CSC 116: Al for Malicious Analysis

Protecting Hospitals from Cyber Threats

UNIVERSITY OF MIAMI



March 3, 2025

IMPORTANT:

Text Message Scams (SMS-Phishing) Targeting the University Community

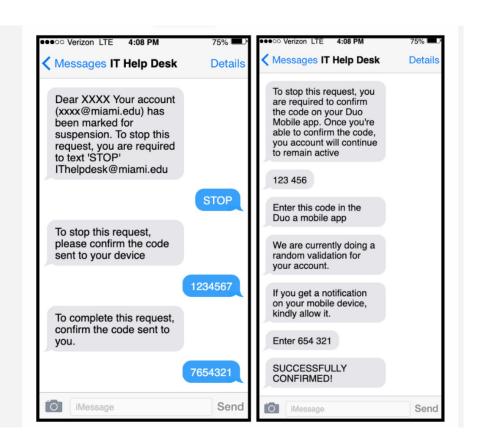
Dear University Community,

We wanted to share important information about a recent text message scam (SMS-Phishing) that has recently surfaced within our University community. It is important to remain vigilant, as these fraudulent messages create a false sense of urgency and may trick you into providing personal information.

As a reminder, the University will **never** ask you to provide sensitive information via direct phone call, text, email, and/or online form. Also, remember to **never** provide MFA access codes to anyone requesting them.

Real Attack Case Study

- Fake email from 'IT Support'.
- Result: Student records stolen.



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Why are Hospitals Under Attack?

- Healthcare data is highly valuable.
- Example: Ransomware shutting down ICU operations.

MAJOR FLORIDA HOSPITAL SHUTS DOWN NETWORKS, RANSOMWARE ATTACK SUSPECTED



A major hospital in Florida had to shut down some of its systems and turn patients away after a ransomware attack disrupted its IT infrastructure. "Hospitals and healthcare organizations are particularly attractive targets for cyber-criminals, and their reliance on technology to manage everything from patient records to surgical equipment makes them uniquely vulnerable. This is compounded by their limited resources to invest in cybersecurity measures," stated Jan Lovmand, BullWall CTO.

What Happens Without AI?

- Manual detection is slow.
- Threats are missed.
- Patient care may under suffer.

How AI Supports?

 Al scans emails, logins, and even prescriptions in seconds.

What is AI?

- Al: Artificial Intelligence.
- Example: Detecting abnormal prescriptions.

Human vs. Al Detection

- Humans: Limited time.
- AI: Fast, consistent, 24/7.

Al in Action

Phishing Email → AI flags → IT reviews →
Threat stopped.

Why AI in Hospitals?

- Faster Diagnosis: Al helps analyze medical images, lab results, and patient history quickly and accurately.
- **Predictive Analytics**: Al can forecast patient outcomes, readmission risks, and disease progression.
- Personalized Treatment Plans: Al tailors care based on patient data, genetics, and treatment history.
- Virtual Assistants: Al chatbots provide 24/7 support to patients for queries, follow-ups, or reminders.
- etc.

Malicious Activities in Healthcare

 Phishing, fake orders, unauthorized access, etc.

What are the major risks of a cybersecurity attack?

Healthcare organizations are particularly vulnerable and targeted by cyberattacks because they possess vast amounts of high monetary and intelligence information, which is valuable to cyber thieves and nation-state actors.

About 106 million individuals were affected by cyberattacks involving healthcare organizations in 2023, said John Riggi, national advisor for cybersecurity for the American Hospital Association (AHA).

Cyberattacks on EHR and other systems can take health systems offline, leading to disruption of care due to software outages. Not only do you risk **patient privacy** and access to important medical records, but you also deter your ability to care for your patients, keep them safe, and provide necessary medication. In turn, this may cause you to lose credibility and patient loyalty.

Phishing Email Example

Fake request for login details from 'hospital IT'.

Unauthorized Access Case

Login from unusual locations or other devices.

Fake Doctor Orders

Fraudulent requests for medication changes.

Patient Record Theft

Sensitive data stolen and sold.

Impact of Malware

System lockdowns delaying patient care.

Backups~~~!

