Becoming the Trainer: Attacking ML Training Infrastructure



Brett Hawkins (@h4wkst3r)

Adversary Services, IBM X-Force Red

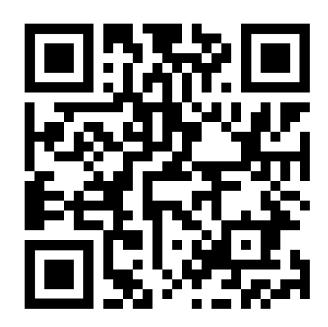




Blog Post and Tool



Blog Post



MLOKit

Agenda



- 1. Introduction
- 2. Background
- 3. Attacking ML Training Environments
 - Attack Scenarios
 - Demos

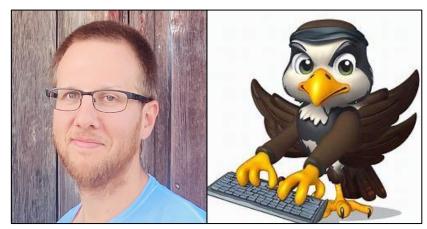
- 4. Protecting ML Training Environments
- 5. Conclusion
- 6. Q&A

Introduction



Who am I – Brett Hawkins

https://h4wkst3r.github.io





Current Role

Team Lead, Adversary Services IBM X-Force Red



Open-Source Tool Author

SharPersist, InvisibilityCloak, SCMKit, ADOKit, MLOKit



Conference Speaker

Black Hat (US & EU),
BlueHat,
ShmooCon,
DerbyCon, Wild
West Hackin' Fest,
BSides, Hackers
Teaching Hackers

Research Drivers





Threat actors targeting AI/ML environments



Lack of research on attacking and defending ML infrastructure

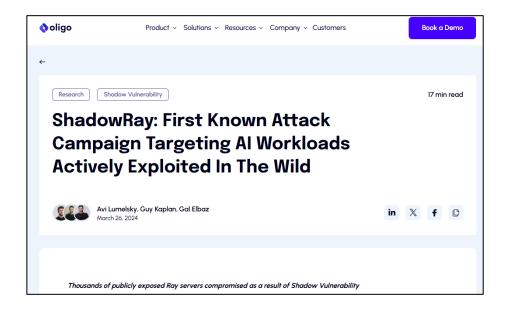


Adoption of ML technologies by enterprises



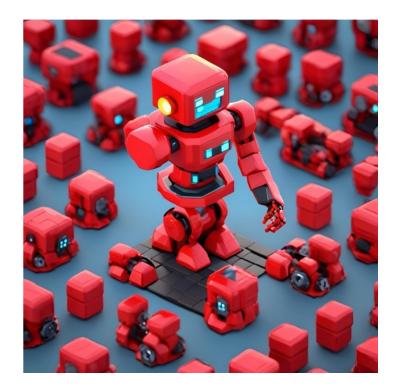
Lack of tooling to simulate attacks against platforms used in ML training envs

Threat Actor Motivation



Theft of models and weights, backdooring models for initial access or persistence, expanding access via lateral movement and privesc, sensitive data theft or deploying ransomware, model modification/poisoning for misclassification, degradation, fraud or ml-based detection evasion.

Attendee Takeaways





How to steal models from model registries



How to poison models within ML training platforms



How to defend key components of ML training infrastructure



How to get code execution via attacks on ML training infrastructure

What is new in this research?

```
[*] INFO: Listing Model Artifact Location Info:
Account Name: testworkspace5178193999
Datastore Type: AzureBlob
Container Name: azureml
Path: ExperimentRun/dcid.AutoML_91114fd1-6657-4bf0-b51d-6f868e2c2033_42/outputs/mlflow-m
[*] INFO: Getting associated datastore for model artifacts:
                  Account Name
                                                                    Container Name
      testworkspace5178193999
                                                                            azureml
[*] INFO: Uploading model artifacts
[*] INFO: Uploading: conda.yaml
[*] INFO: Uploading: MLmodel
[*] INFO: Uploading: model.pkl
[*] INFO: Uploading: python_env.yaml
[*] INFO: Uploading: requirements.txt
[+] SUCCESS: Model has been poisoned with model artifacts specified in source directory
```



Advanced attacks against ML training environments



New detection rules (Azure ML and SageMaker)



MLOKit tool
updates – NEW
supported
platforms and
attacks

My Perspective



Iam

Offensive Cybersecurity Specialist

I am not

Data Scientist

AI/ML Engineer

Cloud Engineer

Detection Engineer

DevOps Engineer

Software Engineer

Background



Prior Work

Links to prior work are provided in appendix slides

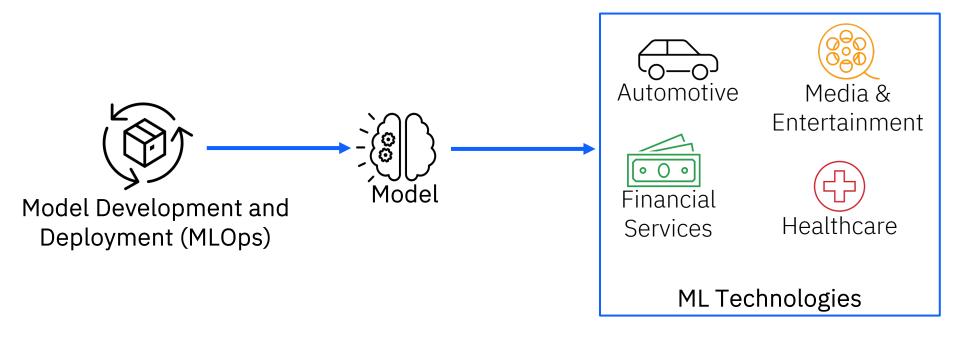
Chris Thompson (@retBandit) & I – ShmooCon 2025

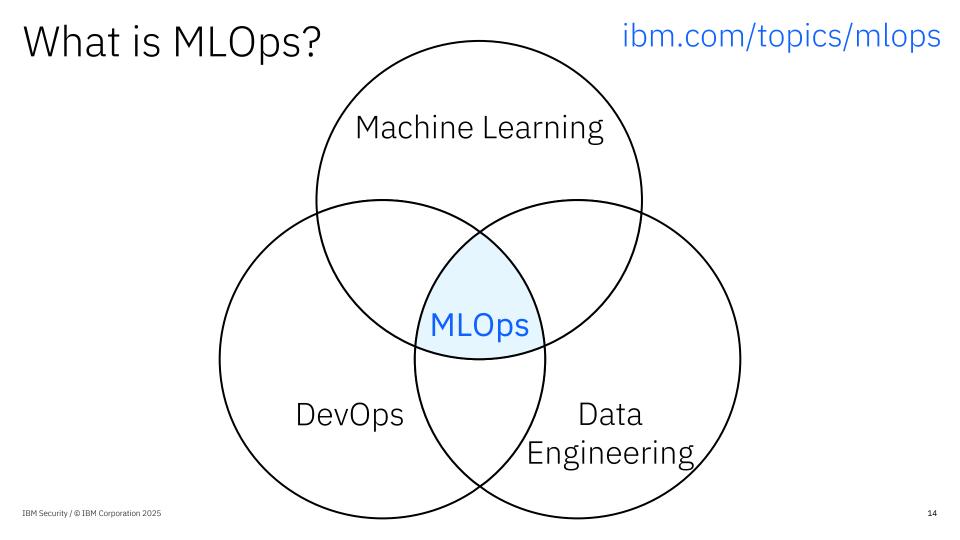
<u>Disrupting the Model: Abusing MLOps Platforms to</u> <u>Compromise ML Models and Enterprise Data</u> <u>Lakes</u>

Or Azarzar (@azarzaror) – Blog Post (2021)

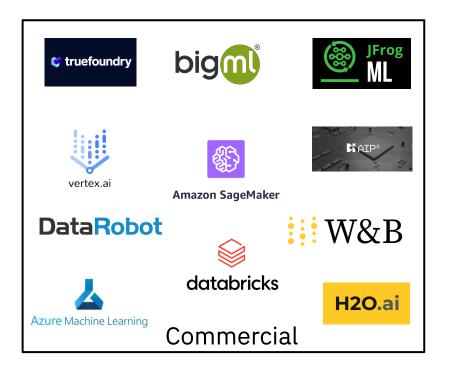
<u>Protect Your Environment When Working with</u> Amazon SageMaker

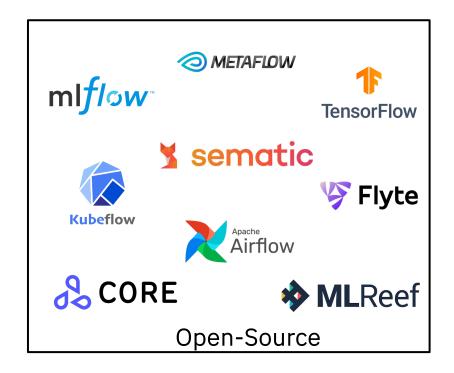
ML Technology Use Cases



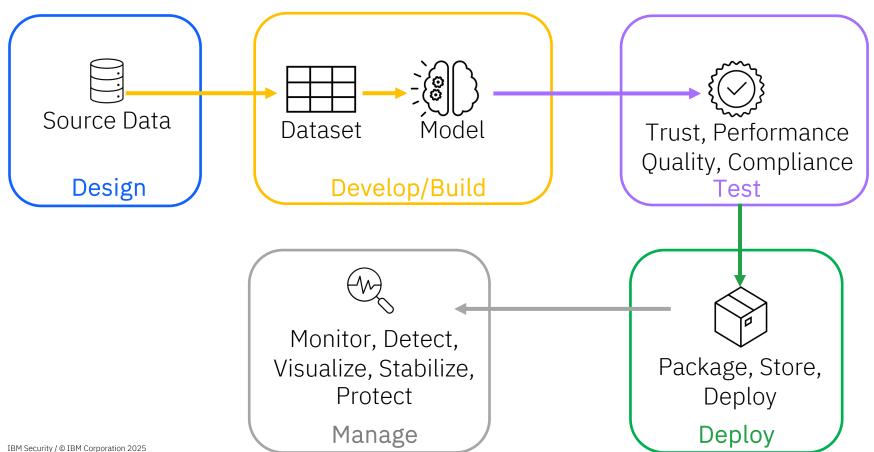


Popular MLOps Platforms

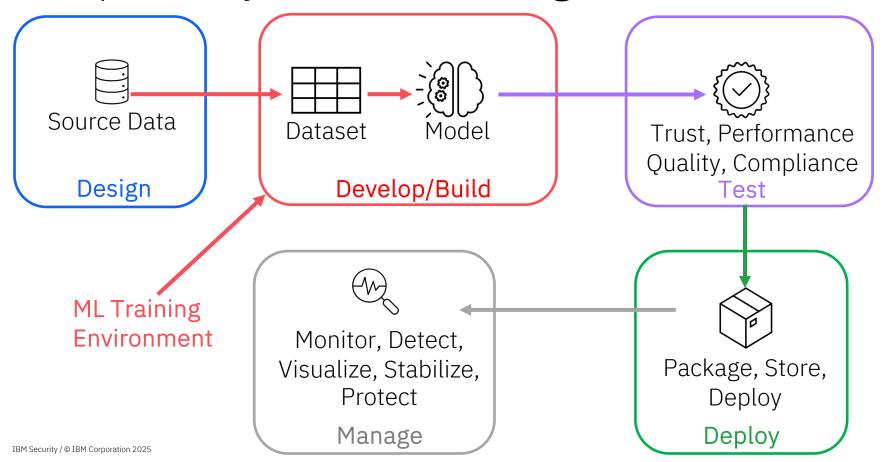


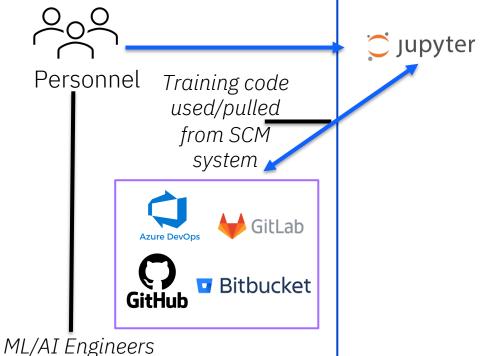


MLOps Lifecycle



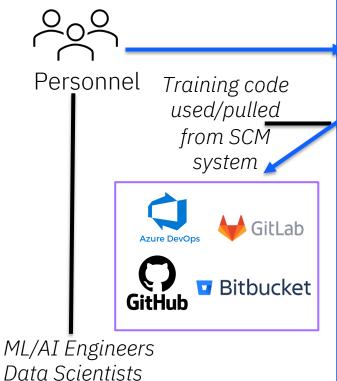
MLOps Lifecycle - ML Training Environment



