# JARVIS NEVER SAW IT COMING Hacking machine learning (ML) in speech, text and face recognition – and frankly, everywhere else

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No Horses, Flamingos, Hedgehogs, Turtles or sentient<sup>\*</sup> Al models were harmed during the making of this presentation

\* We hope

\$ ID



#### **Guy Barnhart-Magen**

@barnhartguy

BSidesTLV Co-founder and CTF Lead

@acaltum

#### **Ezra Caltum**

@acaltum

**BSidesTLV Co-Founder** 

DC9723 Lead



@barnhartguy

BOSIDES LIQUES 9723

### **BUILDING ON THE SHOULDERS OF GIANTS**



@barnhartguy

@acaltum

https://www.deviantart.com/callyste/art/Rocket-Raccoon-and-Groot-485953724

#### **HOW DID WE GET HERE?**



#### WHAT CAN YOU EXPECT?

What are we going to talk about

#### WHAT CAN YOU EXPECT?

What are we going to talk about

What you should be paying attention to

#### WHAT CAN YOU EXPECT?

What are we going to talk about

What you should be paying attention to

What we are **not** going to talk about

#### **CLEVER HANS**

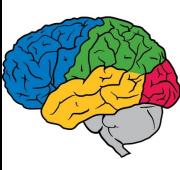


https://github.com/tensorflow/cleverhans

https://upload.wikimedia.org/wikipedia/commons/e/e3/CleverHans.jpg

# "We have reached the point where machine learning works, but may easily be broken"

Nicolas Papernot, Google PhD Fellow in Security Ian Goodfellow, Research scientist at Google Brain



http://www.cleverhans.io/security/privacy/ml/2016/12/15/breaking-things-is-easy.html https://pbs.twimg.com/profile\_images/799327801388077057/HcDnA1H7\_400x400.jpg

@barnhartguy

@acaltum

## **SOME BACKGROUND**

#### **ARTIFICIAL INTELLIGENCE?**

#### **Machine Learning**

Study many images labeled as flamingo Identify the flamingo in the image

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https://upload.wikimedia.org/wikipedia/commons/b/ba/Alice\_par\_John\_Tenniel\_30.png

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#### **ARTIFICIAL INTELLIGENCE?**

**Machine Learning** 

Study many images labeled as flamingo Identify the flamingo in the image

**Deep Learning** 

@barnhartguy

Study many images Identify the flamingo, hedgehog, etc.

@acaltum



#### **ARTIFICIAL INTELLIGENCE?**

#### **Machine Learning**

Study many images labeled as flamingo Identify the flamingo in the image

#### Deep Learning

Study many images Identify the flamingo, hedgehog, etc. Artificial Intelligence

#### Artificial intelligence

Is she hugging the flamingo, or playing cricket?

Is she happy, sad?



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#### @acaltum

# EVERYBODY EXCHANGES "AI" AND "ML"

So do I

Sorry

#### **"INTELLIGENT" SYSTEM**

Most AI systems were designed to solve a specific problem, well.



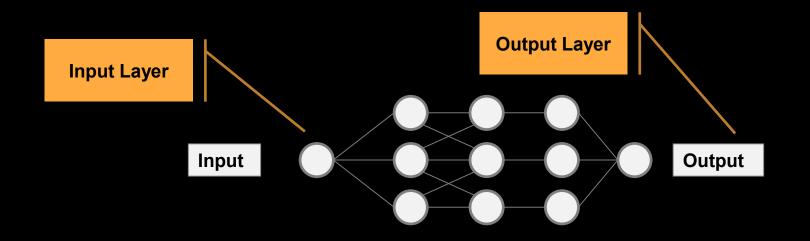
https://www.reactiongifs.us/wp-content/uploads/2015/02/do\_the\_robot\_futurama.gif

