#AI4SWE

## Al Powered Software Engineering

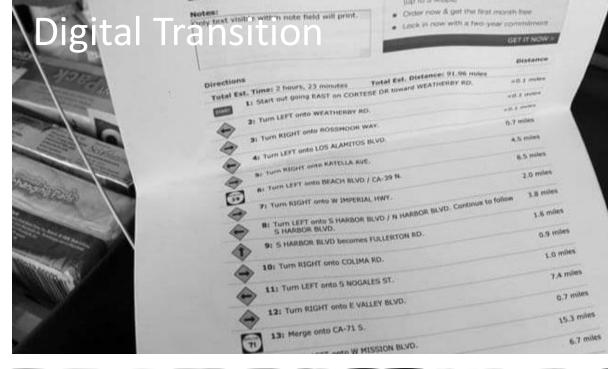
**Unlocking Innovation** 



MITRE | SOLVING PROBLEMS FOR A SAFER WORLD

Trac Bannon

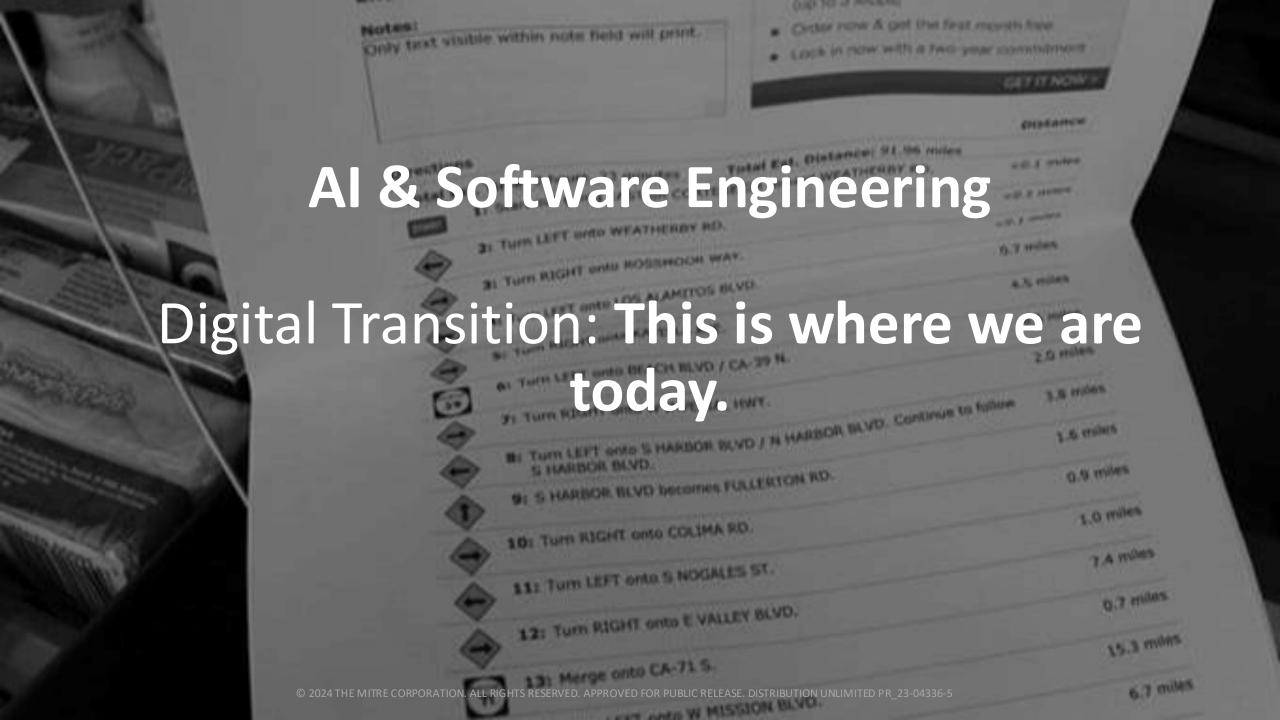












## Who Am I? Tracy "Trac" Bannon

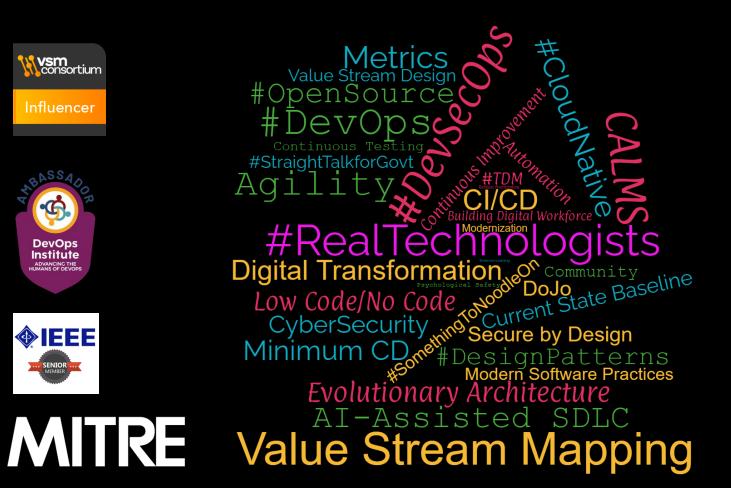
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## ArchAlTecture Research Collaborative

- Focusing on human/machine teaming and trust
- Diverse thought leaders
- Merging scholars and industry
- Data at scale
- Not-for-profit



