# Address Security & Privacy Risks for Generative Al

Artificial intelligence risk mitigation starts with an acceptable use policy.

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# Analyst Perspective

Generative AI needs an acceptable use policy



When it comes to using generative AI (Gen AI), the benefits are tangible, but the risks are plentiful, and the tactics to address those risks directly are few.

Most risks associated with Gen AI are data-related, meaning that effective AI security depends on existing maturity elsewhere in your security program. But if your data security controls are a bit lacking, that doesn't mean you're out of luck.

The good news is that the greatest and most common risks of using Gen AI can be addressed with an acceptable use policy. This should be top priority when considering how your organization might incorporate Gen AI into its business processes.

Some future-state planning will also help you determine which other parts of your security program require upgrades to further reduce AI-related risks. What exactly must be improved, however, will depend on your specific use case.

Logan Rohde Senior Research Analyst, Security & Privacy Info-Tech Research Group

# **Executive Summary**

### Your Challenge

- Governing enterprise use of Gen AI to maximize benefits and minimize risks
- Protecting data confidentiality and integrity when using Gen AI systems
- Responding to an ever-shifting threat landscape

Organizations seeking to become early adopters of Gen Al may not have security teams presently equipped to mitigate the risks. Some may need to retroactively apply governance if unauthorized AI use is already happening.

#### Common Obstacles

- Uncertainty assessing risks of new technology
- Difficulty implementing governance
- Immaturity of existing data security controls

Unfamiliarity with Gen Al may create confusion about how to assess and mitigate risks, especially when determining how the technology can be used. Given the additional need for strong data security controls to address Gen Al risks, it can be difficult to know which issue must be addressed first.

### Info-Tech's Approach

- Determine which risks apply to your Gen Al use cases
- Draft an AI security policy to address those risks
- Plan to address necessary improvements to data security posture

In most cases, Gen Al presents novel versions of familiar data security risks, meaning that most organizations only need to improve or expand existing controls rather than create new ones.

#### Info-Tech Insight

Start with what you can control. Using Gen AI carries significant data security risks. By determining which risks apply to you and implementing governance to address them, you can limit the most pressing issues with using Gen AI and plan to address larger, systemic issues with your data security program.

# Your challenge

### This research is designed to help organizations who need to:

- Evaluate risks associated with enterprise use of Gen Al.
- Assess suitability of existing security controls to mitigate risks associated with Gen Al.
- Communicate risks to the business and end users.
- Determine acceptable use criteria for Gen Al.

Implement Gen AI governance now – even if you don't plan to use it. Without an official policy, end users won't know the organization's stance. Moreover, the technology can make it easier for bad actors to execute various types of cyberattacks, and such risks should be communicated throughout the organization.

### IT leaders who believe their organization is not presently equipped to leverage Gen Al:



Source: Salesforce, 2023

### Common obstacles

### These barriers make this challenge difficult to address for many organizations:

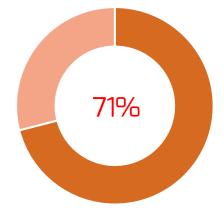
- The novelty of Gen AI leaves many security and IT leaders unsure about how to evaluate the associated risks.
- What many miss about these risks, however, is that most are new versions of familiar data security risks that can be mitigated by defining acceptable use and necessary security controls to support governance of Gen Al.
- Assessing risk and defining acceptable use are the first key steps to Gen AI security improvement. Organizations must also re-evaluate their data security controls and plan necessary improvements to further mitigate risks associated with enterprise use of Gen Al.

### Don't fall behind on Gen Al risk management



IT leaders who believe Gen Al will introduce new data security risks

Source: KPMG, 2023



# Key risk types for Gen Al

### Data security and privacy

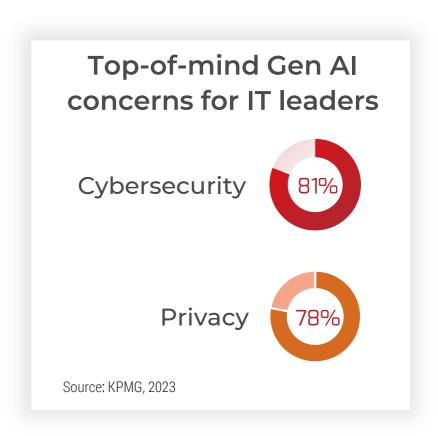
• The greatest risk associated with using Gen AI is a loss of data confidentiality and integrity from inputting sensitive data into the AI system or using unverified outputs from it.