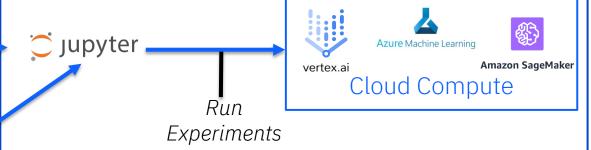


ML/AI Engineers
Data Scientists
Software Developers

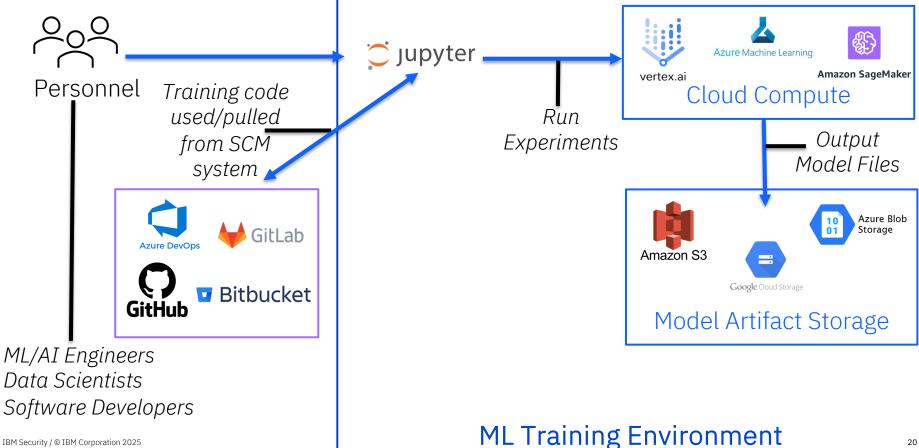
ML Training Environment

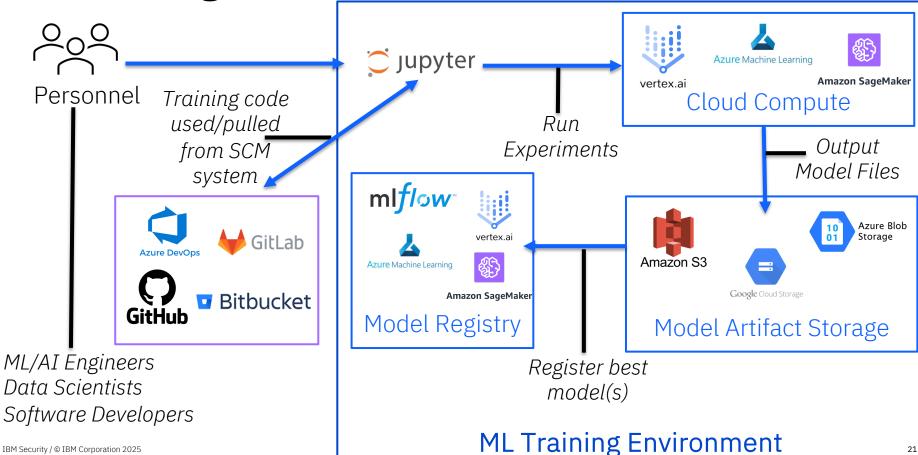


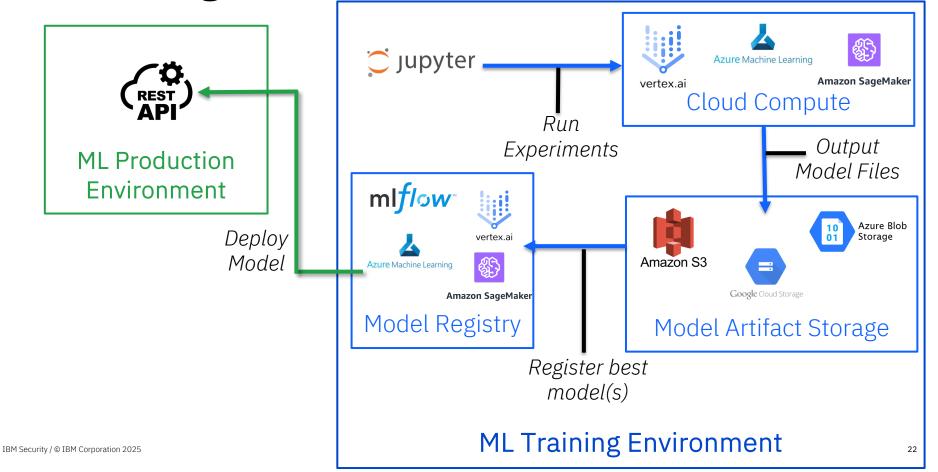




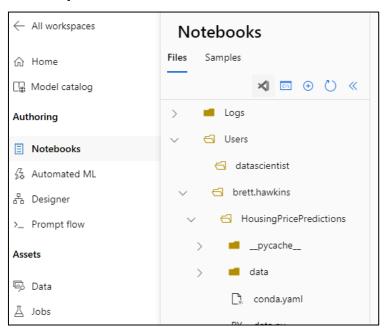
ML Training Environment







ML Training Infrastructure Components





Notebook Env Contains ML training code



Model Registry
Track and version
models

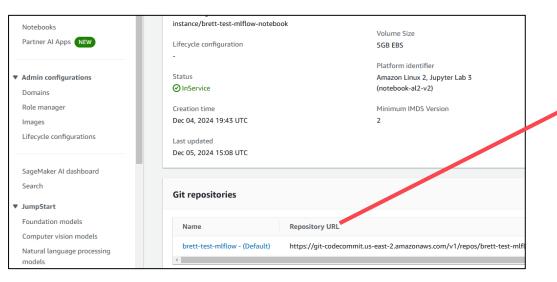


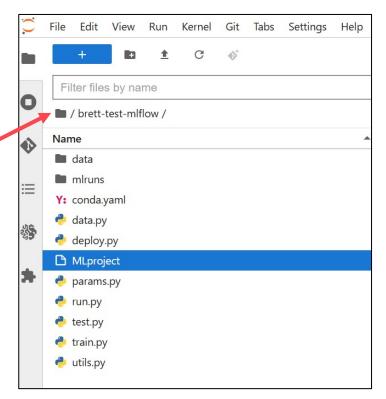
Cloud Compute
Infrastructure that
performs ML
training from ML
training code



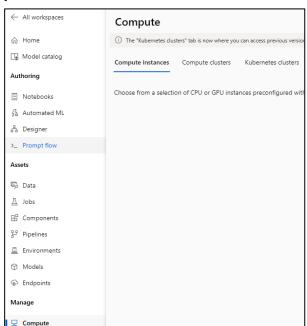
Model Artifact Storage ML training artifact outputs (model weights, model files, etc.)

Notebook Env- SageMaker





ML Training Infrastructure Components





Notebook Env Contains ML training code



Model Registry
Track and version
models

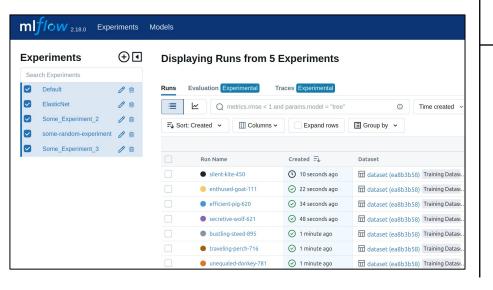


Cloud Compute
Infrastructure that
performs ML
training from ML
training code



Model Artifact
Storage
ML training
artifact outputs
(model weights,
model files, etc.)

ML Training Infrastructure Components







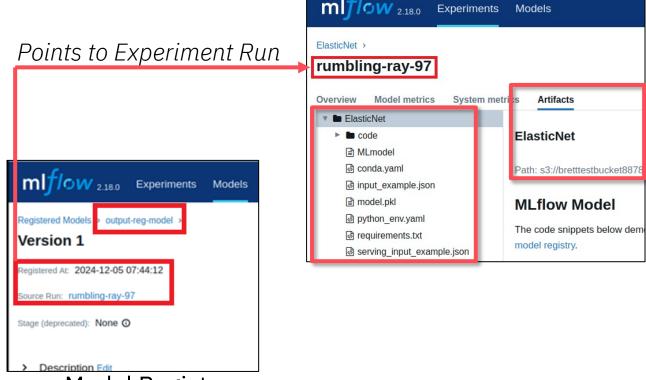
Model Registry Track and version models





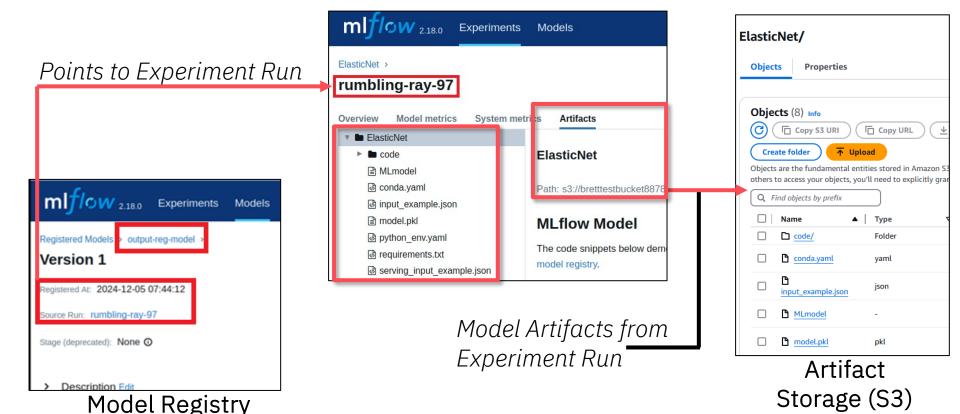
Model Artifact Storage ML training artifact outputs (model weights, model files, etc.) ²⁶