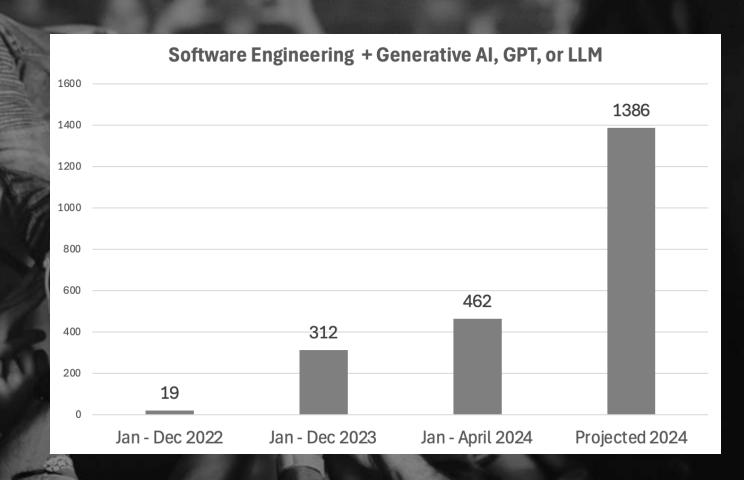
## Quick Retrospective

January 2023 - ChatGPT users hits 100M

Chronic FOMO

• 2024 - Publishing surges

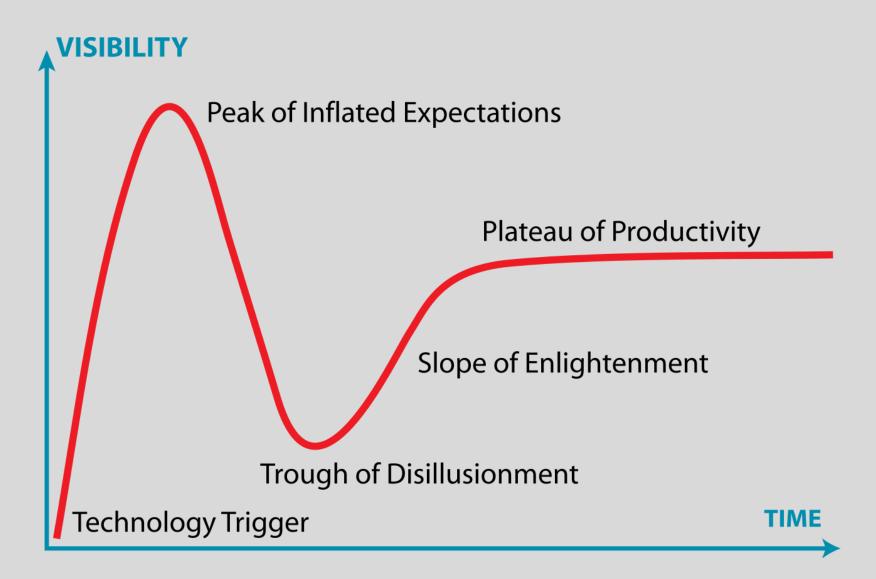
Peer-reviewed research lags



Don't get swept away by the hype



## Al in SwEngineering... where are we now?





Model Interpretability

Face recognition

Convolutional Neural Networks (CNNs)

Search engines Transfer Learning Explainable AI (XAI)

**Reinforcement Learning** 

Computer Vision Neural Networks

Deep Learning

Bayesian Networks

Deep Learning

Evolutionary Algorithms

Deep Learning

Al Governance Edge Al Semantic Analysis Probabilistic Reasoning

Machine Learning

Autonomy Federated Learning

Swarm Intelligence Generative AI Connectionist AI Ensemble Learning