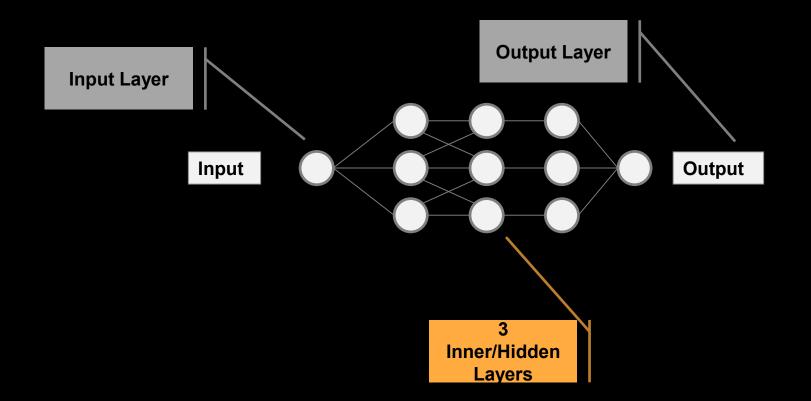
@barnhartguy

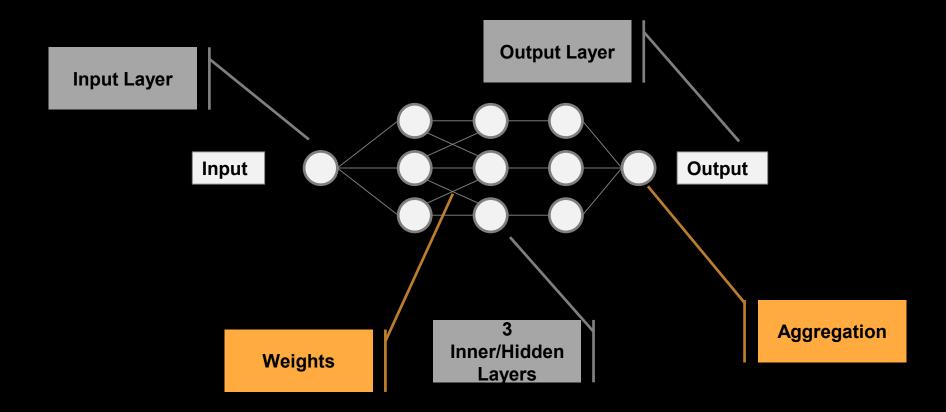
@acaltum

## **MACHINE LEARNING 101**









# Input Output

- Training: Iterative process to adjust weights
- The "model" includes:
  - Topology/Layout
  - Weights/Parameters
  - Functions
- This is the real IP (Intellectual Property) in the system!

#### LINEAR ALGEBRA, ANYONE?

#### Definition [edit]

If **A** is an  $n \times m$  matrix and **B** is an  $m \times p$  matrix,

$$\mathbf{A} = egin{pmatrix} a_{11} & a_{12} & \cdots & a_{1m} \ a_{21} & a_{22} & \cdots & a_{2m} \ dots & dots & \ddots & dots \ a_{n1} & a_{n2} & \cdots & a_{nm} \end{pmatrix}, \quad \mathbf{B} = egin{pmatrix} b_{11} & b_{12} & \cdots & b_{1p} \ b_{21} & b_{22} & \cdots & b_{2p} \ dots & dots$$

the matrix product C = AB (denoted without multiplication signs or dots) is defined to be the  $n \times p$  matrix

$$\mathbf{C} = egin{pmatrix} c_{11} & c_{12} & \cdots & c_{1p} \ c_{21} & c_{22} & \cdots & c_{2p} \ dots & dots & \ddots & dots \ c_{n1} & c_{n2} & \cdots & c_{np} \end{pmatrix}$$

such that

@acaltum

<u>@b</u>arnhartguy

$$c_{ij} = a_{i1}b_{1j} + \dots + a_{im}b_{mj} = \sum_{k=1}^m a_{ik}b_{kj},$$
 for  $i=1,...,n$  and  $j=1,...,p.$ 

https://en.wikipedia.org/wiki/Matrix\_multiplication

#### **NOW SERIOUSLY**

When multiplying one matrix with another, you get a new matrix

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- The values are the product of the rows and columns of these matrices

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- The values are the product of the rows and columns of these matrices
- A vector is a single dimensioned matrix, so an array is a vector, and a matrix is a two dimensional array