Model Registry and Artifact Storage - MLFlow

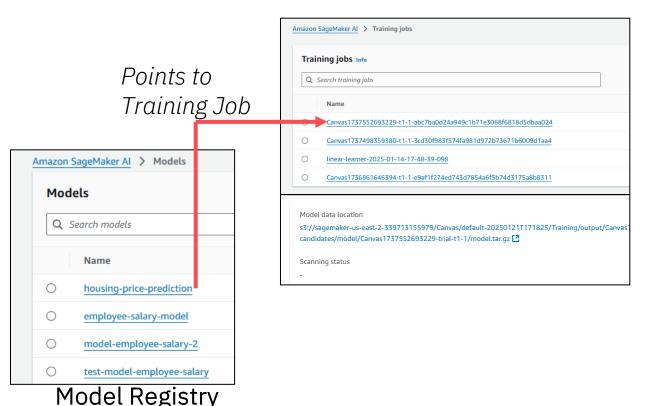


Model Registry

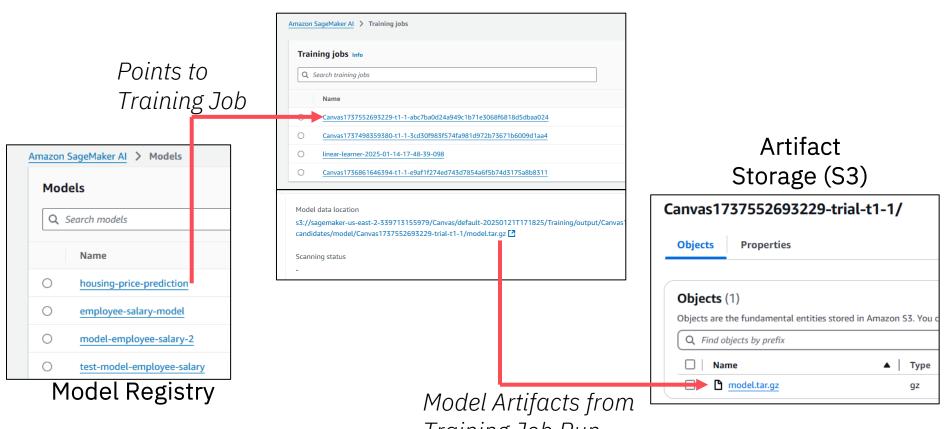
Model Registry and Artifact Storage - MLFlow



Model Registry and Artifact Storage - SageMaker

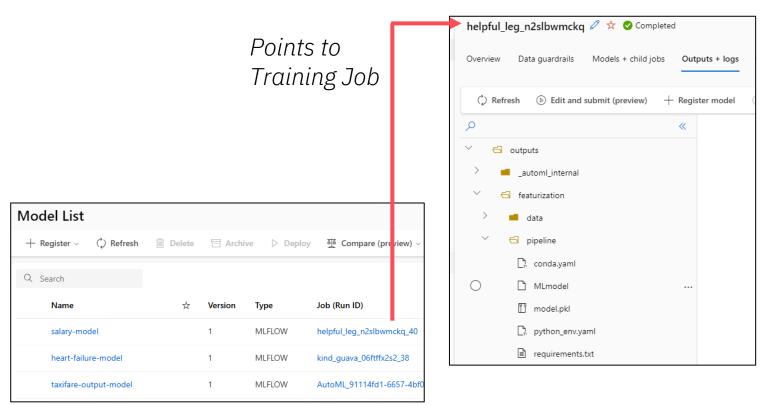


Model Registry and Artifact Storage - SageMaker



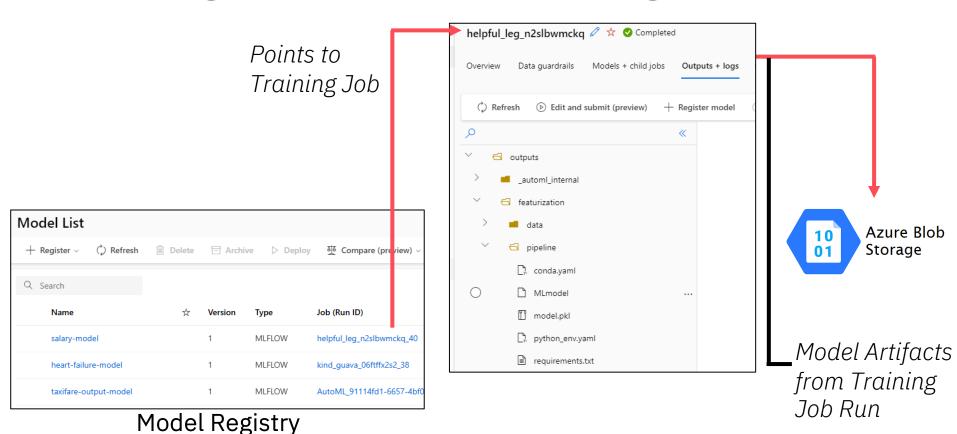
IBM Security / ® IBM Corporation 2025 Training Job Run