### Data confidentiality

- Care must be taken when choosing whether to enter a given data type into an AI system. This is especially true in a publicly available system, which is likely to incorporate that information into its training data.
- Problems may still arise in a private model, particularly if the AI model is trained using personal identifiable information (PII) or personal health information (PHI), as such information may appear in a Gen Al output.

### **Data integrity**

• Data integrity risk comes from repeatedly using unverified Gen AI outputs. A single output with faulty data may not cause much trouble, but if these low-quality outputs are added to databases, they may compromise the integrity of your records over time.



# Al model versus Al system



#### Al model

An algorithm used to interpret, assess, and respond to data sets, based on the training it has received.



#### Al system

The infrastructure that uses the Al model to produce an output based on interpretations and decisions made by the algorithm.

Sources: TechTarget, 2023; NIST, 2023

#### Info-Tech Insight

The terms *AI model* and *AI system* are sometimes used interchangeably, but they refer to two closely related things. In many cases, the tactics to secure Gen AI will overlap, but sometimes additional security controls may be required for either the model or the system.

# Public versus private Al

### Public Al system



- Uses a publicly available AI system that benefits from multiple users worldwide entering data that can be used to further train the Al model.
- Carries significant risk of accidental data exposure and low-quality outputs compromising data integrity.
- Risk of attack on the AI system is owned by the vendor rather than the user.

### Private Al system

- Private system used only within the organization that owns it.
- Data confidentiality and privacy risks are fewer, but still exist (e.g. PII used in training data).
- Outputs should be verified for quality before being used in business processes to prevent data integrity issues.
- Owner of the system assumes the attack risks.

### Attacks on Gen Al

### Input attacks



- Using knowledge of how the AI model has been trained, an input is entered that causes it to malfunction (e.g. misinterpret a risk as something benign).
- Often preceded by data exfiltration attack to learn how model works or what data it has been trained with.
- Data confidentiality should always be protected.



### Data poisoning

- Training data is tampered with to corrupt AI model integrity.
- Al system data should be audited regularly to ensure data integrity has not been compromised.
- Data resiliency best practices should be followed (e.g. backups and recovery time objective [RTO] and recovery point objective [RPO] testing).

"Because few developers of machine learning models and AI systems focus on adversarial attacks and using red teams to test their designs, finding ways to cause AI/ML systems to fail is fairly easy."

> - Robert Lemos, Technology Journalist and Researcher, Lemos Associates LLC, in Dark Reading

### Attacks on Gen Al



### Weaponization of AI model

- The AI system is compromised via malicious code used to distribute it throughout the organization (e.g. ransomware attack).
- Access to knowledge of AI model, system, and training data should he on a need-to-know basis
- Unverified code should not be incorporated into AI system.



### Sponging

- A series of difficult-to-process inputs are entered into the Al model to slow down its processing speed and increase energy consumption (similar to denial-of-service [DoS] attack).
- The AI system should be designed with a failure threshold to prevent excessive energy consumption.

# Al-assisted cyberattacks

Regardless of whether an AI system is public or private, we must all contend with the risk that someone else will use Gen AI to facilitate a familiar cyberattack.



### **Phishing**

• Gen AI can be used to create convincing phishing emails, not just with text, but with images, sound, and video (i.e. deepfake).



#### Malware

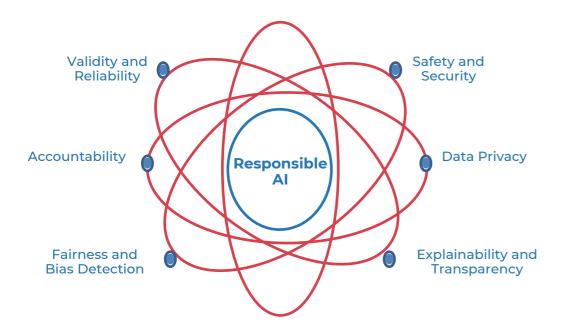
• Gen AI chatbots are programmed not to help people carry out illegal activities. However, the way the question is asked can influence the chatbot's willingness to comply.

"Al generation provides a novel extension of the entire attack surface, introducing new attack vectors that hackers may exploit. Through generative Al, attackers may generate new and complex types of malware, phishing schemes and other cyber dangers that can avoid conventional protection measures."

Terrance Jackson, Chief Security Advisor,
 Microsoft, in "Exploring," Forbes, 2023

# Guiding principles of responsible Al

### **Guiding Principles**



#### Principle #1 - Privacy

Individual data privacy must be respected.

• Do you understand the organization's privacy obligations?