**Unsupervised Learning** 

Sed Learning Supervised Learning

Federated Learning Adversarial Machine Learning

Recurrent Neural Networks (RNNs)

Pattern Recognition

Feature Engineering
AI Ethics Knowledge Representation

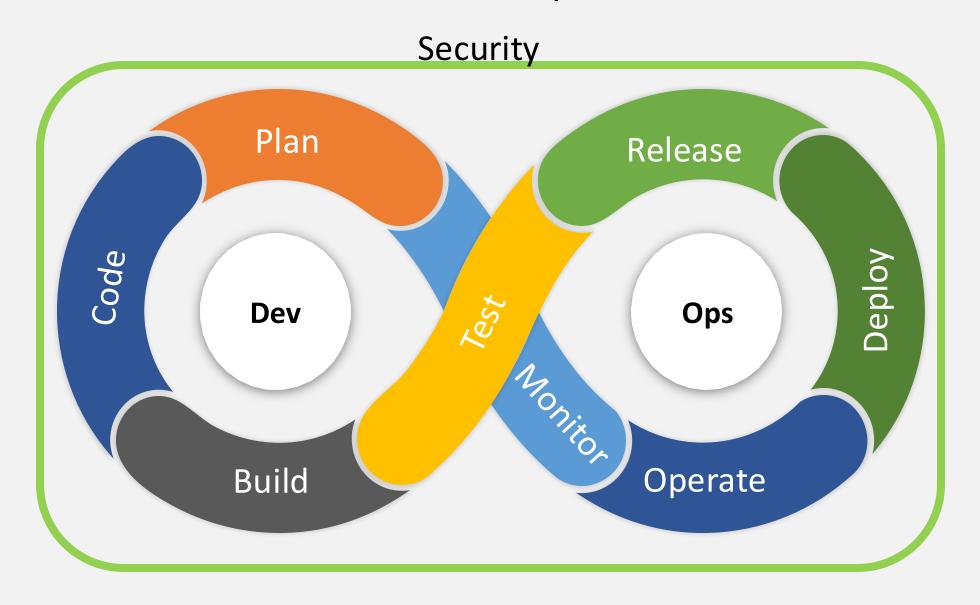
**Transfer Learning** 

Retrieval-Augmented Generation (RAG)

Natural Language Processing (NLP)



### Where can AI be used with DevSecOps?



#### Infusing Al across the Dev Sec Ops Continuum

#### Code

- Architectural Design
- GAI based pair programming
- Code & Unit Testing Generation
- In IDE Secure Code Vulnerability Solution
- ML assisted code review selection
- Al Assisted Code Review
- AI Enabled collaboration
- Suggestive Refactoring