Model Registry and Artifact Storage – Azure ML

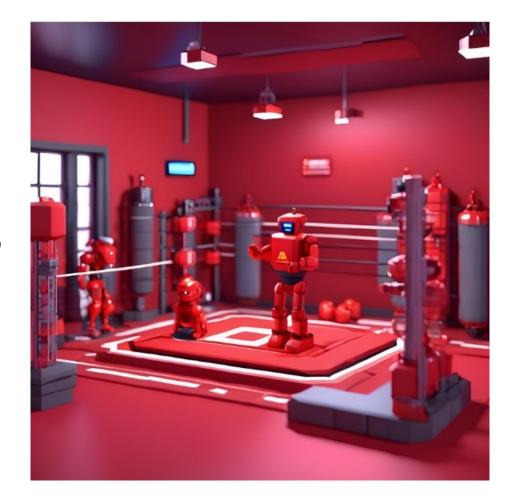


Model Registry

Model Registry and Artifact Storage – Azure ML

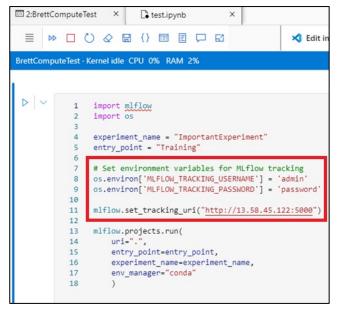


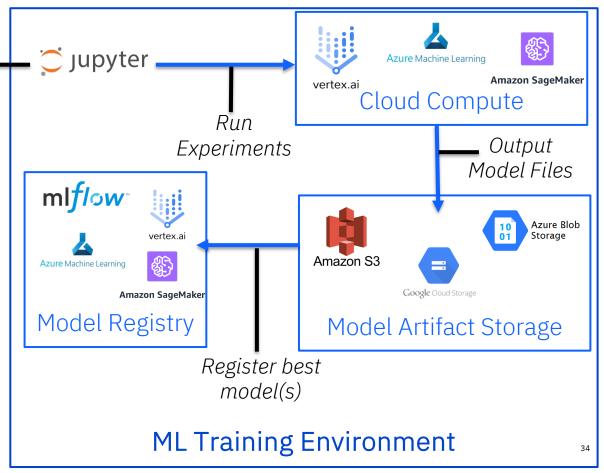
Attacking ML Training Environments



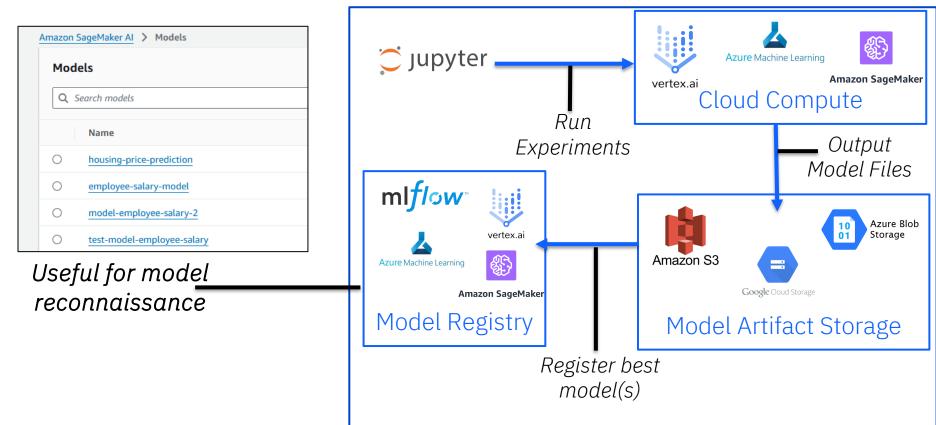
Key Components – Attacker Perspective

Credentials and info on other **=** infrastructure





Key Components – Attacker Perspective

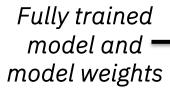


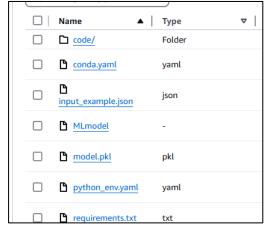
ML Training Environment

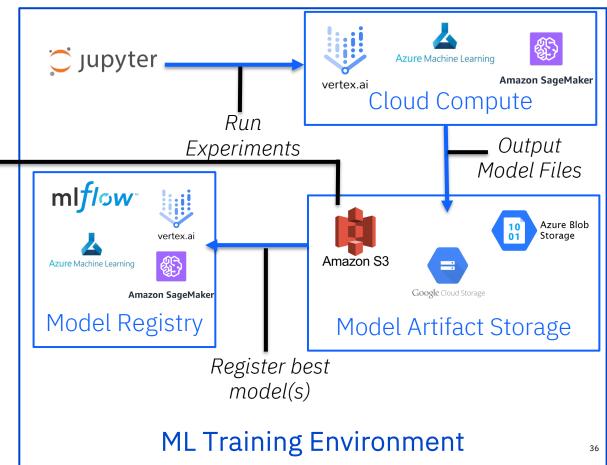
IBM Security / © IBM Corporation 2025

35

Key Components – Attacker Perspective



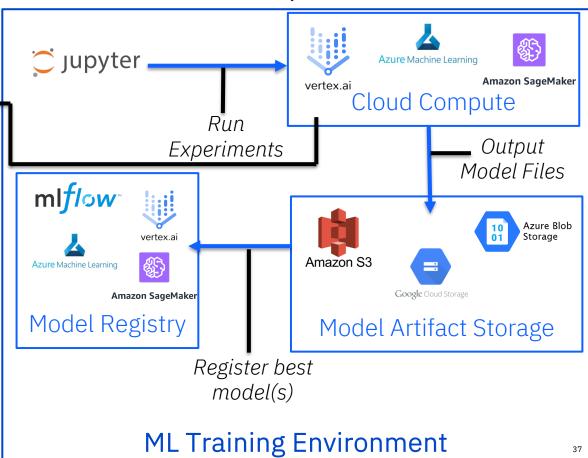




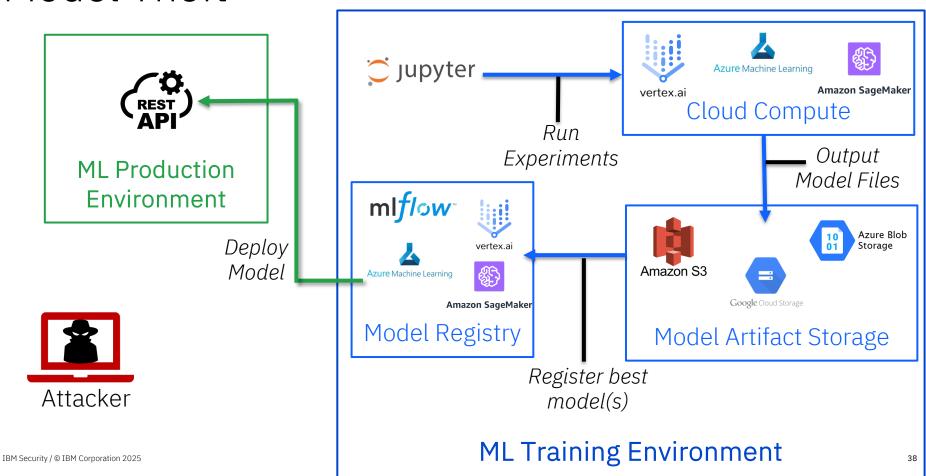
Key Components – Attacker Perspective

Sensitive environment variables and ML training code

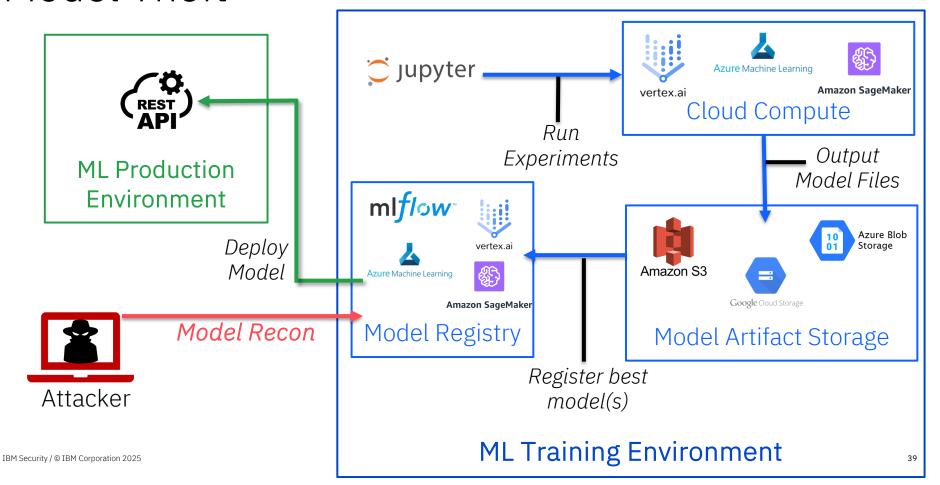
```
(base) [ec2-user@ip-172-16-11-6 brett-test-mlflow]$ ls -la
ls -la
total 64
drwxrwxr-x 7 ec2-user ec2-user 4096 Dec 5 15:35 .
drwxr-xr-x 6 ec2-user ec2-user 4096 Dec 5 15:08 ...
-rw-rw-r-- 1 ec2-user ec2-user 1292 Dec 4 19:48 conda.vaml
drwxrwxr-x 2 ec2-user ec2-user 4096 Dec 4 19:48 data
rw-rw-r-- 1 ec2-user ec2-user 1485 Dec 4 19:48 data.pv
-rw-rw-r-- 1 ec2-user ec2-user 879 Dec 4 19:48 deplov.pv
drwxrwxr-x 8 ec2-user ec2-user 4096 Dec  5 15:35 .git
drwxrwxr-x 2 ec2-user ec2-user 4096 Dec    5 14:30 .ipynb checkpoints
-rw-rw-r-- 1 ec2-user ec2-user 131 Dec 5 15:35 MLproject
drwxrwxr-x 4 ec2-user ec2-user 4096 Dec 5 15:15 mlruns
-rw-rw-r-- 1 ec2-user ec2-user 986 Dec 4 19:48 params.pv
drwxrwxr-x 2 ec2-user ec2-user 4096 Dec 4 19:58 __pycache__
-rw-rw-r-- 1 ec2-user ec2-user 270 Dec 5 14:30 run.pv
rw-rw-r-- 1 ec2-user ec2-user 520 Dec 4 19:48 test.pv
(base) [ec2-user@ip-172-16-11-6 brett-test-mlflow]$ ls -la data
ls -la data
total 904
drwxrwxr-x 2 ec2-user ec2-user 4096 Dec 4 19:48 .
drwxrwxr-x 7 ec2-user ec2-user 4096 Dec 5 15:35 ...
-rw-rw-r-- 1 ec2-user ec2-user 452865 Dec 4 19:48 test.csv
(base) [ec2-user@ip-172-16-11-6 brett-test-mlflow]$
```



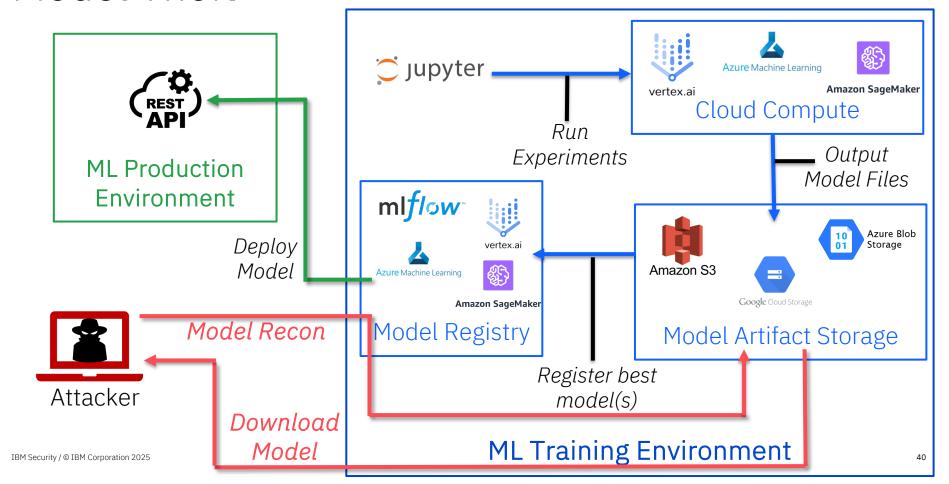
Model Theft



Model Theft



Model Theft



Model Theft - Impact

IP Theft

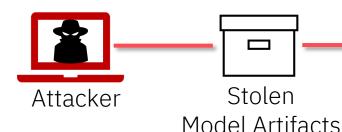
Model Extraction & Replication

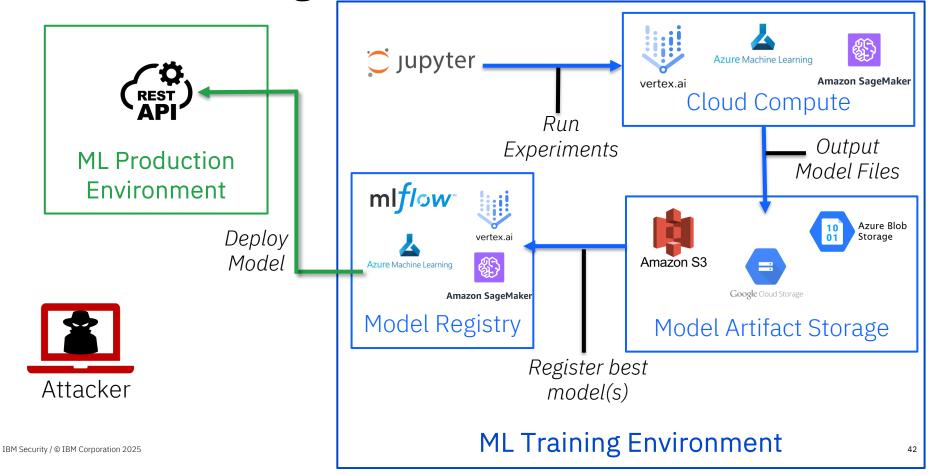
Adversarial Attacks & Evasion

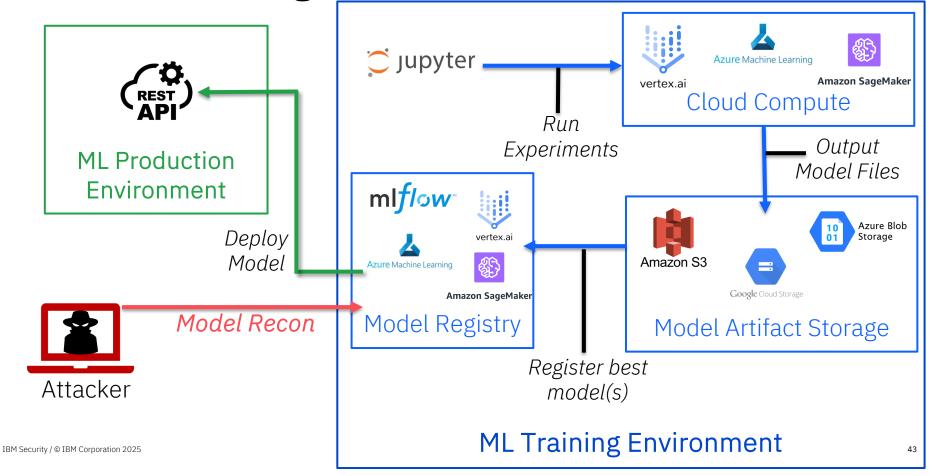
Backdooring

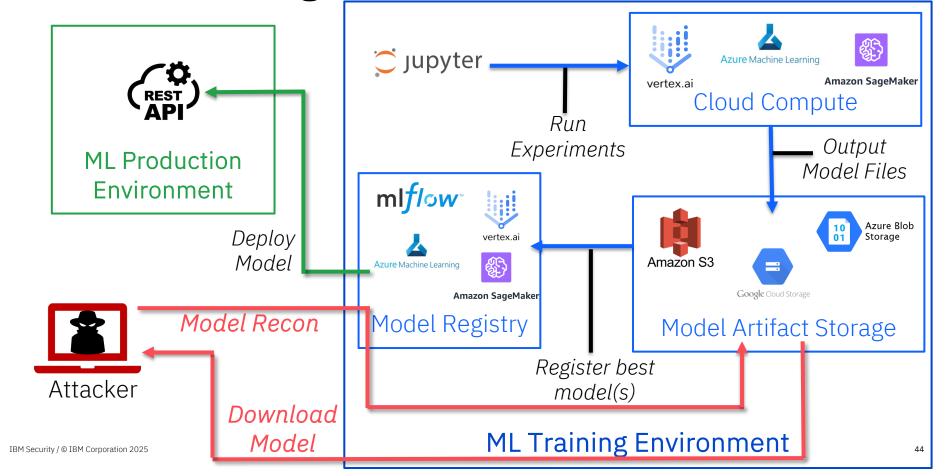
Compromise of System Security

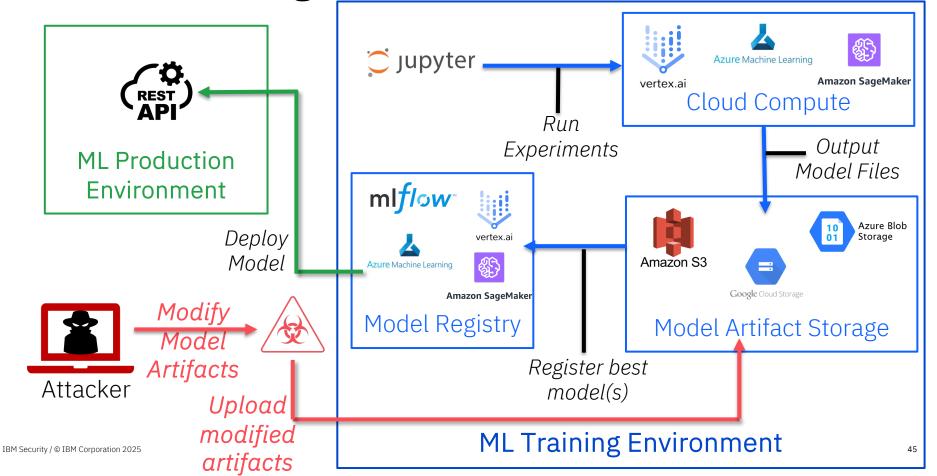
Competitive Intelligence & Strategy Analysis