#### Principle #2 – Fairness and Bias Detection

Unbiased data will be used to produce fair predictions.

• Are the uses of the application represented in your testing data?

#### Principle #3 – Explainability and Transparency

Decisions or predictions should be explainable.

• Can you communicate how the model behaves in nontechnical terms?

#### Principle #4 – Safety and Security

The system needs to be secure, safe to use, and robust.

• Are there unintended consequences to others?

#### Principle #5 – Validity and Reliability

Monitoring of the data and the model needs to be planned.

• How will the model's performance be maintained?

#### Principle #6 – Accountability

A person or organization must take responsibility for any decisions that are made using the model.

• Has a risk assessment been performed?

#### Principle #n - Custom

Add principles that address compliance or are customized for the organization/industry.

### Gen Al essentials



### 1. Al suitability test

Before committing to Gen Al deployment, make sure the benefits outweigh the risks and that there is a specific advantage to using Gen AI as part of a business process.



### 3. Gen Al security policy

A policy detailing required security protocols and acceptable use for Gen AI is the most immediate step all organizations must take to deploy Gen AI securely.



### 2. Gen Al risk mapping

Risks will emerge depending on use and therefore will vary somewhat between organizations. Determining which ones apply to you will affect how you govern Gen Al use.



### 4. Data security improvement plan

Enterprise use of Gen AI carries significant risks to data security. If any current controls are insufficient to account for Gen Al risks, a plan should be in place to close those gaps.

# **Manage Security** and Privacy Risks for Generative Al

#### Determining acceptable use is the first step

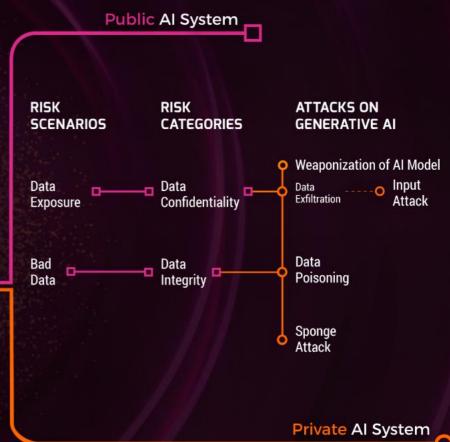
Unfamiliarity with generative AI can cause some confusion about how to assess and mitigate risks, especially when determining what the technology can and cannot be used for. There is also a need for strong data security controls to address generative AI risks, and it can be difficult to know which issue to address first.



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# **GENERATIVE** SECURITY AND **PRIVACY RISKS**



#### Start with what you can control

Using generative AI carries significant data security risks. But by determining which risks apply to you and implementing governance to address them, you can limit the most pressing issues with using generative AI and plan to address larger, systemic issues with your data security program.

## **Determining** acceptable use is the first step



#### Start with what you can control

Using Gen AI carries significant data security risks. By determining which risks apply to you and implementing governance to address them, you can limit the most pressing issues with using Gen AI and plan to address larger, systemic issues with your data security program.

### Look for problems before getting invested

While Gen Al opens many possibilities, some risks will be difficult to address. For example, if your proposed use case requires sensitive data to be entered into a public AI system to produce an output for use in your supply chain, it will be virtually impossible to mitigate such risks effectively.

#### **Build a strong** perimeter

Al security is still in its early stages and best practices are still being determined. Until more specific controls and techniques are developed, the best course of action is to use a robust data security program to make your sensitive data as difficult to access as possible, and to monitor for intrusions.

#### Risk likelihood just went up

The use of Gen AI to facilitate cyberattacks doesn't fundamentally change the nature of the risk. But because Gen AI makes the process easier, we should account for this in our risk assessments.

#### Watch for overlap

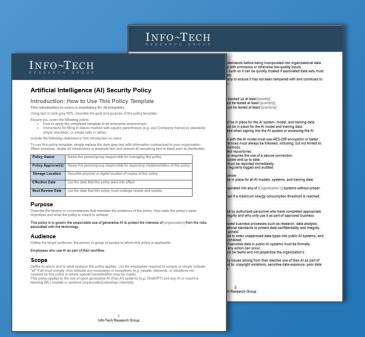
There will usually be both an input and an output component when using Gen AI, which means both risk factors are present, but one may be dominant. Therefore, both inputs and outputs should receive sign-off before use to limit data confidentiality and integrity risks.

### Key deliverable:



### **Al Security Policy Template**

Set standards for data confidentiality and integrity, acceptable use, and technical IT controls.