#### Plan

- Natural Language Requirements Gathering
- NLP Requirements Analysis for inconsistency and ambiguity

Plan

Dev

Build

- **GAI** Epic and User Story Generation
- Effort Estimation using Neural Networks
- **GAI-assisted Threat Model Policy** Identification

#### Release

- **Compliance Validation**
- Reinforced Learning-based models generate deployment scripts
- Al Enabled Failure Analysis
- Release Risk/Success Prediction
- Al Driven CI/CD workflow automation

#### Deploy

- **Dynamic Environment** Provisioning and **Deployment Optimization**
- Realtime Rollback
- Al-assisted Log Aggregation
- ML Anomaly Detection
- **GAI** Deployment Scenario Simulations

#### Security

actions and activities

#### **Build**

- Aggregated Merge Request Impact **Analysis**
- GAI-based identification of security vulnerabilities
- ML algorithm optimized build times
- AI-Assisted Security Vulnerability Detection
- Software Composition Analysis

Is infused into all

#### Test

- Natural Language Test Case Generation
- Test Data Generation

Code

- Al Enabled test effectiveness predictions
- E2E Functional Test Execution
- Intelligent Failure/Self Healing Testing
- NLP based API based contract definition
- Intelligent Test Execution

## Deploy Ops

**AlOps** engines provide correlation and predictive monitoring

#### Operate

Release

#### **Monitor**

- **Event Correlation**
- False Alarm Filtering
- Self-Healing Techniques
- **Root Cause Analysis**
- Observe system performance
- **Usability Patterns**
- Monitoring

#### **Operate**

- Deterministic AI based ticketing and support allocation
- AI Based Self Healing Decision
- LLM Integration for Virtual Assistance
- GAI/GPT powered Knowledge Bases

## **GAI** Usage Patterns

#### **Content Generation**

Complex auto-complete as well as new content creation is typically leveraged for generating test cases, code, documentation, and deployment scripts.

#### **Automated Reasoning**

Analyzing patterns, suggesting alternatives about code quality, identifying security vulnerabilities, optimizing deployment strategies, and ensuring compliance with standards.



Treat GAI like a young apprentice...

Always pay close attention!!

Does
Generative Al
contradict
DevSecOps
principles?





Where are people using GAI today?

- Searching for answers
- Documentation
- Requirements Analysis
- Debugging
- Code Completion
- Test Case Augmentation

Sources: 2023 & 2024 StackOverflow Developer Survey

### Unveiling the Human Side of GAI in Software Engineering

Practice-wide survey to get to ground truth

Human-Machine Collaboration

**Trust Optimization** 

Take the Survey



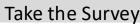
Skill Evolution & Team
Communication

Personal Impact & Future Outlook

### Most challenging, time consuming, or painful tasks^

Challenge	%
Collaborating with cross-functional teams	50%
Managing technical debt	
Continuous integration/continuous deployment (CI/CD) pipeline setup	
Documentation (code, systems, APIs, etc.)	
Maintaining legacy code	
Maintaining security compliance	
[ ]	
Code reviews	
Writing New Code	3%







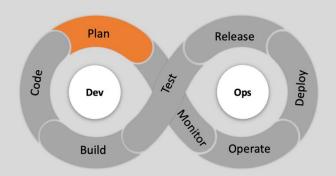
40+ different challenges have been identified so far!