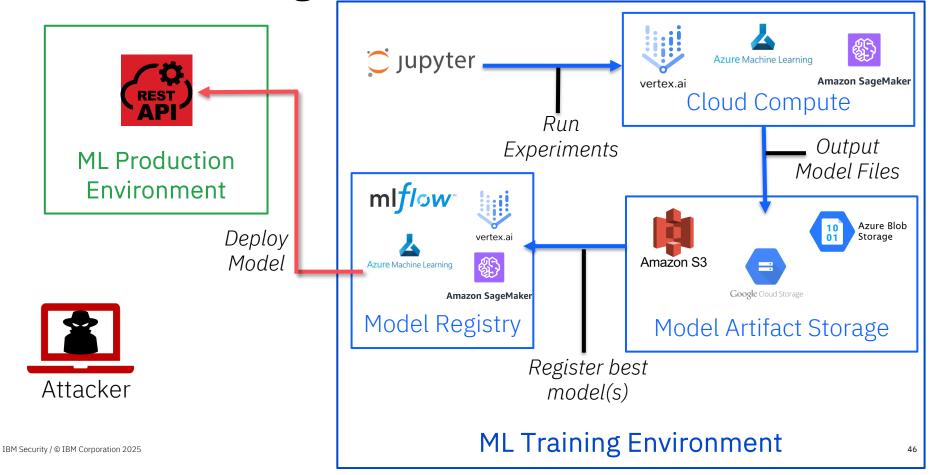




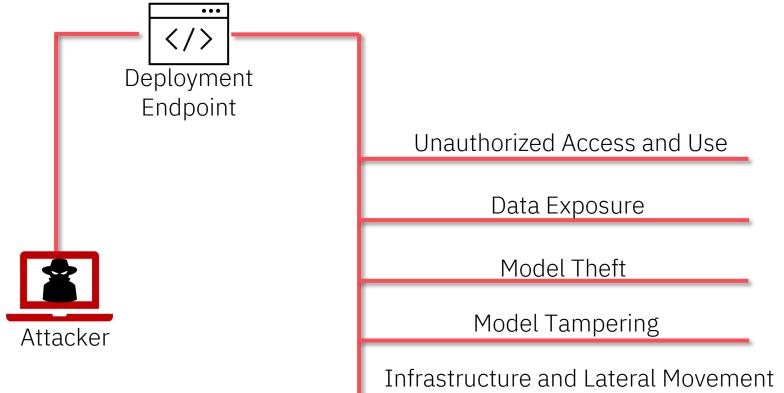




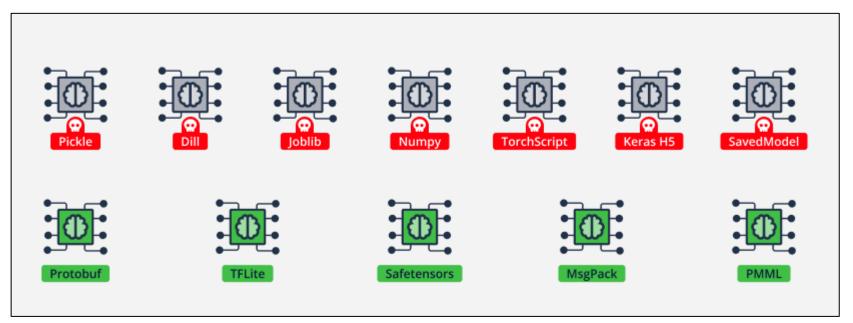




Model Poisoning – Code Execution - Impact



Model Formats – Support Code Execution on Load



https://jfrog.com/blog/from-mlops-to-mloops-exposing-the-attack-surface-of-machine-learning-platforms/

Creating Malicious Models for Code Execution

- MaliciousPickles https://github.com/coldwaterq/MaliciousPickles
- Charcuterie https://github.com/moohax/Charcuterie
- Fickling https://github.com/trailofbits/fickling
- HiddenPickle https://github.com/hiddenlayerai/HiddenPickle

MLOKit

github.com/xforcered/MLOKit

```
[*] INFO: Performing download-model module for sagemaker
[*] INFO: Checking credentials provided
[+] SUCCESS: Credentials are valid
                                        Model Name |
                                                            Creation Date
                             employee-salary-model |
                                                                1/22/2025
[*] INFO: Downloading model artifacts
[*] INFO: Model artifacts location
s3://sagemaker-us-east-2-339713155979/Canvas/default-20250121T171825/Train:
1/model.tar.gz
[*] INFO: Checking access to S3 bucket with name: sagemaker-us-east-2-3397:
[+] SUCCESS: You have access to S3 bucket with name: sagemaker-us-east-2-3:
[*] INFO: Listing all files in prefix of: Canvas/default-20250121T171825/T
-t1-1/
Canvas/default-20250121T171825/Training/output/Canvas1737498359380/sagemake
[*] INFO: Downloading file at: Canvas/default-20250121T171825/Training/out;
.tar.gz
   SUCCESS: model.tar.gz written to: C:\Demo\MLOKit-OiEJQGbz
```





REST API Abuse

Conduct actions programmatically

Authentication

API Key, Access Token, Security Creds, User/Pass



9 Modules

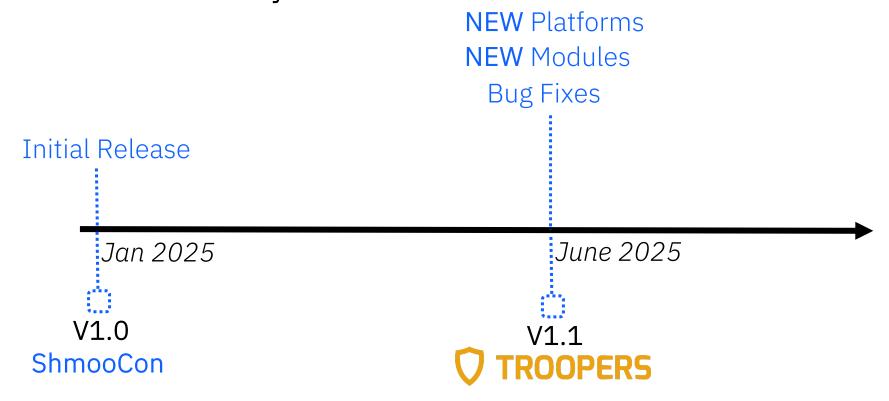
Recon, Training Data Theft, Model Theft, Model Poisoning, Notebook Attacks



5 Supported Platforms

Azure ML, BigML, Vertex AI, MLFlow, SageMaker

MLOKit - History



Demos: Attack Scenarios



Obtaining Credentials

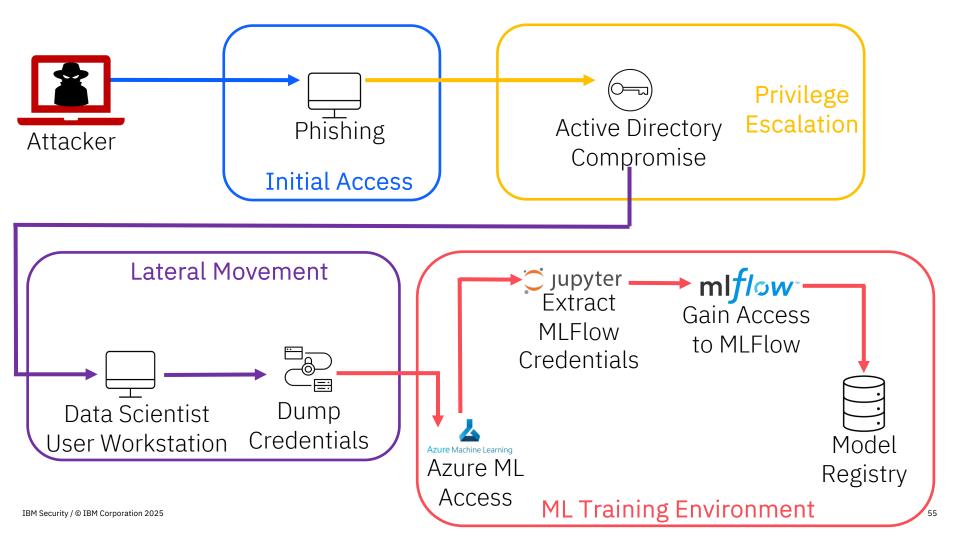
IBM Security / © IBM Corporation 2025

File Shares Intranet Sites (e.g., internal wikis) **User Workstations** Social Engineering This research focuses Public Resources (e.g., Code Repos) on attack paths Unauthenticated Access possible from here Public Data Breach Leaks ML Training Infra Attacks Retrieve user ML Training credentials Infrastructure

Demos: Attack Scenarios

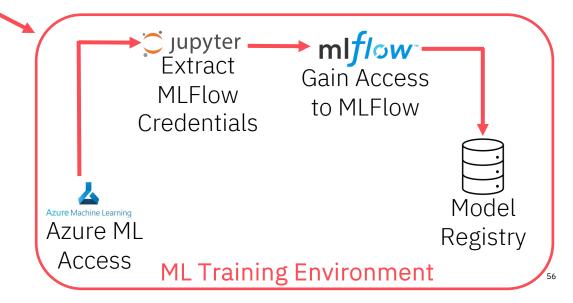
#1: MLFlow - Initial Access and Model Theft from Model Registry

- #2: SageMaker Lateral Movement from SCM System to Cloud Compute
- #3: SageMaker Lateral Movement to Cloud Compute using Malicious
- Lifecycle Configuration
- #4: SageMaker Model Theft from Model Registry
- #5: SageMaker Model Poisoning to gain Code Execution
- #6: Azure ML Model Poisoning to gain Code Execution





Demo





Demos: Attack Scenarios

#1: MLFlow - Initial Access and Model Theft from Model Registry

#2: SageMaker - Lateral Movement from SCM System to Cloud Compute

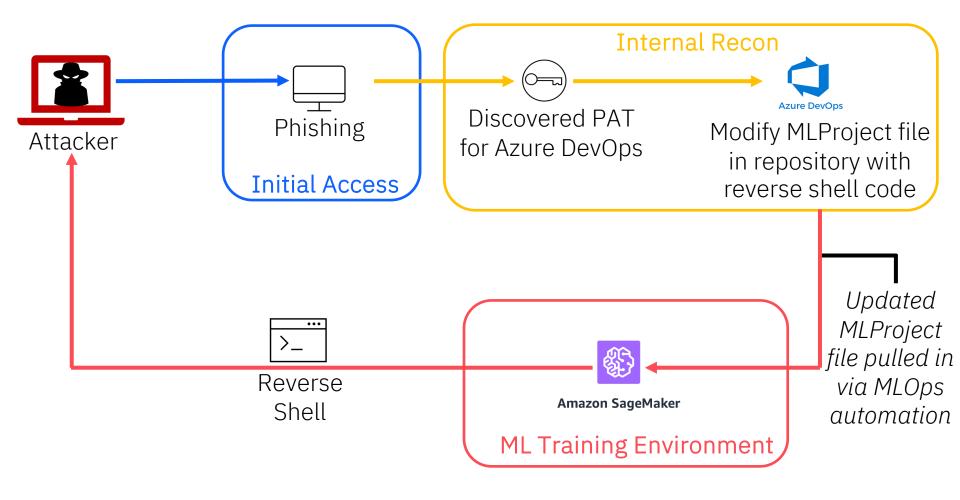
#3: SageMaker - Lateral Movement to Cloud Compute using Malicious