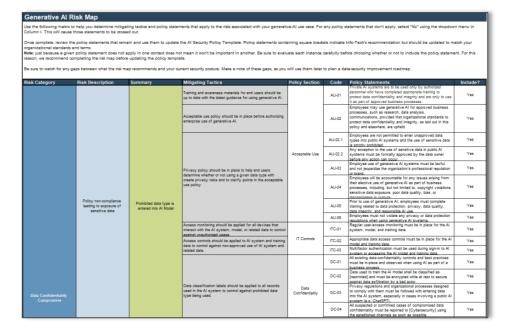
# Blueprint deliverables

Each step of this blueprint is accompanied by supporting deliverables to help you accomplish your goals.



#### Generative Al Risk Map

Determine the risks associated with your Gen Al use case and the applicable policy statements



# **Blueprint benefits**

#### **IT Benefits**

- Improved understanding of Al-related risks and how they apply to your use cases
- Lower risks associated with near-term use of Gen AI by setting acceptable use standards
- Long-term risks associated with AI addressed via long-term security planning
- Reduced data loss incidents related to use of public Gen AI systems

#### **Business Benefits**

- Increased productivity via Gen Al
- Lower regulatory risks related to the use of Gen Al
- Defined standards for how AI can be used, avoiding additional legal risks related to copyright infringement

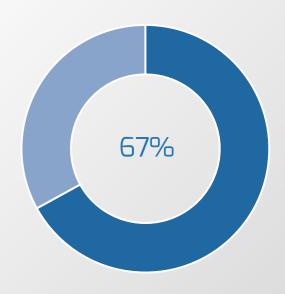
# Measure the value of this blueprint

### Expedite your policy and lower risk

Work to complete	Average time to complete	Info-Tech method	Time saved
Write Gen AI security policy	8 days – research risks, determine requirements, interview stakeholders, draft and revise policy	0.5 days	7.5 days

Improvement metrics	Outcome	
Reduced risk of data confidentiality compromise		
Reduced risk of data integrity compromise	50% reduction of risk over a one-year period	
Reduced risk of input attack		
Reduced risk of data poisoning		
Reduced risk of sponge attack		

### IT leaders prioritizing Gen Al in the next 18 months



Source: Salesforce, 2023

# Determine Gen Al suitability

### Some things are better done the old-fashioned way

Before determining the specific security and privacy risks associated with your desired use for Gen AI (and how to address them), consider whether AI is the best way to achieve your goals.

#### Info-Tech's AI Suitability Test

- What are the benefits of using Gen AI for this purpose?
- Does the intended purpose involve entering sensitive data into the Al system?
- Does the intended purpose incorporate Gen AI outputs into business processes or the supply chain?
- How severe would the impact be if sensitive data were exposed?
- How severe would the impact be if a faulty output were used?
- Will a public or private AI system be used?
- What alternatives exist to achieve the same goal and what drawbacks do they have?
- Considering your answers to the above questions, how suitable is AI for the proposed purpose?

Sources: Belfer Center, 2019; "Data Privacy," Forbes, 2023

"[T]he outcomes of ... AI suitability tests need not be binary. They can ... suggest a target level of Al reliance on the spectrum between full autonomy and full human control."

 Marcus Comiter, Capability Delivery Directorate at DoD Joint Artificial Intelligence Center



On tab 2 of the *Generative Al Risk* Map, complete the AI suitability test to determine the extent to which you can rely on AI for your use case.

# Al suitability test

AI C	Al Sullability Test		
Complete the following questionnaire to help determine the extent to which your use case can rely on Al. The final result will be self-determined, but answering these questions will help you to see areas where your use of Al may require additional oversight or where certain parts of the use case are best executed by human labor.			
Questions		Response	
1	What are the benefits of using generative Al for this purpose?		
2	Does the intended purpose involve entering sensitive data into the AI system?		
3	Does the intended purpose incorporate generative AI outputs into a business processes or the supply chain?		



#### Info-Tech Insight

Look for problems before getting invested. While Gen AI opens many possibilities, some risks will be difficult to address. For example, if your proposed use case requires sensitive data to be entered into a public AI system to produce an output for use in your supply chain, it will be virtually impossible to mitigate such risks effectively.

### Assess risks for Gen Al

### Risks depend on the use case

- Exactly which risk factors apply, and to what extent, will depend on your Gen Al use case, with the biggest variables being whether you're inputting data, using an output from the system, and whether the system is public or private.
- For example, asking the system to organize a data input so that you can use the output carries a lower data confidentiality risk in a private system than in a public one because the information isn't shared beyond the organization's AI system.
- However, another possible use case is asking a public AI system to generate a data set by compiling industry statistics, which carries virtually no input-related risk, but has significant data quality/integrity risk because the system may have used unknown or even fictitious sources.

