HITB*CyberWeek
Abu Dhabi, UAE: 12-17 October 2019

Security for AI
or
AI for Security?

Sergey Gordeychik
HTTP://SCADA.SL
@SCADASL
serg.gordey@gmail.com

https://cyberweek.ae

Sergey Gordeychik

- AI and Cybersecurity Executive
  - Abu Dhabi, UAE
- Visiting Professor, Cyber Security
  - Harbour.Space University, Barcelona, Spain
- Program Chair, PHDays Conference
  - www.phdays.com, Moscow

- Cyber-physical troublemaker
  - Leader of SCADA Strangelove Research Team
  - www.scada.sl, @scadasl
- Ex…
  - Deputy CTO, Kaspersky Lab
  - CTO, Positive Technologies
  - Gartner recognized products and services

Disclaimer

Please note, that this talk is by Sergey and AISec group.

We don't speak for our employers.

All the opinions and information here are of our responsibility. So, mistakes and bad jokes are all OUR responsibilities.

Actually no one ever saw this talk before.

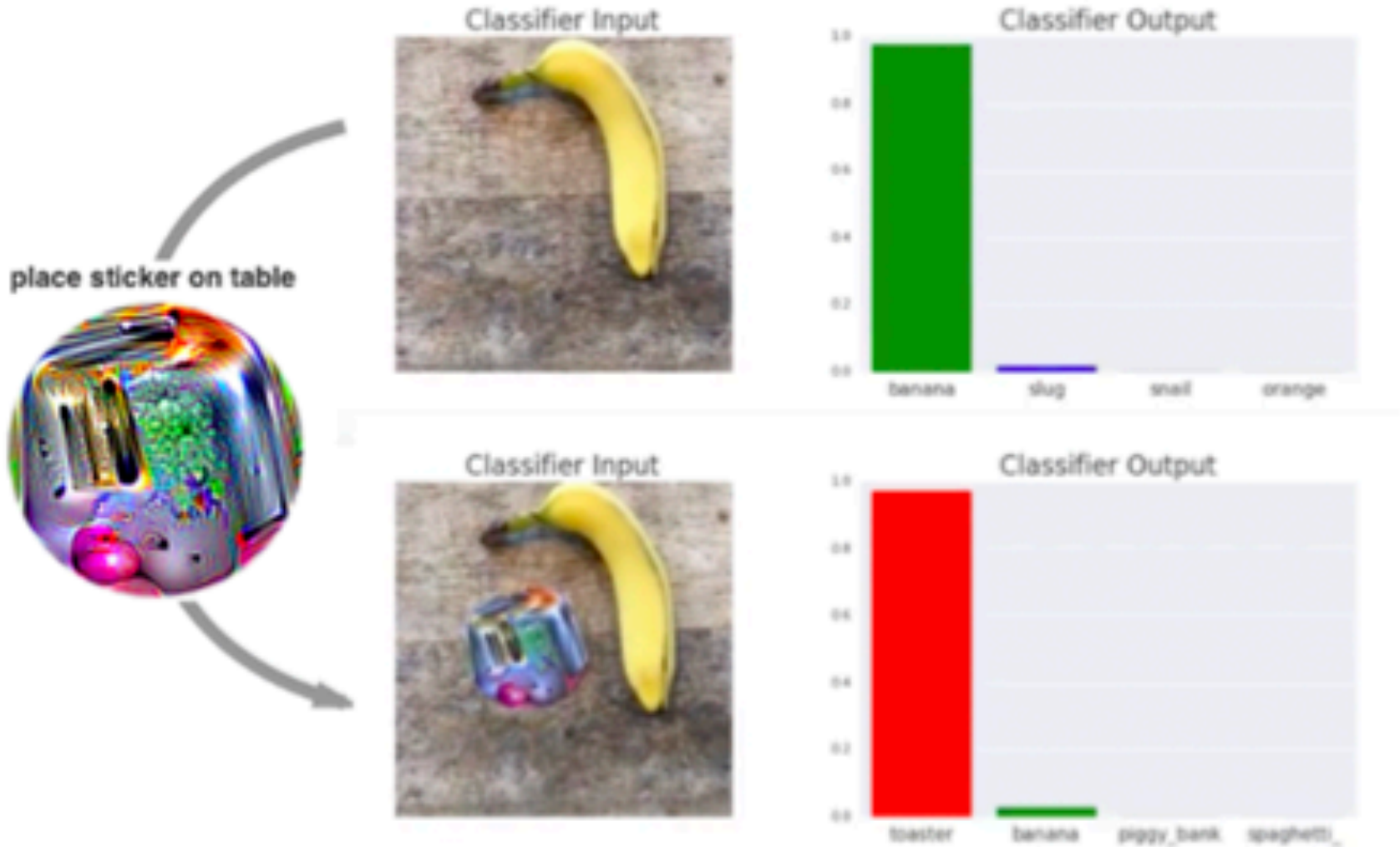
https://en.wikipedia.org/wiki/Terms_and_Conditions_May_Apply