Insider Threat Example

- Employee leaking records.
- using blockchain for recording all the data query/download history

How IT Can Help

- Report suspicious activity.
 But it is hard, because we are humans, we are too slow.
- Block malicious accounts
- Security Course Training

DEMO 1: Phishing Email Detection

• **BERT Model**: Bidirectional Encoder Representations from Transformers (you don't need to memorize this – just think of it as a smart Al language reader).

BERT is an **AI model that understands language**, just like how humans read and understand sentences. It helps computers "read between the lines", understand meaning, context, and even medical terms in documents or messages.

How is BERT used in hospitals?

- Helps read medical records quickly and extract key info like symptoms, diagnoses, or medications.
- **Sorts through thousands of documents** to find the right information for doctors and nurses.
- Understands patient messages in chatbots or digital forms and sends them to the right department.
- Assists in clinical decision support systems, by reading guidelines and matching them to patient data.

Real-world example for nurses:

A patient types: "I feel dizzy after taking the medication."

- A regular computer might just focus on "dizzy."
- BERT understands the full meaning and realizes that the medication could be the cause, helping systems alert a nurse or doctor.

Research Demo

 https://www.splunk.com/en_us/blog/security /deep-learning-in-security-text-based-phishing -email-detection-with-bert-model.html

Discussion

Would you trust this AI?

Al may fail but if it is high accuracy, e.g., 99%, it is trusted.

If the model accuracy is 90%, then, the result may be wrong.

DEMO 2: Suspicious Login Detection

 A "Suspicious Login Detection" model is a machine learning algorithm designed to identify and flag potential unauthorized login attempts by analyzing user behavior patterns like location, device, login frequency, time of day, and other relevant data, flagging anomalies that deviate significantly from a user's typical login activity, potentially indicating a malicious attempt to access an account.

How to Improve?

Feedback loop with human review.

Human-in-the-loop feedback

Very slow as well!

Imagine you always check in to your hospital system from Miami at 9 AM using your laptop. But suddenly there's a login from **New York** at 3 AM using a different device. Even if the password is correct, the system thinks: "Hmm, that's unusual!"

User	Login Time	Location	Device	Is Suspicious?
Nurse Amy	09:00 AM	Miami	Laptop	× No
Nurse Amy	03:10 AM	New York	Tablet	✓ Yes
Nurse Tom	10:30 AM	Miami	Desktop	× No
Nurse Amy	09:05 AM	Miami	Laptop	× No

Model Selections

1. You have labeled data (normal vs suspicious)

Random Forest or XGBoost

Very effective for classification tasks, fast, interpretable, and performs well on (time, location, device, etc).

- 2. You don't have labels, just want to detect unusual behavior **Isolation Forest** or Autoencoder Great for detecting anomalies without prior examples of "suspicious" cases.
- 3. You want to capture user behavior over time (sequences) **LSTM** (Long Short-Term Memory)

 Good at modeling login sequences, e.g., how often someone logs in, changes in patterns over days.
- 4. You want real-time detection with speed **Logistic Regression** or **Isolation Forest** Fast and lightweight for live systems.

DEMO 3: Fake Prescription Detection

Spotting forged prescriptions.

Using BERT / Transformer / or LLMs



the most famous one

https://arxiv.org/pdf/1706.03762

"attention is all you need"