^This data will be more insightful when correlated with role and experience

## Are we addressing the pain points?

## AI-Augmented

## ^ Requirements Analysis



#### **Use Case:**

 Requirements generation via text analysis

Analyze user transcripts

Include crowdsourced survey

#### **Considerations:**

Version control GPT prompts ++

Diverse Datasets

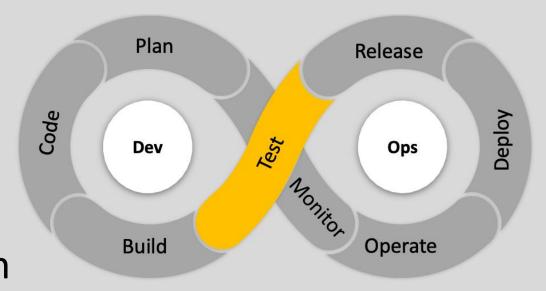
 QA = rigorous testing + humans in the loop

## AI-Angmented ^ Testing Use Cases

Increase test coverage

Brainstorming

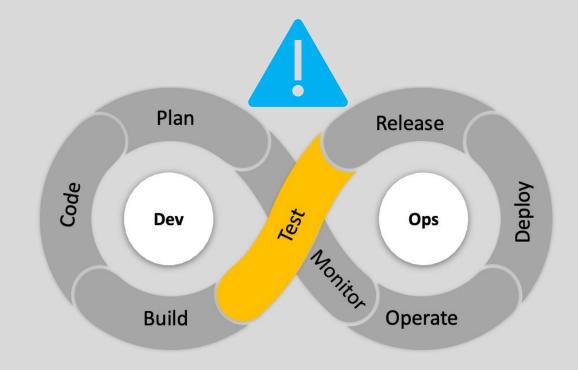
Synthetic Test Data Augmentation



# AI-Augmented ^ Testing Considerations

- Data Privacy & Integrity
- Beware of Irrelevant Tests

Transparency and Explainability





# AI-Augmented ^ Coding

 Code Completion over Code Generation

Great for explaining existing code

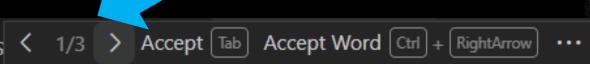
Plan
Release

Nonikor
Ops

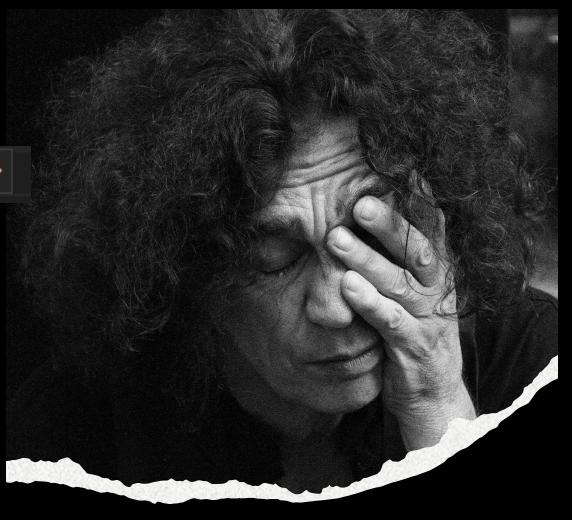
Build
Operate

 Generally, well-structured and wellformatted

### In IDE Help



```
def max_sum_slice(xs):
    """Return the maximum sum of a slice of xs."""
    max_sum = 0
    for i in range(len(xs)):
        for j in range(i, len(xs)):
            this_sum = 0
            for k in range(i, j + 1):
                this_sum += xs[k]
            if this_sum > max_sum:
                max_sum = this_sum
    return max_sum
```

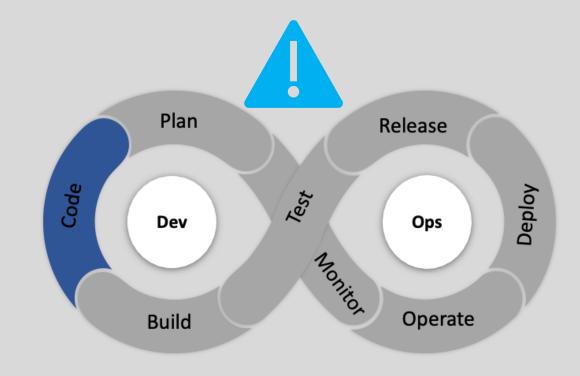


# AI-Augmented ^ Coding Considerations

Unequal productivity gains

Code Churn

Less Secure Code



QA = rigorous testing + humans in the loop

GAI can be unreliable.