"All Al models generate text based on training data and the input they receive. Companies may not have complete control over the output, which could potentially expose sensitive or inappropriate content during conversations. Information inadvertently included in a conversation with a Gen AI presents a risk of disclosure to unauthorized parties."

> Eric Schmitt, Global Chief Information Security Officer, Sedawick

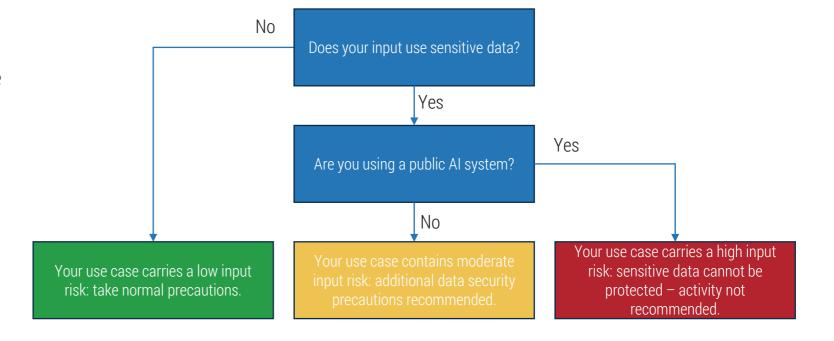
#### Info-Tech Insight

Watch for overlap. There will usually be both an input and an output component when using Gen AI, which means both risk factors are present, but one may be dominant. Therefore, both inputs and outputs should receive sign-off before use to limit data confidentiality and integrity risks.

# Input risks

### Risks depend on the use case

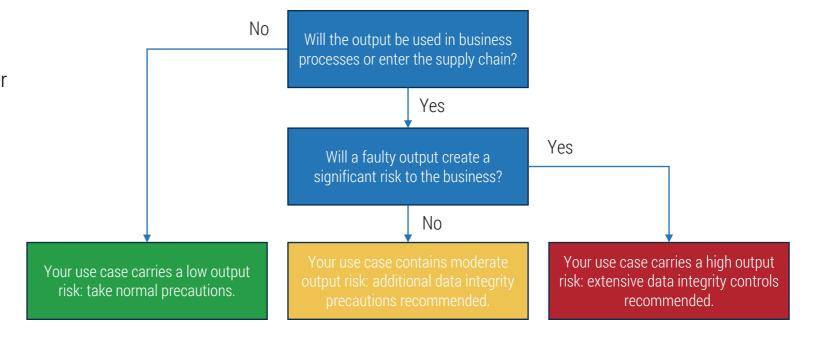
If your use case involves entering data into an Al system, the greatest risk is exposure of sensitive data, resulting in a data confidentiality compromise that may break privacy regulations or place intellectual property or trade secrets at risk.



# **Output risks**

### Risks depend on the use case

The greatest risk involved with Gen AI output is that it may be low-quality. If not verified (and corrected), this data may suffer from bias, inaccuracies, or other issues that may degrade data quality, eventually leading to data integrity loss from the number of errors it contains.

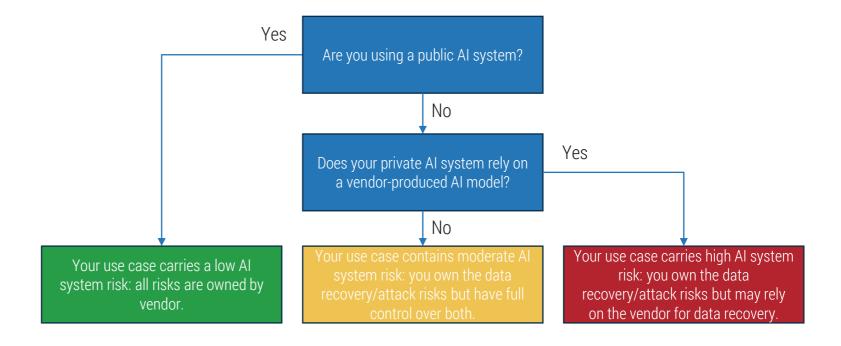


# Al system risks

### Risks depend on the use case

The major risks to an Al system are related to rebuilding the model in the event of a compromise (i.e. data recovery) and the system itself being attacked.