#### **CODE POINT OF VIEW**

int16 vector = [];

# struct weights { int rows; int cols; double \*\*data; };

# **TOO MUCH VOODOO!**



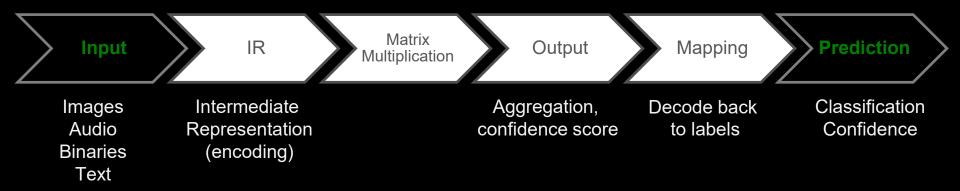
Images Audio Binaries Text

51~f\*9\>71rB



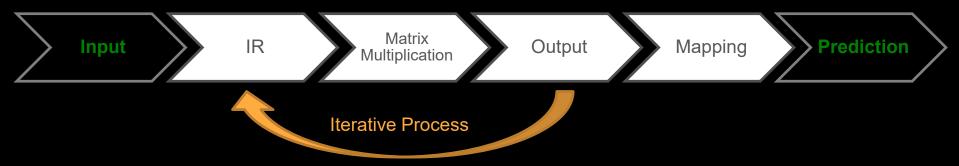
Classification Confidence

# NOTTOO MUCH VOODOO!



#### **FROM TRAINING TO INFERENCE**

Training

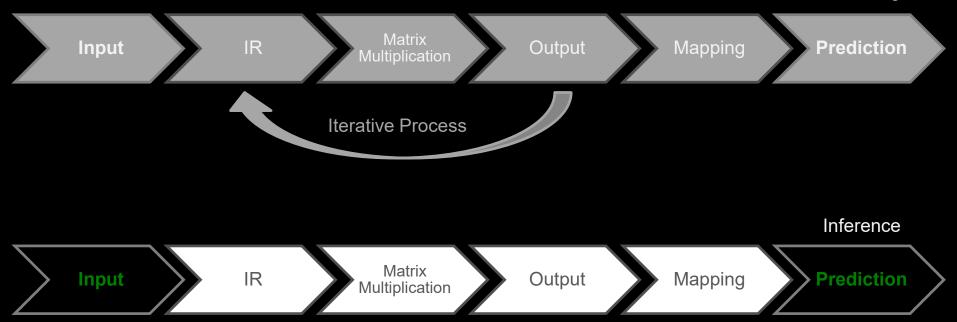


@barnhartguy Les Contraction

@acaltum

#### FROM TRAINING TO INFERENCE

Training



## MODEL != CODE



Code execution flow

#### **ML MODEL**

Math operations, transition functions

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EXECUTABLE

Code execution flow

**Data Structures** 

#### **ML MODEL**

Math operations, transition functions

Intermediate Representation

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EXECUTABLE

Code execution flow

Data Structures

Code Review or Reverse Engineering

### **ML MODEL**

Math operations, transition functions

Intermediate Representation

Model structure (Black Magic)

@barnhartguy E)

@acaltum

#### **\$ HEXDUMP /MODELS/RESNET**

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But... How do you take a look at the code?



But... How do you take a look at the code?

We could still be better at traditional software code reviews

#### VALIDATION

But... How do you take a look at the code?

We could still be better at traditional software code reviews

What is your code here exactly?

#### VALIDATION

But... How do you take a look at the code?

We could still be better at traditional software code reviews

What is your code here exactly?

How do you understand/review the matrix?