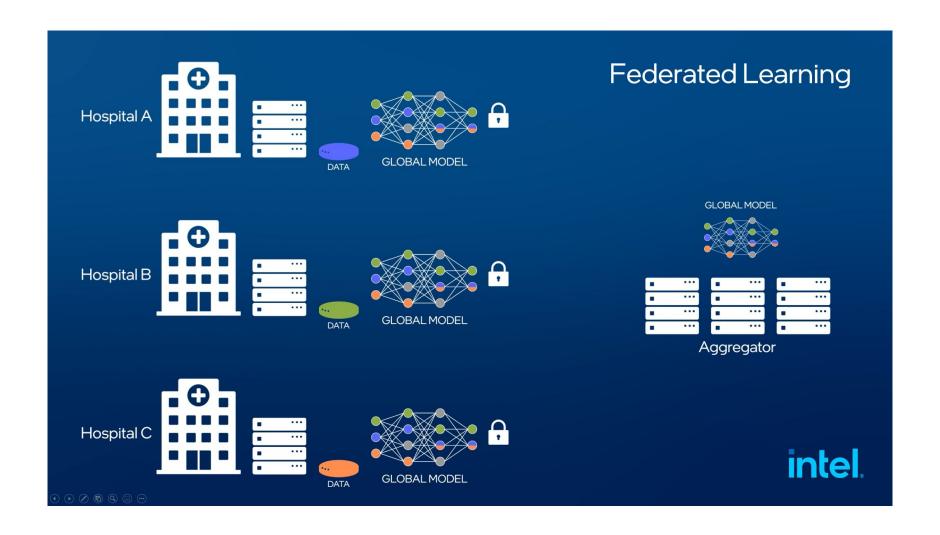


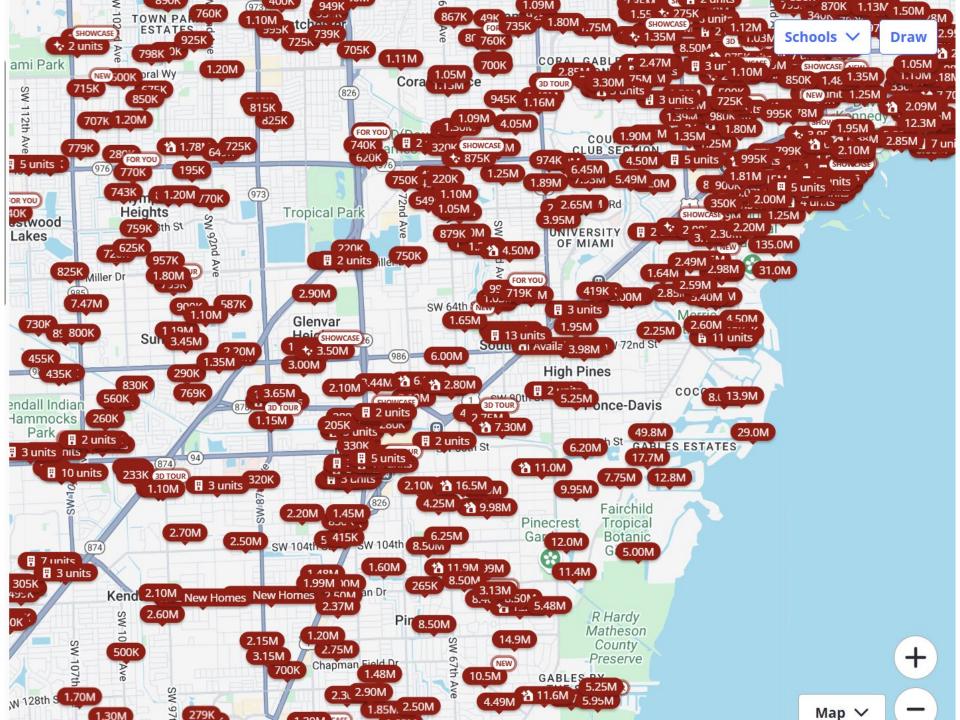
Using AI for detecting malicious behaviors