In a public AI system these risks are assumed by the vendor. In a private system, data risks may be jointly held (e.g. if a model is purchased from a vendor) or fully owned by the organization that built the model, though attack risks are owned by the organization.



#### Info-Tech Insight

Vendor-owned models can complicate rebuilds, as you may rely on the vendor to provide the data, which may be outdated.

### Attacks on Gen Al

### The threat landscape is evolving

#### Info-Tech Insight

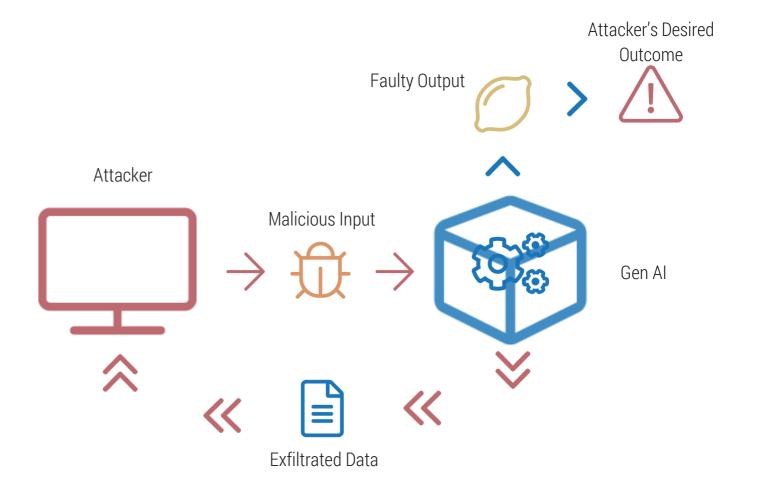
Build a strong perimeter around your Al system and data. Al security is still in its early stages and best practices are still being determined. Until more specific controls and techniques are developed, the best course of action is to use a robust data security program to make your sensitive data as difficult to access as possible, and to monitor for intrusions.

"[F]or AI attacks, a robust IT department and 90-letter passwords won't save the day. The algorithms themselves have the inherent limitations that allow for attack. Even if an AI model is trained to exacting standards using data and algorithms that have never been compromised, it can still be attacked. This bears repeating: among the state-of-the-art methods, there is currently no concept of an 'unattackable' Al system."

- Marcus Comiter, Capability Delivery Directorate at DoD Joint Artificial Intelligence Center

# Input and exfiltration attacks

- Input attacks are any adversarial action taken against an AI system by compromising data the system ingests and responds to.
- This type of attack appears in various forms, though not all apply to Gen AI systems.
- Input attacks are often preceded by an exfiltration attack. However, exfiltration may occur independently of a desire to harm the Al system itself.



# Input and exfiltration attacks

#### Attacks on Gen Al



Prompt Injection

Using cleverly written prompts to make an AI system comply with prohibited requests.

- Common attack against Gen Al using a large language model
- Acceptable use policy and user monitoring recommended



Evasion

Using an input that the AI system misinterprets, causing it to malfunction (i.e. go against training).

- Often used against AI systems designed for image or pattern recognition
- Rarely a significant risk for Gen AI, unless the system combines language and image processing



**Data Exfiltration** 

Stealing data to better understand how an AI system works (e.g. training data).

- Often precedes an input attack so that it can be better executed
- A risk for all types of AI but can be mitigated using standard data protection techniques



Inversion Attacks

A process of using inputs and measuring outputs to determine if they contain sensitive information about the model or training data.



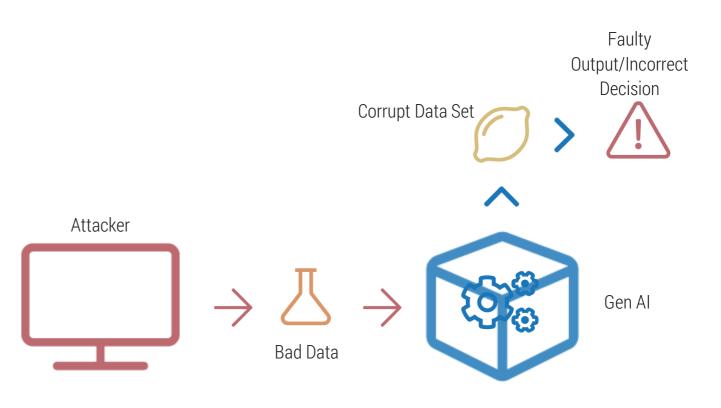
Al Model Theft

Stealing the file containing the Al model.