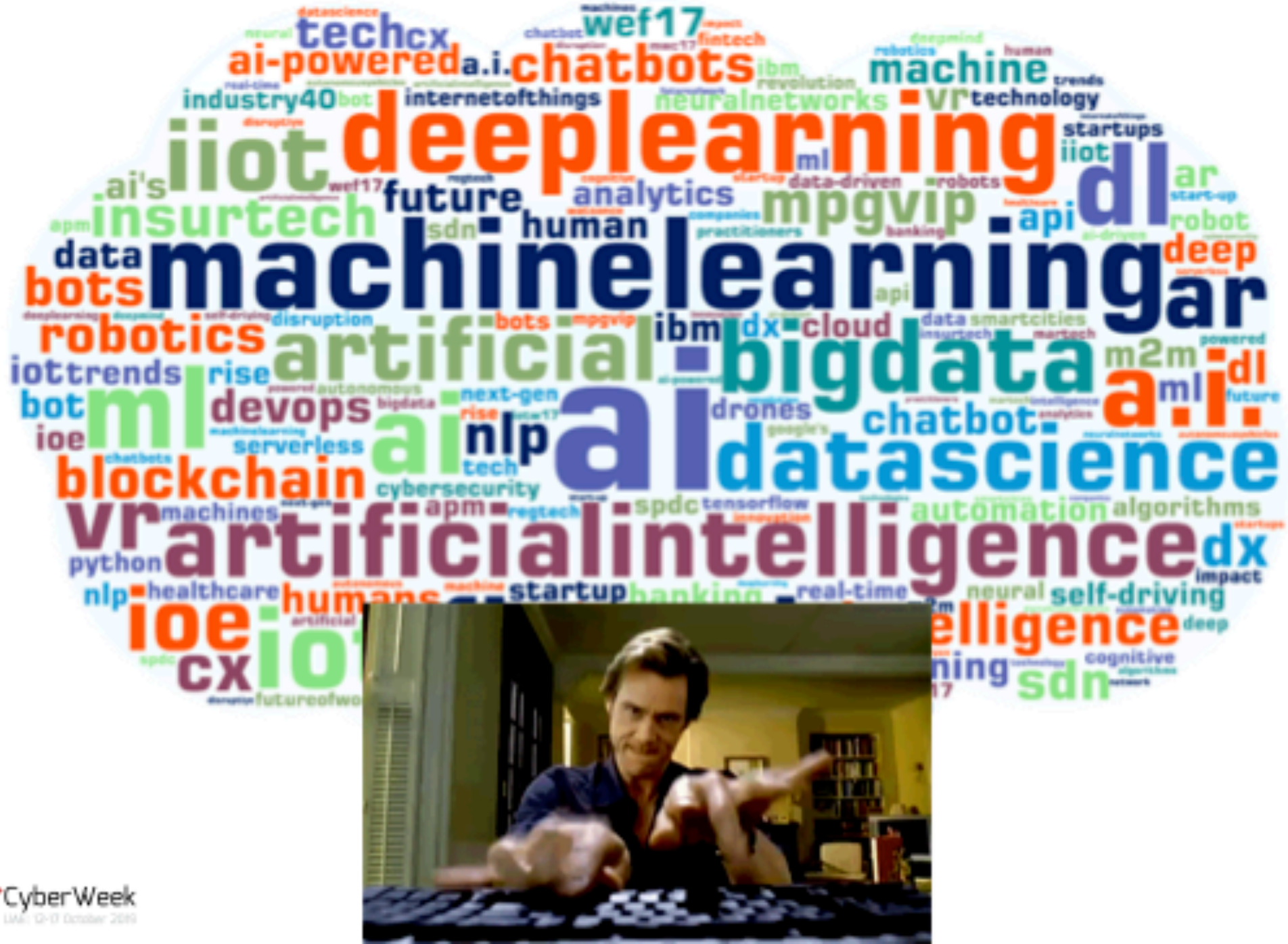

BIG BROTHER