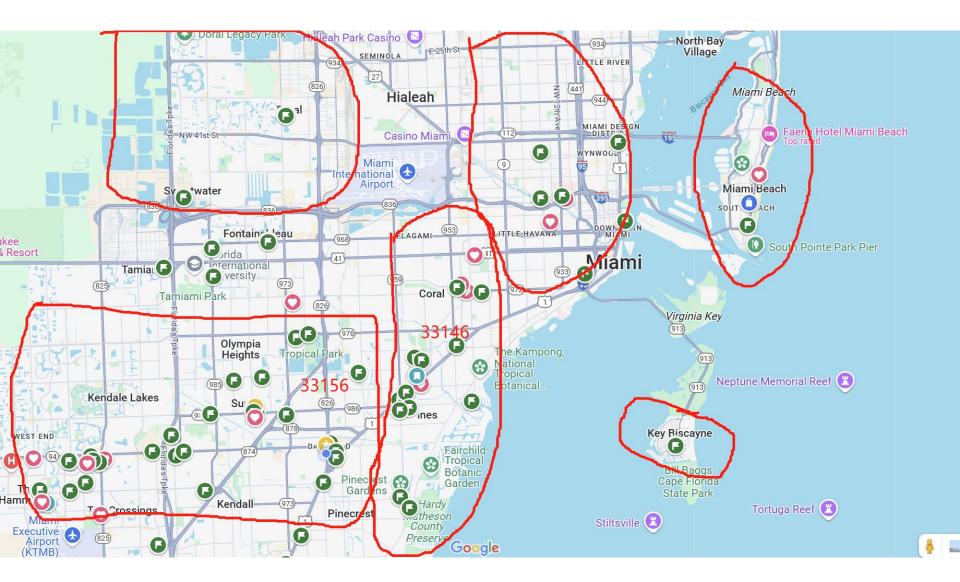
Malicious attacks in Al models

Federated Learning



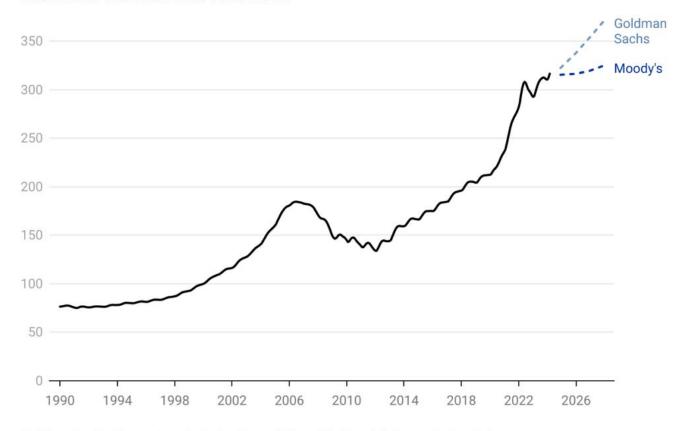


Classification Model



Where Goldman Sachs' and Moody's forecast models expect U.S. home prices to go in 2024, 2025, 2026, and 2027

Case-Shiller National Home Price Index



Goldman Sachs' forecast projects for Case-Shiller, while Moody's forecasts for their own repeat sales index.

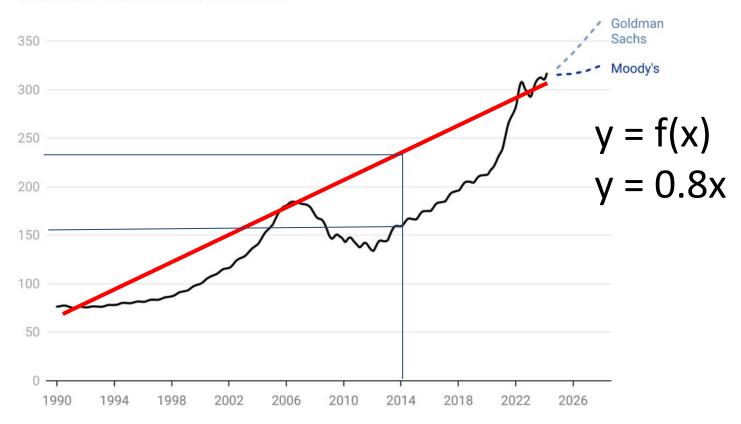
Chart: Lance Lambert • Created with Datawrapper



Only by the years

Where Goldman Sachs' and Moody's forecast models expect U.S. home prices to go in 2024, 2025, 2026, and 2027

Case-Shiller National Home Price Index



Goldman Sachs' forecast projects for Case-Shiller, while Moody's forecasts for their own repeat sales index.

Chart: Lance Lambert • Created with Datawrapper



Only by the years

Linear Regression Model

Conclusion:

Building model is a way to find the best answer to your question.

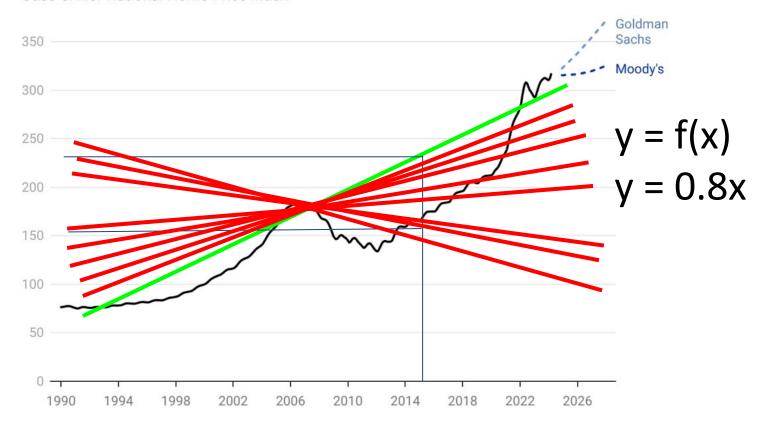
Gradient descent is experience when model training



You want to give an injection to a patient, but you're new and unsure about the best spot to do it.