- Goal is to rebuild the AI model or the data it contains via outputs
- Can affect any AI system that includes sensitive data, especially if it is included in outputs
- May accompany an input attack or may be motivated by other factors, as in other forms of data exfiltration
- Strong data protection controls should be used to create a perimeter around Al system

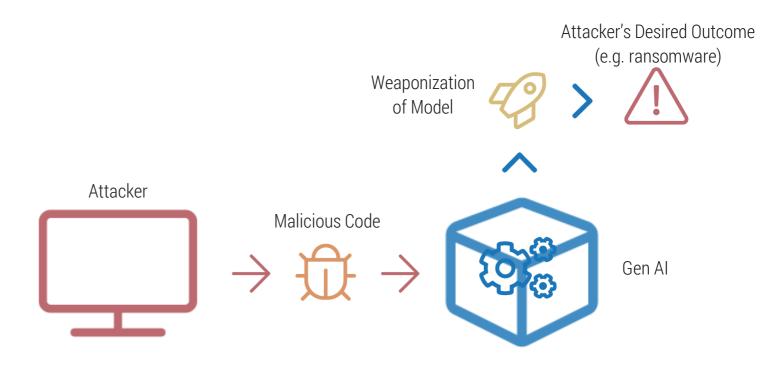
# Data poisoning

- Data poisoning occurs when an attacker gains access to AI model training data and alters or adds data with the intention of corrupting it, making its performance unreliable, potentially causing significant and even dangerous errors in its outputs.
- The greatest risk is that the attack goes unnoticed, resulting in an operational model with unknown flaws.
- The best defense is a strong perimeter around the Al model, complete with encryption and intrusion detection systems where possible.
- Rebuilding the model is the only sure recovery method, meaning reliable backups should be available.



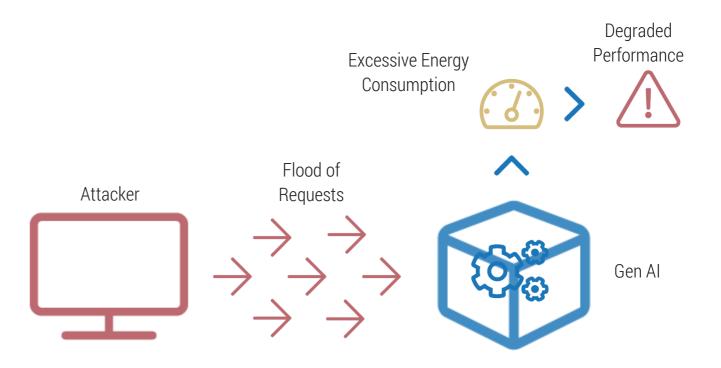
# Weaponization of Al model

- Weaponization refers to an attack where a bad actor embeds malicious code in the AI model, using it as the vector to launch another attack, such as ransomware.
- Knowledge of Al model, system, and training data should be accessed on a need-to-know basis.
- Unverified code should not be incorporated into the AI system.



# Sponge attacks

- Sponge attacks are like DoS attacks. They involve flooding the AI system with more requests than it can handle to degrade performance and cause excessive energy consumption.
- The best defense is to configure the AI system to reset if a given energy consumption threshold is reached.



# **Al-assisted** cyberattacks

### The barrier to entry just got lower

- When a bad actor uses Gen AI to launch a cyberattack, the greatest risks occur when they write malware and craft highly realistic phishing materials (e.g. naturalsounding writing, audio-visual deepfakes).
- Public AI systems are typically trained not comply with requests that are illegal or unethical. However, this safeguard can be overcome by changing the way the AI system's help is requested (e.g. prompt injection – a type of input attack).

#### Info-Tech Insight

Risk likelihood just went up. The use of Gen AI to facilitate cyberattacks doesn't fundamentally change the nature of the risk. But because Gen Al makes the process easier, we should account for this in our risk assessments.

"It's irrelevant whether an attack was developed using generative AI or not. An exploit is an exploit, and an attack is an attack, regardless of how it was created."

> - Tony Bradley, Editor-in-Chief, TechSpective, in "Defending," Forbes, 2023



- Using the information contained in slides 20-30, determine which risks apply to your Gen Al use case (i.e. data confidentiality, data integrity, and attacks on the Al system).
- Review this risk map on tab 3 to better understand how those risks are realized and to determine what mitigating tactics and policy statements are required.
- Note any key mitigating tactics or policy statements that are not currently well represented in your security program.