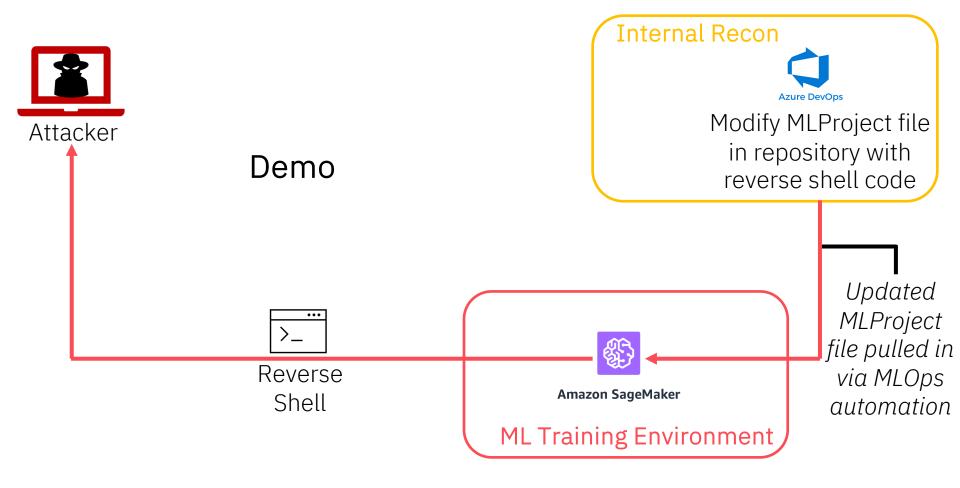
Lifecycle Configuration

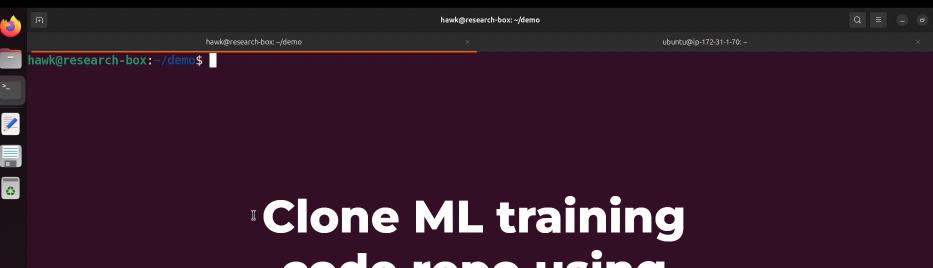
#4: SageMaker - Model Theft from Model Registry

#5: SageMaker - Model Poisoning to gain Code Execution

#6: Azure ML - Model Poisoning to gain Code Execution





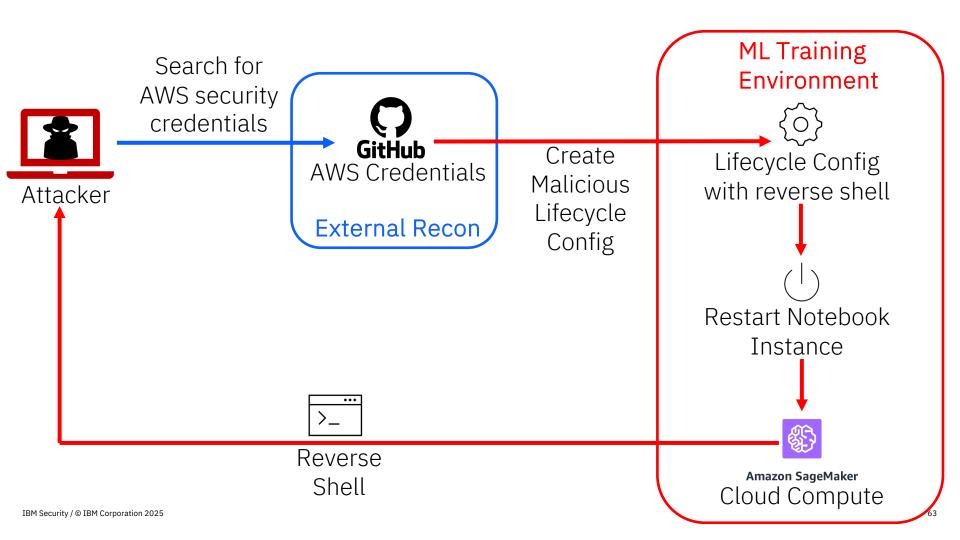


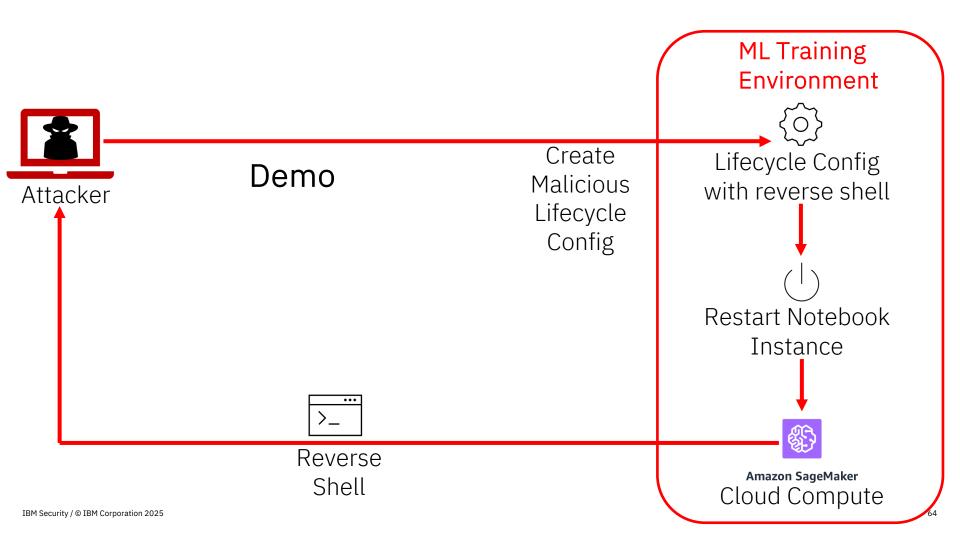


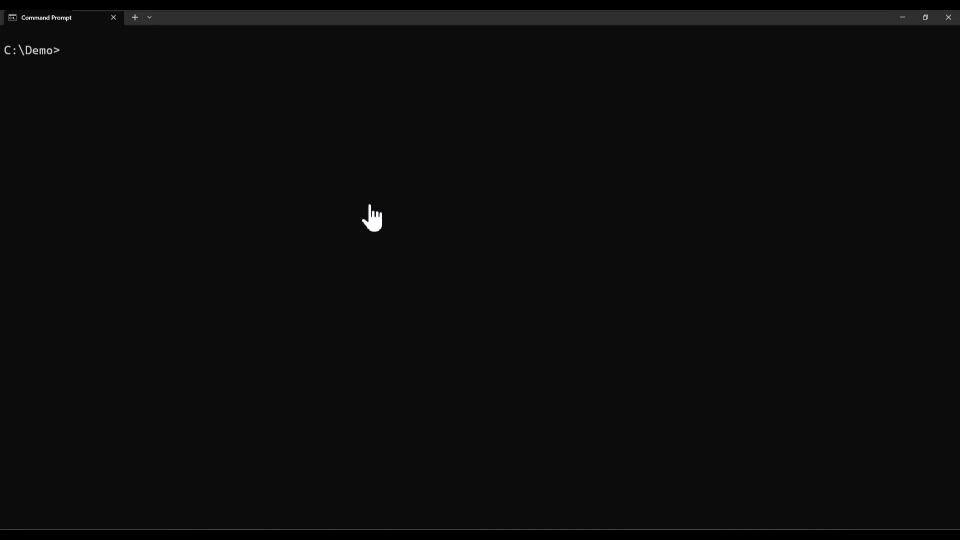


Demos: Attack Scenarios

- #1: MLFlow Initial Access and Model Theft from Model Registry #2: SageMaker - Lateral Movement from SCM System to Cloud Compute
- #3: SageMaker Lateral Movement to Cloud Compute using Malicious Lifecycle Configuration
- #4: SageMaker Model Theft from Model Registry
- #5: SageMaker Model Poisoning to gain Code Execution
- #6: Azure ML Model Poisoning to gain Code Execution