CCTV

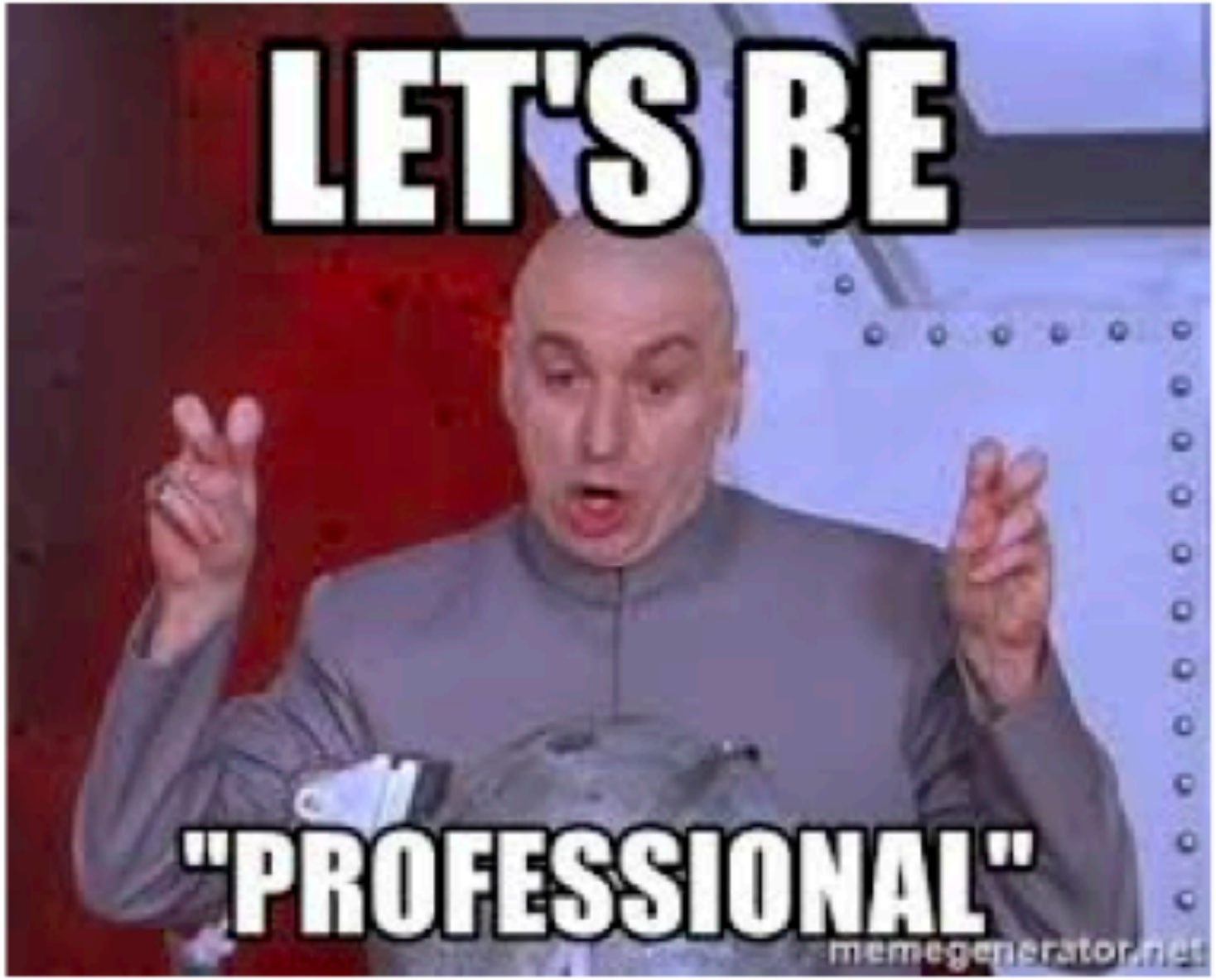
PWN?