# Leverage Info-Tech's Generative Al Risk Map

#### Generative Al Risk Map Use the following matrix to help you determine mitigating tactics and policy statements that apply to the risks associated with your generative-AI use case. For any policy statements that don't apply, select "No" using the dropdown menu in Column I. This will cause those statements to be crossed out Once complete, review the policy statements that remain and use them to update the Al Security Policy Template. Policy statements containing square brackets indicate Info-Tech's recommendation but should be updated to match your organizational standards and terms. Note: just because a given policy statement does not apply in one context does not mean it won't be important in another. Be sure to evaluate each instance carefully before choosing whether or not to include the policy statement. For this reason, we recommend completing the risk map before updating the policy template Be sure to watch for any gaps between what the risk map recommends and your current security posture. Make a note of these gaps, as you will use them later to plan a data-security improvement roadmap aining and awareness materials for end users should be sonnel who have completed appropriate training to otect data confidentiality and integrity and are only to us up to date with the latest guidance for using generative Al as part of approved business processes Employees may use generative AI for approved business cesses, such as research, data analysis, coeptable use policy should be in place before authorizing mmunications, provided that organizational standards to rotect data confidentiality and integrity, as laid out in this types into public AI systems and the use of sensitive data is strictly prohibited. Acceptable Use systems must be formally approved by the data owner before any action can occur. nployee use of generative AI systems must be lawful and not jeopardize the organization's professional reputation Privacy policy should be in place to help end users etermine whether or not using a given data type with create privacy risks and to clarify points in the acceptab their elective use of generative AI as part of business processes, including, but not limited to, copyright violation ensitive data exposure, poor data quality, bias, or rior to use of generative AI, employees must complete Prohibited data type is leading to exposure of training related to data protection, privacy, data quality, lata integrity, and responsible AI use. mployees must not violate any privacy or data protection ulations when using generative Al systems. Access monitoring should be applied for all devices that Regular user-access monitoring must be in place for the A interact with the Al system, model, or related data to contro system, model, and training data. Appropriate data access controls must be in place for the A coess controls should be applied to Al system and trainin ITC-02 Yes nodel and training data. Multifactor authentication must be used during sign-in to Al vstem or accessing the Al model and training data. must be in-place and observed when using AI as part of a Data used to train the AI model shall be classified as [restricted] and must be encrypted while at rest to secure against data exfiltration by a bad actor. Data classification labels should be applied to all records ivacy regulations and organizational processes designe used in the Al system to control against prohibited data comply with them must be followed with entering data type being used nto the AI system, especially in cases involving a public A vstem (e.g. ChatGPT). All suspected or confirmed cases of compromised data

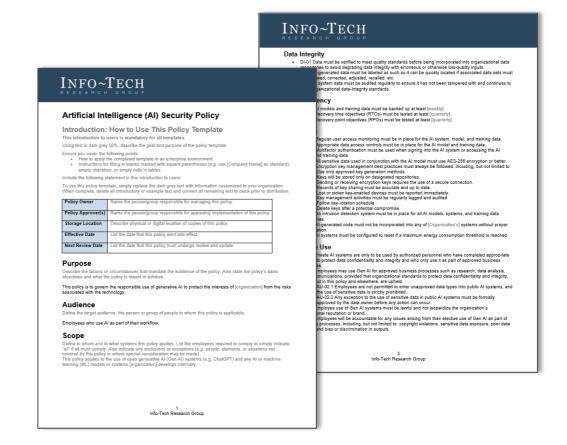
onfidentiality must be reported to [Cybersecurity] using

established channels as soon as possible



- After determining the applicable policy statements, update this policy template by deleting the ones that don't apply.
- Each policy statement is crossreferenced using the code provided in the risk map.

# Update the Al Security Policy Template



- As a final step, use a whiteboard to brainstorm a list of proposed program improvements based on the gaps noted while completing the risk map exercise.
- Be sure to prioritize
   improvements using an effort-to benefit evaluation, targeting the
   improvements that will provide
   the greatest boost to your
   security program maturity.

# Plan for future improvements

### Initiative Planning

#### Quarter 1

- 1. Update privacy policy to include AI use
- 2. Expand use of intrusion detection system (IDS) to include AI system and training data

#### Quarters 2-3

- 1. Implement AI-produced content verification process
- 2. Design training and awareness materials to address AI risks

#### Quarter 4

1. Create AI backup plan

# Research Contributors and Experts



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**Trenton Schuttler** Co-Owner TBI IT

# Related Info-Tech Research



Secure Your High-Risk Data



Build a Data Privacy Program



<u>Develop Responsible AI Guiding Principles</u>

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