Pay close attention!



## Don't generate code and tests

- Lack of Independent Verification
- Bias and Blind Spots
- Overfitting



## Is your organization prepared?



## Fix your SDLC first

Address existing issues

GAI can magnify existing problems











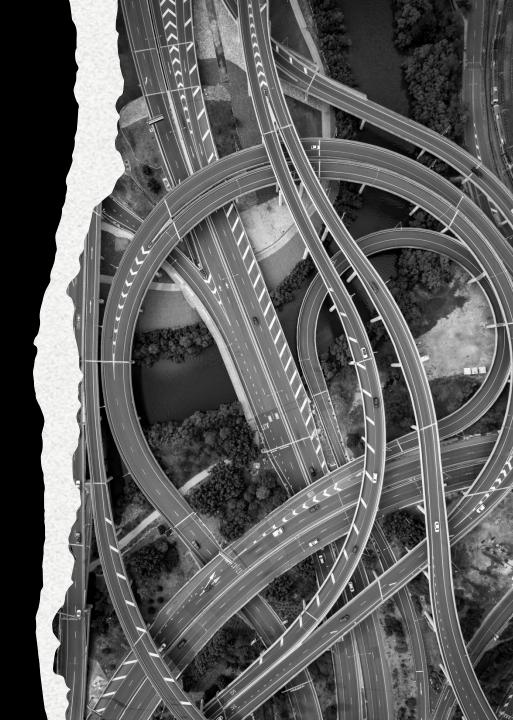


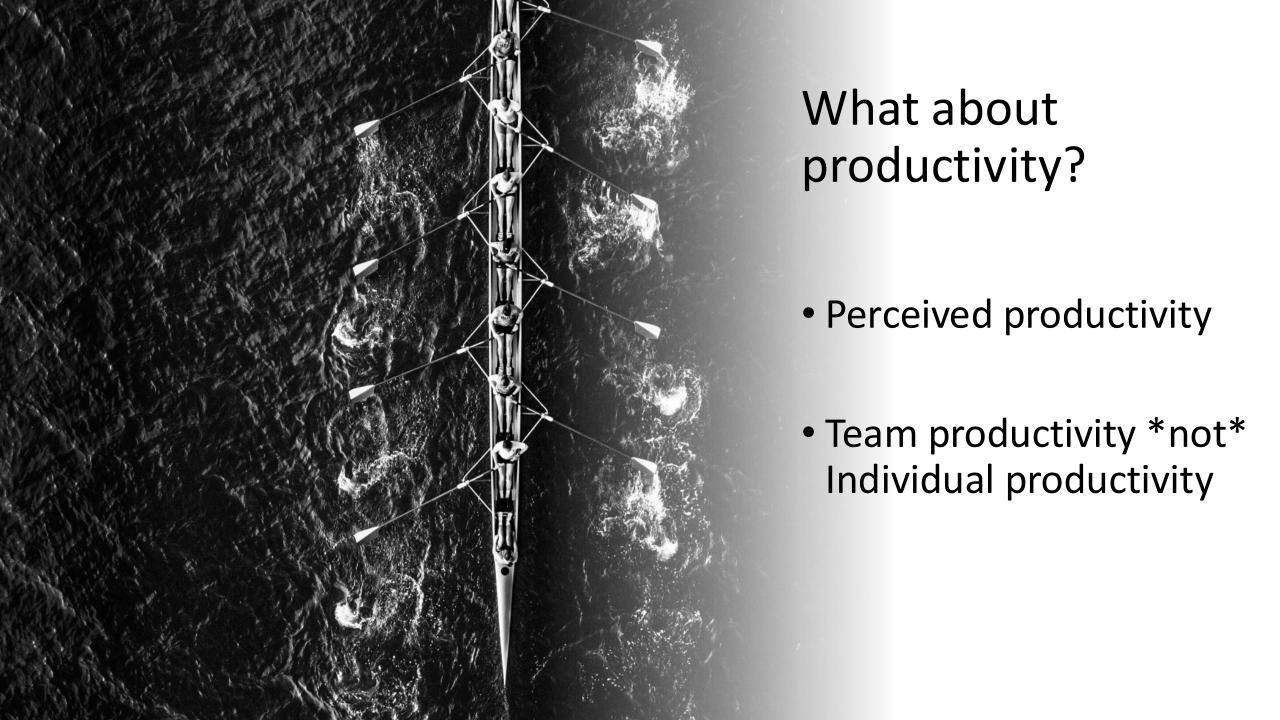
# Gotchas to avoid



### Adaptation to New Workflows

- Measurements and metrics will waiver
- Training is a must
- Humans resist change







## The Importance of Context

- Al requires a massive corpus of data
- If you subscribe to a service, you must provide context
- Are you okay with sharing?



Leading practices for today's Alaugmented SDLC

- Keep humans in the loop
- Everything in source control including prompts
- Secure your vulnerabilities
- Don't provide your private info/IP into public Al engines

# The Big Picture

Adding AI to the Enterprise

- Al Strategy
- Governance and Managing Risk
- Ask Questions of Al Suppliers



Choose when and where to start





# Looking Ahead

# The Evolving Role of Digital Platforms

- Making it hard for humans to make mistakes
- Codify leading practices
- "Pro Code"
- The jumping off point for GAIaugmentation and future agentic capability

### What does the SDLC look like over the next few years?

#### Code

- Architectural Design
- GAI based pair programming
- Code & Unit Testing Generation