Where Goldman Sachs' and Moody's forecast models expect U.S. home prices to go in 2024, 2025, 2026, and 2027

Case-Shiller National Home Price Index

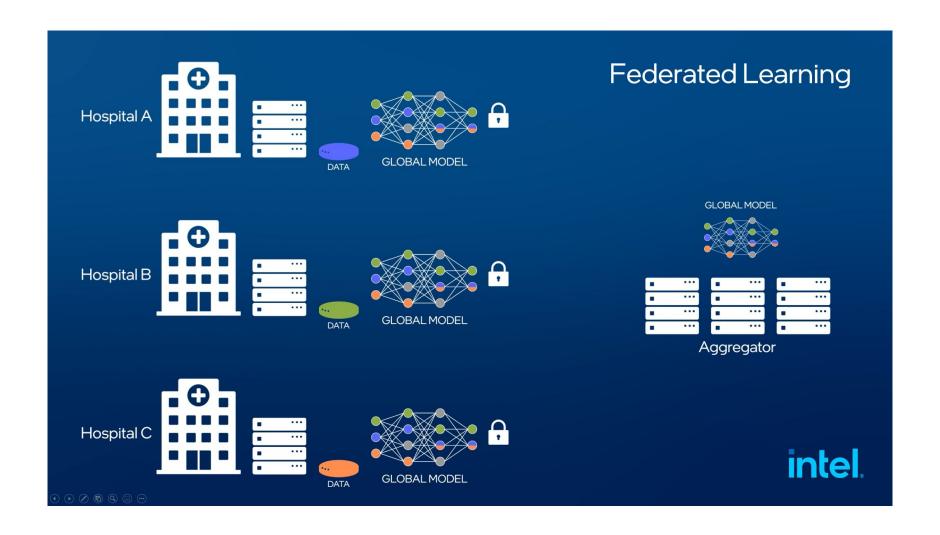


Goldman Sachs' forecast projects for Case-Shiller, while Moody's forecasts for their own repeat sales index.

Chart: Lance Lambert · Created with Datawrapper



Federated Learning



1 Polishing attack: data preparation phase

A "polishing attack" is a type of phishing attack that uses targeted, personalized messages to trick a specific individual or organization into revealing sensitive information or clicking malicious links.

Polishing attack

Scenario: Healthcare Records Manipulation

Imagine a hospital's medical records database secured by an anomaly detection system that flags large, abrupt data changes as suspicious. An attacker aiming to manipulate patient medication records—perhaps to obtain fraudulent prescriptions—realizes direct manipulation would quickly trigger alerts.

Instead, they use a **polishing attack**, making minor, incremental adjustments over several days or weeks.

2. Patient data leakage: Data Preparation Phase

Solution: **De-Indentified**

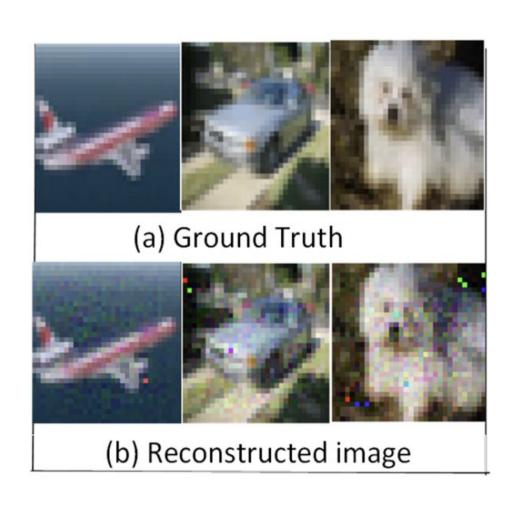
Mayo Clinic



They removed all the names, zip, SSN, address, etc.