#### **FUN FACTS!**

The model (matrices) can be GB in size Machine learning predicts the future based on the past The algorithm is designed to optimize for the "strongest signal"

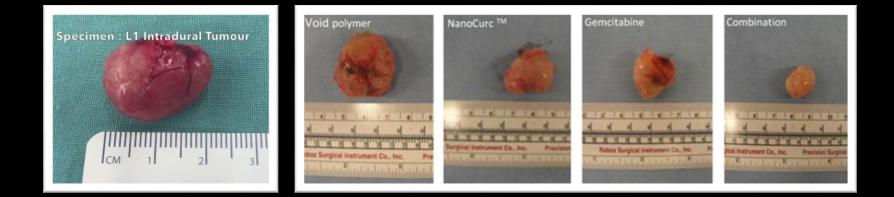
Bias is a part of the system learning process

#### **BIAS - SOLVING THE WRONG PROBLEM**

That said, they learned that the algorithm could be fooled in unexpected ways. "For example, if we had a ruler in the image, the algorithm was much more likely to call it malignant," he noted. "Why is that? Because on average, in our data-set, lesions with rulers were being measured and monitored by dermatologists, and were more likely to be malignant. The algorithm is looking at the whole image and will take whatever clues it can find. It can be biased by features like the ruler, and you won't know it." Another image that might trip up the algorithm would be that of an unusual combination like a benign nevus colliding with a seborrheic keratosis, which could closely mimic a melanoma, "but you may not know that until you've collected a lot of those images."

#### **BIAS - SOLVING THE WRONG PROBLEM**

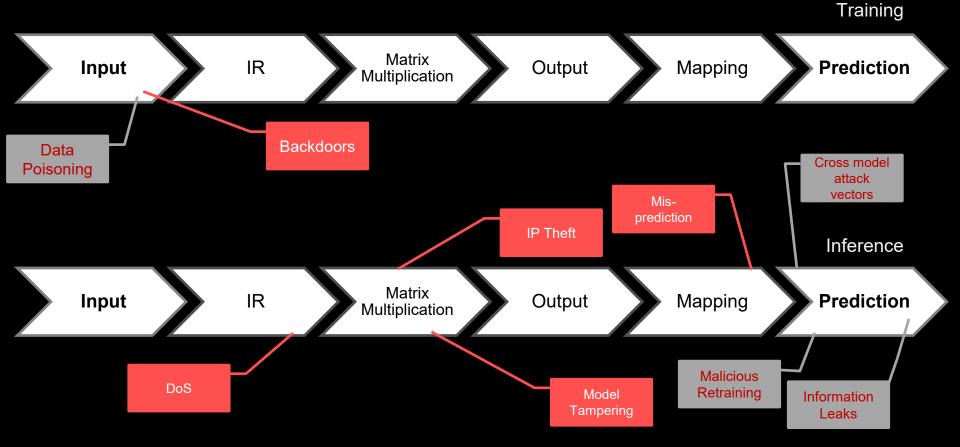
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### SCORING

# We used the CVSS 3.0 scoring, and ordered by business impact

#### FROM TRAINING TO INFERENCE



### **TOP 5 ATTACKS (CVSS)**

- 1 DoS
- 2 Misprediction (adversarial attacks)
- 3 Model Tampering
- 4 IP Theft
- 5 Backdoors

7.5 (High)
7.5 (High)
7.4 (High)
5.9 (Medium)
3.9 (Low)

#### **TOP 5 ATTACKS (BUSINESS IMPACT)**

- 1 IP Theft
- 2 Model Tampering
- 3 DoS
- 4 Backdoors
- 5 Misprediction (Adversarial attacks)

5.9 (Medium)
7.4 (High)
7.5 (High)
3.9 (Low)
7.5 (High)

### HOW TO BUILD AN ATTACK

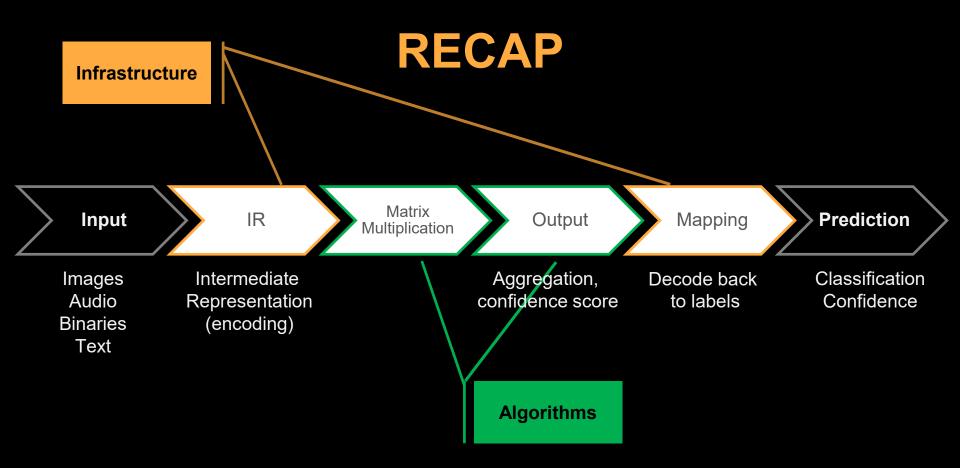
What do you need to know?