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Release

# More data silos, slower flow, more quality issues...?

#### Rinid

#### Dulla

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But what about this...

Is the future of coding dead?

When will Alengineers join the team?





# Al/Human Teaming

Who will we optimize for? Humans? Al Agents?

# We can't put the genie back in the bottle

- Prompt engineering as a discipline
- Ethics of prompts
- Who owns the generated outcomes
- Human-Machine teaming
- Software team performance
- Trust and reliability in software outcomes



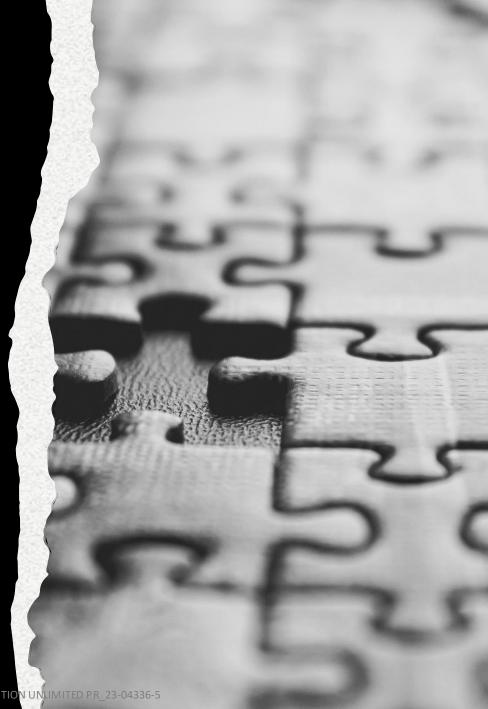


## Call to Action – Your Next Steps

- Make Cybersecurity as your highest priority
- Enable research and discovery for GAI usage
- Establish on reasonable guardrails
- Ask your GAI providers about
  - model quality
  - security
  - roadmap

## What I need from you...

- How do you think the SDLC will change?
- How is your organization preparing?
- What are you personally focusing on?
- Share your organization's story and lessons learned
- Share out new use cases and new tools





What matters are the humans.



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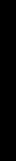
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### References

Academic Research, Industry Reports, Market Analysis

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