The data can not leave the platform

3. Gradient Attack: Gradient Transmission Phase



Differential Privacy: add noises into the gradients

LLMs for model building

can you build a model for me

Absolutely! I'd be happy to help build a model for you. Could you please specify:

- 1. What type of model do you need? (e.g., machine learning, deep learning, regression, classification, predictive, clustering)
- 2. What's your dataset like? (Please share details or upload if available.)
- 3. What problem are you trying to solve or predict?
- 4. Which programming language or framework would you prefer? (e.g., Python with TensorFlow, PyTorch, Scikit-learn)
- 5. Do you have any specific performance or accuracy requirements?

Providing these details will help me tailor the model exactly to your needs.

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Cursor - The Al Code Editor

Build software faster · Frontier Intelligence. Powered by a mix of purpose-built and frontier models, Cursor is smart and fast. · Feels Familiar. Import all ...

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Blog	>		
Iterating with Shadow Workspaces. Hidden windows and kernel	,		



Cursor

Software:

Cursor is an Al-powered integrated development environment for Windows, macOS and Linux designed to enhance developer productivity by integrating advanced artificial intelligence features directly into the coding environment.

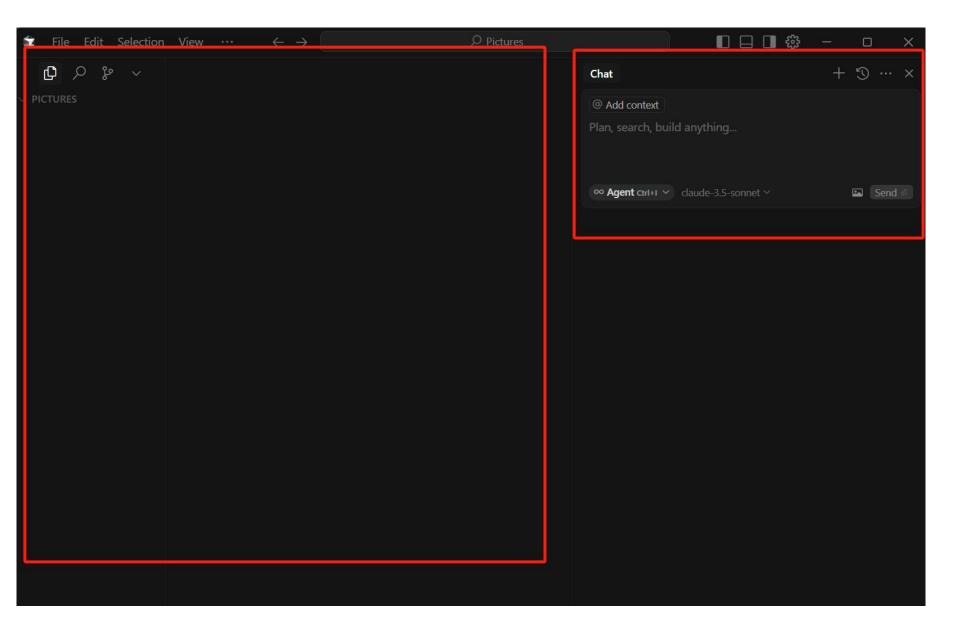
Source: Wikipedia

Initial release date: 2023

Developer(s): Anysphere Inc

People also search for

Cursor - can write papers, latex



AutoKeras

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Benchmarks

About



AutoKeras: An AutoML system based on Keras. It is developed by DATA Lab at Texas A&M University. The goal of AutoKeras is to make machine learning accessible to everyone.

Learning resources

· A short example.

```
import autokeras as ak

clf = ak.ImageClassifier()
clf.fit(x_train, y_train)
results = clf.predict(x_test)
```

- · Official website tutorials.
- The book of Automated Machine Learning in Action.
- The LiveProjects of Image Classification with AutoKeras.





Table of contents

Learning resources

Installation

Community

Contributing Code

Cite this work

Acknowledgements

Terms:

Model: A program trained to recognize patterns in data.

Training: The process of teaching the model using data.

Feature: Input variables used by the model to learn.

Accuracy: How often the model predicts correctly.

Thanks