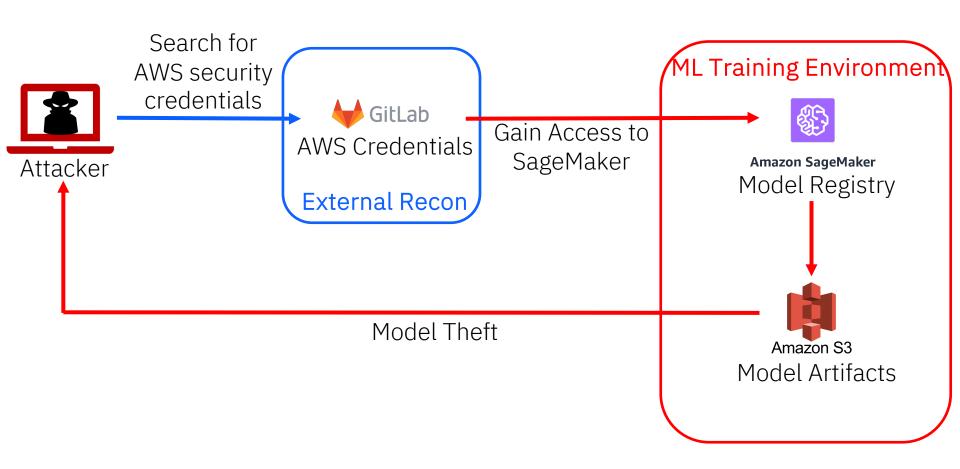


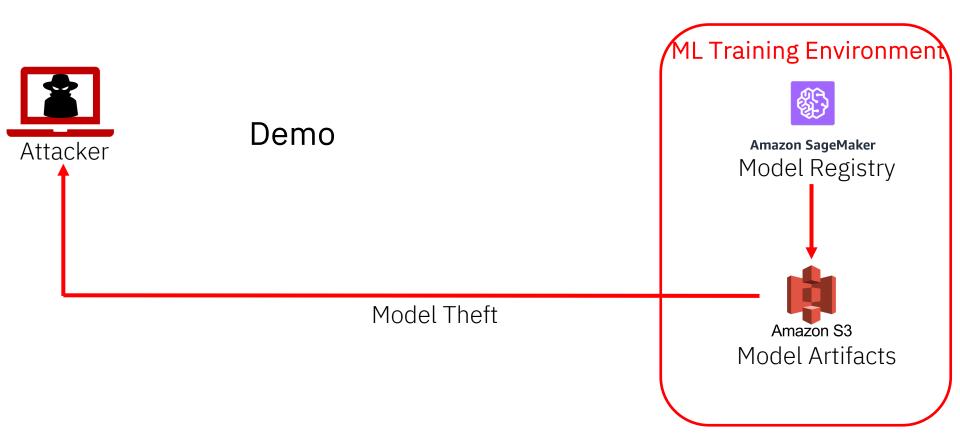


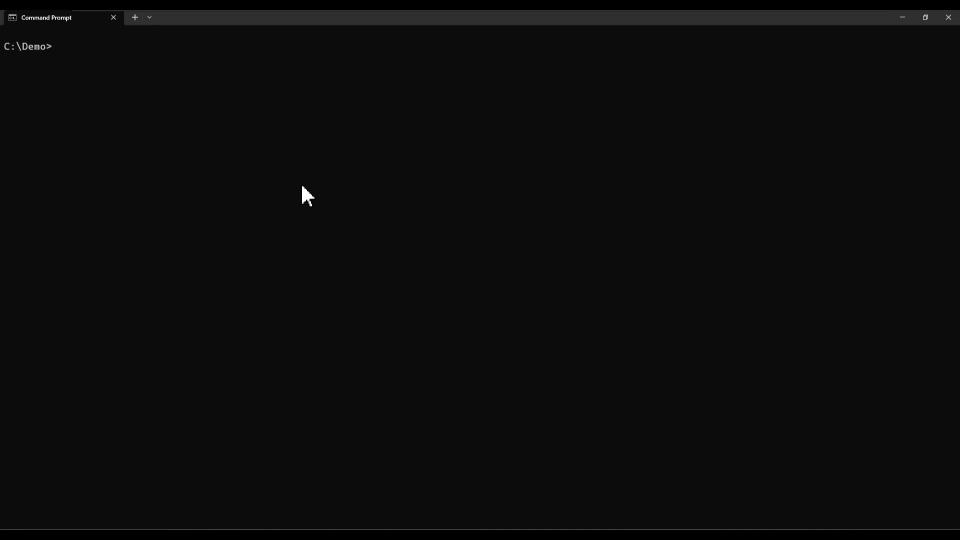


Demos: Attack Scenarios

- #1: MLFlow Initial Access and Model Theft from Model Registry#2: SageMaker Lateral Movement from SCM System to Cloud Compute#3: SageMaker Lateral Movement to Cloud Compute using MaliciousLifecycle Configuration
- #4: SageMaker Model Theft from Model Registry
- #5: SageMaker Model Poisoning to gain Code Execution
- #6: Azure ML Model Poisoning to gain Code Execution

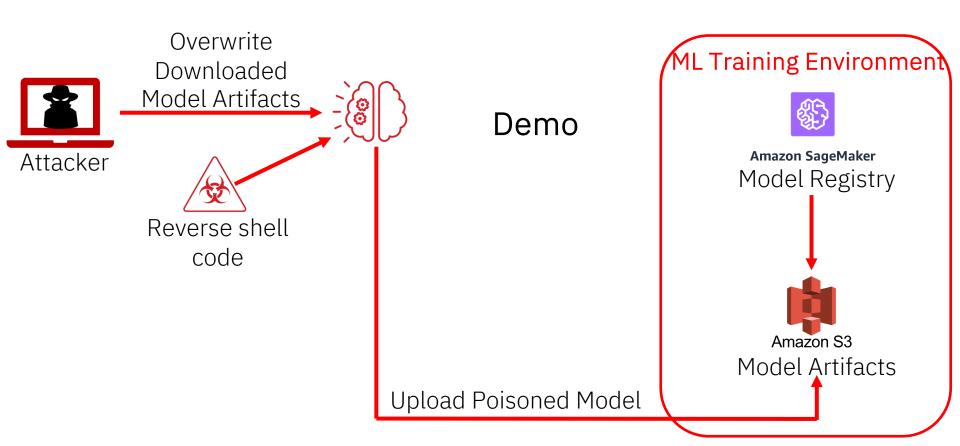






Demos: Attack Scenarios

- #1: MLFlow Initial Access and Model Theft from Model Registry
 #2: SageMaker Lateral Movement from SCM System to Cloud Compute
 #3: SageMaker Lateral Movement to Cloud Compute using Malicious
 Lifecycle Configuration
 #4: SageMaker Model Theft from Model Registry
- #5: SageMaker Model Poisoning to gain Code Execution
- #6: Azure ML Model Poisoning to gain Code Execution



C:\Demo>

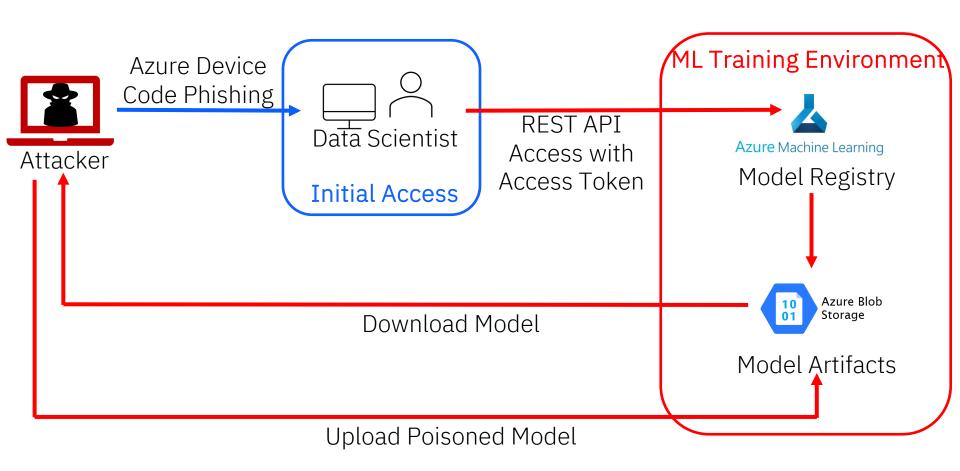


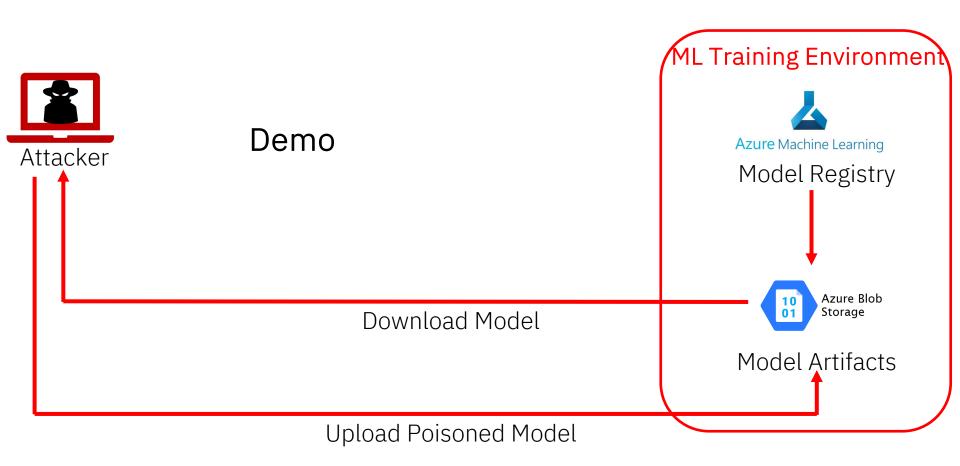
Showing model artifacts of model we previously downloaded

Demos: Attack Scenarios

```
#1: MLFlow - Initial Access and Model Theft from Model Registry
#2: SageMaker - Lateral Movement from SCM System to Cloud Compute
#3: SageMaker - Lateral Movement to Cloud Compute using Malicious
Lifecycle Configuration
#4: SageMaker - Model Theft from Model Registry
#5: SageMaker - Model Poisoning to gain Code Execution
```

#6: Azure ML - Model Poisoning to gain Code Execution





Protecting ML Training Environments



Users

Use password management system

Separate admin account

Additional monitoring controls

Security Awareness Training

MFA enabled and in use

PATs with expiration dates



Notebook Environments

Password protect notebook

IP address restrictions

Limits to kernel execution times

Use virtual environment

Run as non-root account

No cleartext credentials/secrets



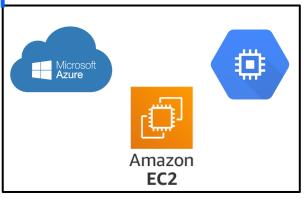
Cloud Compute

Enable auto-shutdown and auto-start schedule

Delete compute if no longer needed

Disable unneeded services

Configure role-based access



Model Artifact Storage and Registry

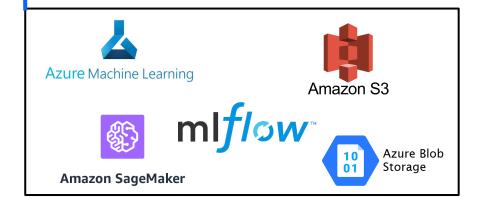
Cleanup/delete old model artifacts

Restrict access to backend storage

IP-address restrictions

Enable logging and apply detection rules

Implement model integrity verification



Detection Guidance – Summary



https://github.com/h4wkst3r/KQL-Queries

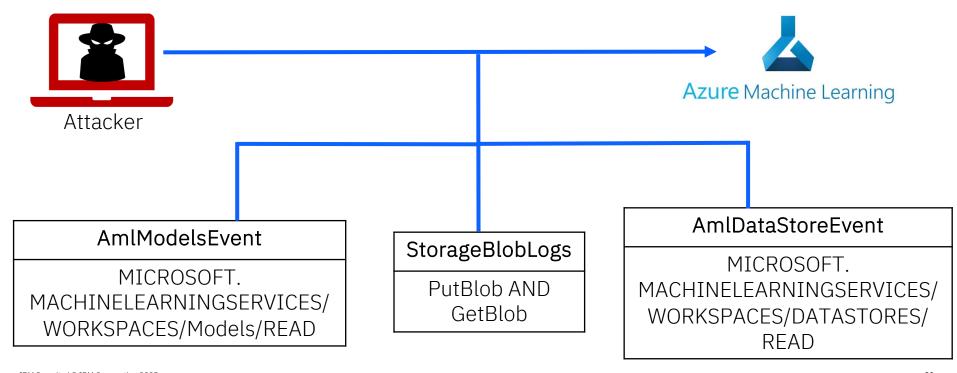
Dataset Poisoning
Dataset Recon
Dataset Theft
Model Poisoning
Model Recon
Model Theft

SageMaker Detections

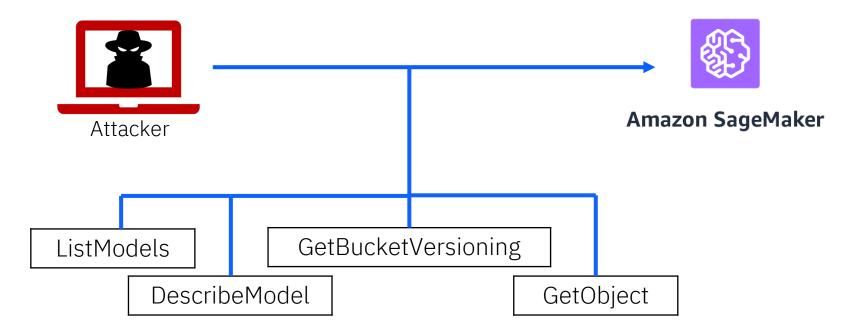
https://github.com/h4wkst3r/CloudTrail-Queries