What areas should you target?

What do you need to have access to?

#### WHERE TO ATTACK?

You can either go after the system infrastructure, or the algorithms





ML needs to convert the input into a matrix



ML needs to convert the input into a matrix

Parsing is hard



ML needs to convert the input into a matrix

Parsing is hard

Al developers don't develop file formats. Or parsers.

#### PARSING

ML needs to convert the input into a matrix

Parsing is hard

Al developers don't develop file formats. Or parsers.

The common solution is to just bring the dependency into the project

#### DEPENDENCIES

#### So – they are bringing outside libraries into their stack

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And bringing with them a common problem – supply chain and patch management

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A common framework, must support multiple file formats...



## What to focus on?Why focus here?Issues?CaffeFull coverageExtremely slow



What to focus on?Why focus here?CaffeFull coverageOpenCVLimited coverage

Issues? Extremely slow Medium speed

@barnhartguy

@acaltum



What to focus on? Why focus here? Caffe OpenCV LibXXX

Full coverage Limited coverage Very fast

**Issues**? Extremely slow Medium speed Unknown code paths



What to focus on?Why focus here?Issues?CaffeFull coverageExtremely slowOpenCVLimited coverageMedium speedLibXXXVery fastUnknown code pathsUpstreamFuzzing not neededPatched? Workable?

#### $\textbf{FUZZING} \rightarrow \textbf{CRASH, NOW WHAT?}$

- 1 IP Theft
- 2 Model Tampering
- 3 DoS
- 4 Backdoors

- 5.9 (Medium) 7.4 (High) 7.5 (High) 3.9 (Low) 7.5 (High)
- 5 Misprediction (Adversarial attacks)

Is Remote Code Execution (RCE) king?

### **POST EXPLOITATION**

Let's try to demonstrate the TOP 5

#### **DEPENDENCIES/EXPLOIT DEMO**

**Denial of Service** 

Abusing a memory leak

→ demos ssh user@:	localhost -p 60000	→ demos ssh user@localhost -p 60000									
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→ demos ssh user@localhost -p 60000	→ demos ssh user@localhost -p 60000									
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* Documentation: https://help.ubuntu.com	* Documentation: https://help.ubuntu.com									
* Management: https://landscape.canonical.com	* Management: https://landscape.canonical.com									
* Support: https://ubuntu.com/advantage	* Support: https://ubuntu.com/advantage									
Last login: Wed Jul 25 14:48:43 2018 from 10.0.2.2	Last login: Wed Jul 25 14:49:29 2018 from 10.0.2.2									
→ ~	→   ~ htop									

+	demos	SS	sh user@	localhos	st -p	60000			
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- \* Documentation: https://help.ubuntu.com
- \* Management: https://landscape.canonical.com
- \* Support: https://ubuntu.com/advantage
- Last login: Wed Jul 25 14:48:43 2018 from 10.0.2.2

**→** ~

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- \* Documentation: https://help.ubuntu.com
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- \* Support: https://ubuntu.com/advantage
- Last login: Wed Jul 25 14:48:43 2018 from 10.0.2.2
- ~ cd /home/user/for\_presentation/jarvis\_demo/runner/

