

## Deep Dive: Threat modeling for Artificial Intelligence & Machine Learning



ITER SOFTWARE SECURITY DEVOPS BUSINESS PERSONAL TECH SCIENCE

### Security

Softbank's 'Pepper' robot is a security joke

Big-in-Japan 'bot offers root access through hardcoded password and worse bugs too

By Richard Chirgwin 29 May 2018 at 00:29 56 🖵 SHARE 🔻



Softbank's popular anthropomorphic robot, Pepper, has myriad security holes according to research published by Scandinavian researchers earlier this month

/venturebeat.com/2018/05/21/india-wants-to-use-ai-in-weapons-svs

f 🌶 in F 🗟 Search V R NEWS V EVENTS V RESEARCH V India wants to use AI in weapons systems KYLE WIGGERS @KYLE L WIGGERS MAY 21, 2018 11:25 AM in Apple release ill relaunch like this Ra ge/Aveng coming Events Transform: The A India will enlist the help of artificial intelligence to develop weapons, defense, growth marketers. and surveillance systems, government officials announced today. VB Summit: The be

"The world is moving towards an artificial intelligence-driven ecosystem," Dr. Ajay Kumar, secretary at the defense ministry, said in a statement. "India is also taking necessary steps to prepare our defense forces for the war of the future."

### Amazon Business Technolog Amazon's Alexa recorded and shared a conversation without consent, report says



A Portland woman said an Amazon device recorded a conversation in

her home without her consent, and shipped the file to someone in her contact list, KIRO-TV reported By Matt Day

Share story

only executive even



Hackers are feared to have swiped sensitive personal information held by two of the best known companies in the US - after malware infected a customer support software maker.

REUTERS World Business Markets Politics TV

### This is No To The Argame.

**Cambridge Analytica and British parent** shut down after Facebook scandal alues Reuters Staff 4 MIN READ · Google confirmed that it has a contract with the Department of Defens nvolving AI technology and drones, but has declined to go into detail. oogle said the technology is being used for "non-offensive" uses. Google has long avoided being part of the military industrial complex, to the point where it seems to have been an unofficial company policy · The news that Google was working with the DoD reportedly upset many of the company's employees





### **Artificial Intelligence: Commission Outlines a European Approach to Boost** Investment and Set Ethical Guidelines





Investigation into the July data breach incident at Singapore's largest healthcare provider has revealed that local administrators made several critical mistakes that led to the breach, including the use of weak passwords and unpatched software.



Poor 'p@ssword' hygiene and unpatched systems led to cybersecurity breach... securityboulevard.com

## Which of you wants to be the Adminstrator?

11:26 AM · Sep 24, 2018

## Al must be Secure and Protect Privacy

Can we protect customers and their AI solutions – services, tools, and infrastructure? Can we help them protect their customer's and employee's personal data?

Can we protect data scientists, and their AI data?

Can we help them avoid costly mistakes and oversights?

Can we protect developers, and their Al applications?

Can we help them meet their regulatory obligations?

### Master Class of Manipulations

- Minimize human recognition of "evidence of manipulation" and maximize the negative impact on the classifier.
  - Injection of random noise at random levels & locations
  - Removal of color from images via sepia filters.
  - Modification of hue and saturation for random blocks/locations in an image.

### Hackathon 2018: Hide in Plain Sight



## How easy was it?

- Subtle modification of input data can be used to force mis-classification without warning or failure indication of any kind.
- Trust is largely misplaced in uncurated, unsigned, public-access data sources.
- Machine learning algorithms lack the ability to monitor their own training progress or reject inputs which would compromise or degrade the effectiveness of future analysis.



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# Noise – whole image and random partial



Original Classification: ox (score = 0.89517) water buffalo, water ox, Asiatic buffalo, Bubalus bubalis (score = 0.05105) oxcart (score = 0.00753) bison (score = 0.00357) sorrel (score = 0.00052)



Manipulated Image (30% noise): Indian elephant, Elephas maximus (score = 0.19209) hog, pig, grunter, squealer, Sus scrofa (score = 0.15600) ox (score = 0.04219) African elephant, Loxodonta africana (score = 0.03333) bison (score = 0.02342)



Original Classification: **beagle (score = 0.78377)** English foxhound (score = 0.04376) basset, basset hound (score = 0.02375) Walker hound, Walker foxhound (score = 0.01258) bloodhound, sleuthhound (score = 0.00375)

Manipulated Image: jaguar, panther, Panthera onca, Felis onca (score = 0.11067) English foxhound (score = 0.02110) bull mastiff (score = 0.02049) Walker hound, Walker foxhound (score = 0.01989) beagle (score = 0.01631)

## Effectiveness of subtle manipulations



sepia (manipulated) image: sundial (score = 0.68659) warplane, military plane (score = 0.04613) wing (score = 0.03205) snowplow, snowplough (score = 0.02640) plow, plough (score = 0.02189)



warplane, military plane (score = 0.93798 missile (score = 0.01181) projectile, missile (score = 0.01054) wing (score = 0.00981) space shuttle (score = 0.00462)



Original Classification: street sign (score = 0.96099) traffic light, traffic signal, stoplight (score = 0.00397)



Sepia (manipulated) Image: street sign (score = 0.67787) mailbox, letter box (score = 0.06781)

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## Build upon the Details: Security Best Practices

## Build upon established security recommended practices:

- Use **Threat Modeling** and applying standard security controls.
- Extend your threat modeling to include specific use scenarios *outside* of the traditional technical use cases.
- Threat modeling for voice, video, and gesturedriven user experiences.
- SDL is necessary; however, you will need to go beyond these standards and controls to address new paradigms.

What is your AI's specific use scenario?

What are your assumptions about the AI interactions, the user's interactions, and an Attacker's interactions?

How do you Assure Provenance and Curate Lineage with Discretion?

How do you plan to operate, monitor and control your AI systems' plans and actions in response to observations and commands?

# Understand the business purposes & problems at hand.

Make sure AI solves the problems— Do not build AI just for sake of building AI.

- Seek agreement with the customer on what the AI will predict.
- Discuss what risks the customer may have when the AI predicts wrong.
- Identify who, and what could potentially abuse the system, and why.

## Understand geopolitical & industry regulations

- Plan for regulatory requirements while designing an Al Solution
- Understand the impact of the AI uses, misuses, and actions to the human being.
- Consider and address requirements for regulatory compliance.

## Clear Business Purpose Aligned with Microsoft Al ethics principles

It is important that the AI Solution will be built upon an ethical foundation. The AI Solution must assist humanity and should be designed to address ethics principles.

### Our approach - Microsoft Al

https://www.microsoft.com/en-us/Al/our-approach-to-ai

### Fairness

Al systems should treat all people fairly

### Inclusiveness

AI systems should empower everyone and engage people

Reliability & Safety

AI systems should perform reliably and safely

### Transparency

Al systems should be understandable **Privacy & Security** Al systems should be secure and respect privacy **Accountability** Al systems should have algorithmic accountability