as random events, ARA
 - Models attackers as decision-makers
 - Estimates the utility and preferences of adversaries
 - Predicts attacker actions given defensive controls
 - Helps defenders choose optimal strategies
 - ARA is widely used in
 - Cybersecurity modeling
 - Anti-fraud systems
 - Military and intelligence operations
 - Regulatory enforcement
 - Competitive market strategy

KEY CONCEPTS

- Attacker utility and goal modeling
 - Attackers differ in
 - Motivation (financial gain, disruption, espionage)
 - Risk tolerance
 - Resource availability
 - Skill level
 - Time horizon
 - ARA attempts to quantify
 - Expected benefit to the attacker
 - Expected cost (effort, detection, penalties)
 - Probability of success
 - Enables defenders to anticipate which attack paths are most appealing to an adversary

KEY CONCEPTS

- Defender Modeling
 - Defenders assess
 - Control effectiveness
 - Detection and response capabilities
 - Costs of mitigation
 - Probability of stopping different attack strategies
 - ARA integrates attacker and defender models to produce strategic recommendations, not just static risk scores

KEY CONCEPTS

- Game theory integration
 - ARA incorporates elements of game theory, where:
 - Attackers and defenders are players
 - Each takes actions to maximize their outcomes
 - Both adjust strategies based on expectations of each other
 - However, ARA improves on traditional game theory by adding uncertainty modeling into attacker decision-making.

KEY CONCEPTS

- Probabilistic forecasting
 - ARA uses
 - Bayesian models
 - Monte Carlo simulation
 - Influence diagrams
 - Decision tree analysis
 - These techniques help defenders estimate
 - The likelihood of different attack strategies
 - The expected loss given various defensive investments
 - Optimal allocation of limited security resources

RED TEAM / BLUE TEAM AND ARA

- Red Teams supply real-world attacker tactics
 - Attack paths
 - Exploit likelihood
 - Lateral movement patterns
 - Social engineering scenarios
 - Control bypass strategies
- Blue Teams validate defensive assumptions
 - Actual control effectiveness
 - Detection performance
 - Control interaction failures
 - True incident response times

RED TEAM / BLUE TEAM AND ARA

- ARA converts these insights into actionable risk intelligence
 - Which attacker strategies are most likely?
 - How would adversaries adapt after a control upgrade?
 - Where should limited defensive budgets be spent?
 - What attack paths provide attackers their highest utility?

EXAMPLES

- Cybersecurity
 - Red Team simulates phishing attack
 - Blue Team analyzes email filters and incident response
 - ARA predicts attacker's next likely exploit path
 - Organization strengthens MFA enforcement to reduce attacker utility
- Fraud prevention
 - Red Team models fraudster behavior in a payments system
 - Blue Team tests detection rules
 - ARA evaluates which fraud strategies yield the highest payout relative to detection risk

TIGER TEAMS

- Refers to a small, highly skilled, cross-functional group of experts tasked with aggressively probing a system for weaknesses
 - Originated in the U.S. military and aerospace industries and has since become common in adversarial risk exploration
- A tiger team is:
 - *Elite*: Typically composed of top specialists in cybersecurity, system architecture, penetration testing, networking, and sometimes social engineering
 - *Goal-driven*: They attempt to break into or compromise a system in the same way a real attacker would
 - *Independent*: Operate separately from the defenders team to avoid bias – the defenders may be unaware it is a test so that they respond realistically
 - *Persistent and creative*: Use both conventional and unconventional methods to uncover vulnerabilities

TIGER TEAMS

- A tiger team may:
 - Perform penetration testing on networks, systems, or applications
 - Conduct red-team exercises (adversarial simulations)
 - Test incident response and defensive capabilities
 - Attempt social engineering attacks
 - Identify design flaws, misconfigurations, or implementation issues
 - Evaluate overall organizational security posture
- They essentially act as ethical adversaries whose mission is to expose weaknesses before real attackers do

TIGER TEAMS

Tiger Team

Broader scope: may analyze design, architecture, physical security, or business processes

Common in engineering and aerospace for problem-solving

One-time or special-mission teams

Red Team

Focuses on adversarial attack simulation

Common specifically in cybersecurity

Frequently ongoing, repeated exercises

ADVANTAGES OF ARA

- Realistic modeling of intelligent threats
 - Traditional models assume randomness while ARA assumes strategy
- Enables dynamic risk assessment
 - Adversaries change tactics; ARA accounts for adaptive behavior
- More accurate prioritization of controls
 - Budget is allocated where it most changes attacker decisions
- Supports proactive rather than reactive security
 - Defenders can anticipate next-step attacker moves
- Bridges the gap between qualitative and quantitative methods
 - ARA leverages SME insights and probabilistic modeling

PITFALLS AND CHALLENGES OF ARA

- Requires deeper expertise
 - ARA demands knowledge of game theory, attacker modeling, and Bayesian analysis.
- Sensitive to modeling assumptions
 - Small errors in attacker utility estimation can alter predictions
- Red Teaming must be mature
 - Poor-quality Red Team exercises produce misleading insights
- Resource-intensive
 - Complex modeling takes time and computational effort
- Can create overly complex output for executives
 - Requires translation into business-relevant language (risk scenarios, expected losses)

INTEGRATING ARA INTO RISK MANAGEMENT

- Effective integration involves:
 - Building threat profiles
 - Attacker types, motivations, resources, preferred methods
 - Conducting structured Red Team assessments
 - Not just penetration tests; full attack-chain simulations
 - Aligning Blue Team detection, monitoring, and IR metrics
 - Ensure control performance data is available for modeling

INTEGRATING ARA INTO RISK MANAGEMENT

- Effective integration involves
 - Developing probabilistic attacker models
 - Using Bayesian stats, loss-event data, and scenario analysis.
 - Linking ARA outputs to risk registers and governance
 - Translate attacker likelihood and defender effectiveness into
 - Inherent/residual risk
 - Control priorities
 - Investment justification
 - Conducting iterative cycles
 - ARA improves over time as attacker and defender actions evolve.

Q&A AND OPEN DISCUSSION