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@barnhartguy @acaltum

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#### **DENIAL OF SERVICE**

Business impact: Failing Services, downtime, costs

#### **DEPENDENCIES/EXPLOIT DEMO**

**Remote Code Execution** 

Abusing memory corruption (via heap exploitation)

demos ssh user@localhost -p 60000	->
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* Management: https://landscape.canonical.com
* Support: https://ubuntu.com/advantage
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vm
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→ demos

demos ssh user@localhost -p 60000	→
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#### **MODEL TAMPERING**

Business Impact: Change the behavior of the model

Post RCE – remote file system access

🔶 demos 📕





Business Impact: someone steals your model (vested NRE) directly

#### Post RCE - remote file system access



## SO MAYBE RCE IS KING AFTER ALL?

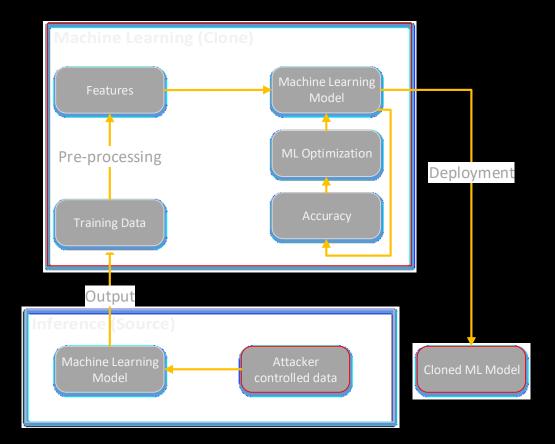
@barnhartguy 🖓 @ao

@acaltum

# AND IF YOU DON'T HAVE AN RCE?

Let's go after the algorithms!

#### ATTACK OF THE CLONES



@barnhartguy 🕤 @

@acaltum



White box – full access to model and training data (Easy)

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@acaltum

## CLONING

White box – full access to model and training data (Easy)

Grey box – no access to model and training data, but educated guesses help (highly succesful)

## CLONING

White box – full access to model and training data (Easy)

Grey box – no access to model and training data, but educated guesses help (highly succesful)

Black box – no idea, exporation via probing, build a map (similar to a Reverse Engineering effort, research WIP)

# WHAT IF THE ATTACKER HAS ACCESS TO THE TRAINING DATA?

#### BACKDOORS

Inject crafted data to the training set with label of your choice

#### No known way to detect!

This is still an open question academically

#### **MISS-PREDICTIONS (ADVERSARIAL ATTACKS)**

You can manipulate the output with a crafted input ;-)

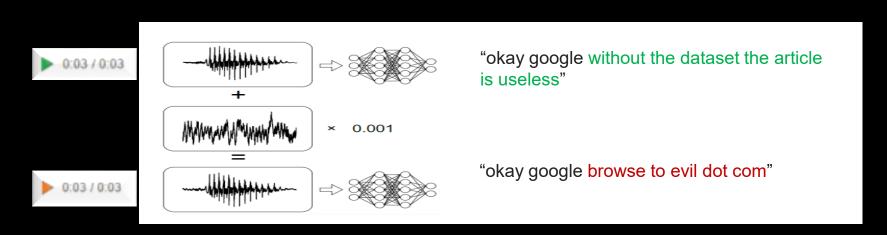
#### Remember, the system optimizes for the "strongest signal"

#### **TURTLE OR A RIFLE?**



https://www.labsix.org/physical-objects-that-fool-neural-nets/

#### **ADVERSARIAL AUDIO**



https://nicholas.carlini.com/code/audio\_adversarial\_examples/

#### **EVADING NEXT GENERATION AV USING AI**

Static machine learning model trained on millions of samples



- Simple structural changes that don't change behavior
  - unpack
  - '.text' -> '.foo' (remains valid entry point)
  - create '.text' and populate with '.text from calc.exe'



https://media.defcon.org/DEF%20CON%2025/DEF%20CON%2025%20presentations/DEFCON-25-Hyrum-Anderson-Evading-Next-Gen-AV-Using-AI.pdf https://www.youtube.com/watch?v=FGCle6T0Jpc