Model Poisoning
 Model Theft
 Malicious Lifecycle Config

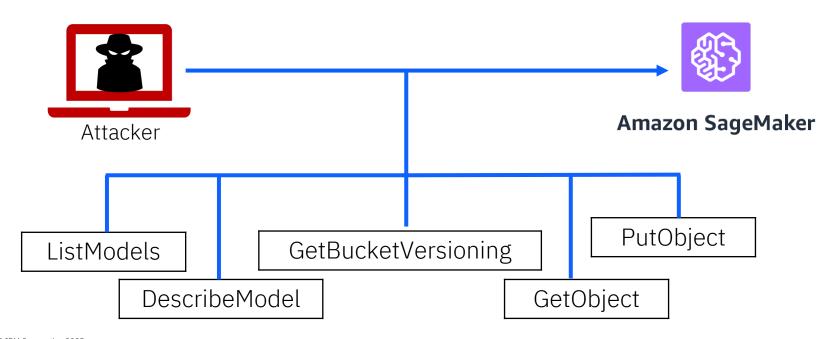
Detection Guidance – Azure ML Model Poisoning



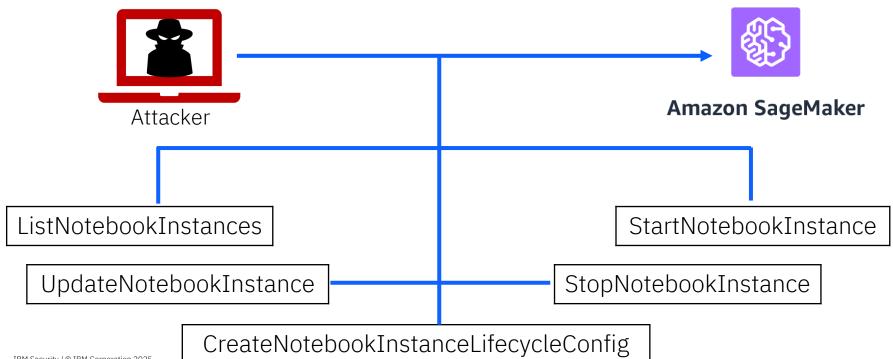
Detection Guidance – SageMaker Model Theft



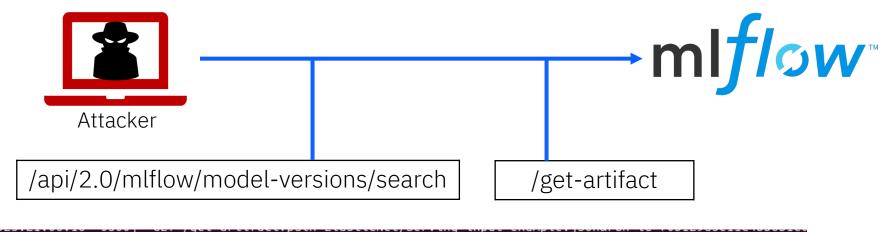
Detection Guidance – SageMaker Model Poisoning



Detection Guidance – SageMaker Malicious Lifecycle Configuration



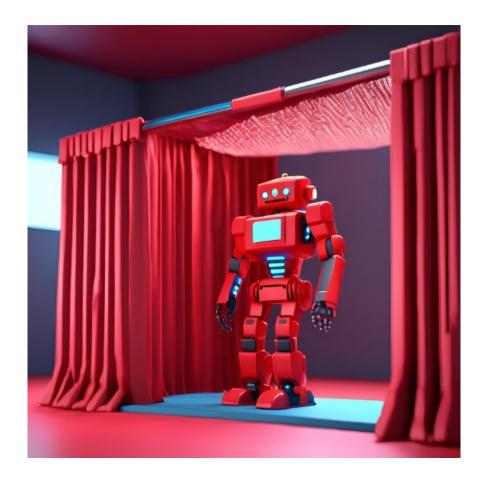
Detection Guidance – MLFlow



```
grep -i /api/2.0/mlflow/model-versions/search access.log
p/2025:20:59:42 -0500] "GET <mark>/api/2.0/mlflow/model-versions/search</mark> HTTP/1.1" 200 904 "-" "MLOKit-e977ac02118a3cb2
p/2025:20:59:42 -0500] "GET <mark>/api/2.0/mlflow/model-versions/search</mark> HTTP/1.1" 200 904 "-" "MLOKit-e977ac02118a3cb2
```

```
grep -i /get-artifact access.log
p/2025:21:05:59 -0500] "GET /get-artifact?path=ElasticNet/code/data.py&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e97
p/2025:21:06:00 -0500] "GET /get-artifact?path=ElasticNet/code/params.py&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e97
p/2025:21:06:01 -0500] "GET /get-artifact?path=ElasticNet/code/train.py&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e90
p/2025:21:06:01 -0500] "GET /get-artifact?path=ElasticNet/code/utils.py&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e90
p/2025:21:06:02 -0500] "GET /get-artifact?path=ElasticNet/conda.yaml&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e977a
p/2025:21:06:02 -0500] "GET /get-artifact?path=ElasticNet/input_example.json&run_id=f0b129a5e11c4bb6b1c0459a2f5ae7f6 HTTP/1.1" 200 0 "-" "MLOKit-e977ac
```

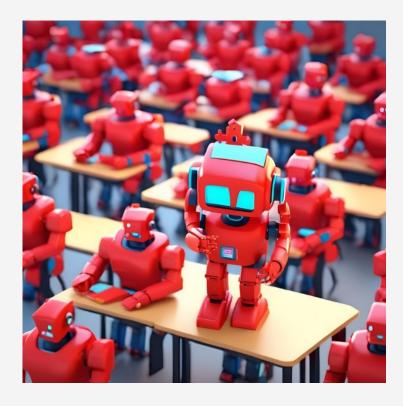
Conclusion



Conclusion

02 03 01 ML training We need to Unauthorized environments understand access to these contain highly these systems environments sensitive and could be so we can significant business critical protect them data

Questions?





Blog Post -



MLOKit Tool -



- https://twitter.com/retBandit
- https://twitter.com/h4wkst3r
- https://www.ibm.com/downloads/documents/us-en/11630e2cbc302316
- https://github.com/xforcered/MLOKit
- https://twitter.com/azarzaror
- https://web.archive.org/web/20241214000321/https:/www.panoptica.app/blog/protect-your-environment-when-working-with-amazon-sagemaker
- https://www.ibm.com/topics/mlops
- https://neptune.ai/blog/mlops-tools-platforms-landscape
- https://www.databricks.com/glossary/jupyter-notebook
- https://www.ibm.com/docs/en/z-devops-guide?topic=applications-source-code-management
- https://azure.microsoft.com/en-us/resources/cloud-computing-dictionary/what-is-cloud-computing

https://mlflow.org/docs/latest/tracking/artifacts-stores.html

- https://wandb.ai/site/articles/what-is-an-ML-model-registry/
- https://learn.microsoft.com/en-us/azure/devops/user-guide/what-is-azure-devops
- https://about.gitlab.com/
- https://github.com/
- https://aws.amazon.com/sagemaker/
- https://learn.microsoft.com/en-us/azure/machine-learning/overview-what-is-azure-machine-learning
- https://mlflow.org/
- https://docs.aws.amazon.com/sagemaker/latest/dg/model-registry.html
- https://learn.microsoft.com/en-us/azure/machine-learning/how-to-manage-models?view=azureml-api-2&tabs=cli
- https://aws.amazon.com/s3/
- https://learn.microsoft.com/en-us/azure/storage/blobs/storage-blobs-introduction
- https://www.ibm.com/services/adversary-simulation

- https://mlflow.org/docs/latest/rest-api.html
- https://learn.microsoft.com/en-us/azure/devops/organizations/accounts/use-personal-access-tokens-to-authenticate?view=azure-devops&tabs=Windows
- https://mlflow.org/docs/latest/projects.html
- https://github.com/xforcered/ADOKit
- https://aws.amazon.com/blogs/machine-learning/build-an-end-to-end-mlops-pipeline-using-amazon-sagemaker-pipelines-github-and-github-actions/
- https://docs.aws.amazon.com/IAM/latest/UserGuide/security-creds.html
- https://docs.aws.amazon.com/sagemaker/latest/dg/security-iam-awsmanpol.html
- https://docs.aws.amazon.com/sagemaker/latest/dg/nbi.html
- https://docs.aws.amazon.com/sagemaker/latest/dg/notebook-lifecycle-config.html
- https://docs.aws.amazon.com/AmazonS3/latest/userguide/security-iam-awsmanpol.html
- https://jfrog.com/blog/from-mlops-to-mloops-exposing-the-attack-surface-of-machine-learning-platforms/

- https://docs.python.org/3/library/pickle.html
- https://gist.githubusercontent.com/h4wkst3r/2c30a3d39e20b7cd8606211ba3132d85/raw/e4e253b052f5b916134409fc b61b91c49b91d912/CreatePickle.py
- https://github.com/coldwaterq/MaliciousPickles
- https://github.com/moohax/Charcuterie
- https://github.com/trailofbits/fickling
- https://github.com/hiddenlayerai/HiddenPickle
- https://docs.aws.amazon.com/sagemaker/latest/dg/how-it-works-deployment.html
- https://www.microsoft.com/en-us/security/blog/2025/02/13/storm-2372-conducts-device-code-phishing-campaign/
- https://learn.microsoft.com/en-us/entra/identity-platform/access-tokens
- https://learn.microsoft.com/en-us/rest/api/azureml/
- https://learn.microsoft.com/en-us/azure/machine-learning/concept-workspace?view=azureml-api-2

https://docs.gunicorn.org/en/stable/settings.html

- https://learn.microsoft.com/en-us/microsoft-365/enterprise/subscriptions-licenses-accounts-and-tenants-for-microsoft-cloud-offerings?view=o365-worldwide
- https://learn.microsoft.com/en-us/azure/machine-learning/concept-data?view=azureml-api-2
- https://learn.microsoft.com/en-us/azure/machine-learning/concept-endpoints?view=azureml-api-2
- https://blog.gitguardian.com/how-to-handle-secrets-in-jupyter-notebooks/
- https://medium.com/@techlatest.net/security-best-practices-for-ai-ml-in-jupyter-notebooks-a-blog-post-on-the-security-best-practices-c0e0659cfccb
- https://github.com/h4wkst3r/KQL-Queries
- https://github.com/h4wkst3r/CloudTrail-Queries
- http://www.ibm.com/downloads/documents/us-en/11630e2cbc302316
- https://github.com/aws-samples/aws-customer-playbook-framework/blob/main/docs/Responding to SageMaker.md
- https://aws.amazon.com/blogs/machine-learning/securing-mlflow-in-aws-fine-grained-access-control-with-aws-native-services/

- https://learn.microsoft.com/en-us/azure/storage/blobs/monitor-blob-storage?tabs=azure-portal
- https://learn.microsoft.com/en-us/azure/machine-learning/monitor-azure-machine-learning?view=azureml-api-2
- https://github.com/h4wkst3r/KQL-Queries/blob/main/AzureML/AzureMLModelPoisoning.kql
- https://github.com/h4wkst3r/CloudTrail-Queries/blob/main/SageMakerModelTheft.sql
- https://github.com/h4wkst3r/CloudTrail-Queries/blob/main/SageMakerModelPoisoning.sql
- https://github.com/h4wkst3r/CloudTrail-Queries/blob/main/SageMakerMaliciousLifecycleConfig.sql
- https://www.ibm.com/think/x-force/becoming-the-trainer-attacking-ml-training-infrastructure