## WHAT ABOUT PRIVACY ?

#### **PRIVACY LEAKS? NOT YET, BUT SOON...**





**Risk: 7.4%** 

**Risk: 35.3%** 

#### **PRIVACY LEAKS? NOT YET, BUT SOON...**





Risk: 96.2%

# **FOOLING FACIAL RECOGNITION**



#### **FACIAL RECOGNITION**



Figure 5: The eyeglass frames used by  $S_C$  for dodging recognition against  $DNN_B$ .

https://www.ece.cmu.edu/~lbauer/papers/2016/ccs2016-face-recognition.pdf

#### **FACIAL RECOGNITION**

@acaltum

@barnhartguy

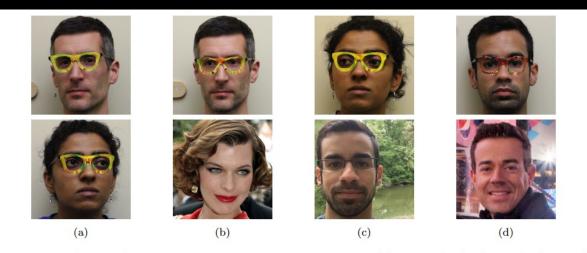


Figure 4: Examples of successful impersonation and dodging attacks. Fig. (a) shows  $S_A$  (top) and  $S_B$  (bottom) dodging against  $DNN_B$ . Fig. (b)–(d) show impersonations. Impersonators carrying out the attack are shown in the top row and corresponding impersonation targets in the bottom row. Fig. (b) shows  $S_A$  impersonating Milla Jovovich (by Georges Biard / CC BY-SA / cropped from https://goo.gl/GlsWlC); (c)  $S_B$  impersonating  $S_C$ ; and (d)  $S_C$  impersonating Carson Daly (by Anthony Quintano / CC BY / cropped from https://goo.gl/VfnDct).

https://www.ece.cmu.edu/~lbauer/papers/2016/ccs2016-face-recognition.pdf

#### **KEY TAKEAWAYS - RESEARCHERS**

We need a better trust model for ML and a lot more research! More focus should be on the infrastructure

The interfaces between the stages are very vulnerable (hint hint)

## **KEY TAKEAWAYS - ATTACKERS**

This is a ripe field for attacks

High value targets

Huge dependency stack

## **KEY TAKEAWAYS - DEFENDERS**

Machine Learning needs sanitation and security controls too Use Machine Learning models from untrusted sources with caution Validate the data you rely on - does it include negative cases? abnormal cases?



#### ACKNOWLEDGMENTS

Omer Agmon Adi Oren **Denis Klimov** Raizy Kellerman Adel Fuchs Sapir Hamawie **Oleg Pogorelik** 

#### REFERENCES

PassGAN: A Deep Learning Approach for Password Guessing Adversarial examples for evaluating reading comprehension systems Universal adversarial perturbations, Video Awesome-AI-Security An introduction to Artificial Intelligence When DNNs go wrong – adversarial examples and what we can learn from them Machine Learning in the Presence of Adversaries Pattern Recognition and Applications Lab: Adversarial Machine Learning Deep neural networks are easily fooled, Practical black-box attacks against deep learning systems using adversarial examples, Adversarial examples in the physical world, Explaining and harnessing adversarial examples Distillation as a defense to adversarial perturbations against deep neural networks. Vulnerability of deep reinforcement learning to policy induction attacks

Adversarial attacks on neural network policies, Attacking Machine Learning with Adversarial Examples Intriguing properties of neural networks Robust Physical-World Attacks on Deep Learning Models Accessorize to a Crime: Real and Stealthy Attacks on State-of-the-Art Face Recognition Towards the Science of Security and Privacy in Machine Learning cleverhans source code **Clever Hans** Awesome - Most Cited Deep Learning Papers 8 Lessons from 20 Years of Hype Cycles DEF CON 25 (2017) - Weaponizing Machine Learning - Petro, Morris Evading next-gen AV using A.I. For better machine-based malware analysis, add a slice of LIME BadNets: Identifying Vulnerabilities in the Machine Learning Model Supply Chain

#### **HOW TO PROCEED?**





#### ANY QUESTIONS? @barnhrtguy @acaltum