Adversarial example anyone?

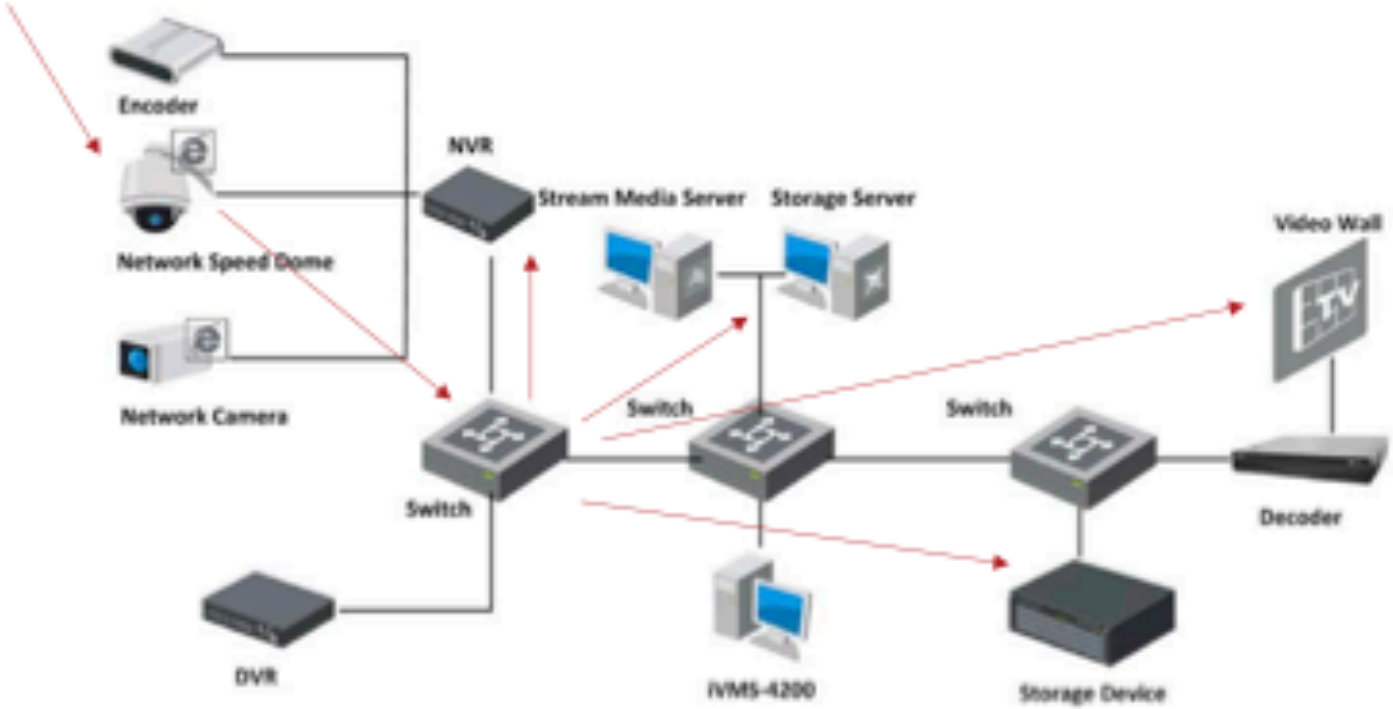
Adversarial example?




techcx
wef17
ai-powered
a.i.
chatbots
machine
industry40
internetofthings
neuralnetworks
vr
technology
iiot
deeplearning
startups
dl
ml
ar
.ai's
future
analytics
mpgvip
api
insurtech
sdn
human
robot
data
machinelearning
deep
bots
ar
robotics
artificial
bigdata
ibm
dx
cloud
smartcities
m2m
a.i.
iottrends
rise
ml
devops
drones
chatbot
bot
ai
nlp
ai
datascience
ioe
serverless
blockchain
tech
cybersecurity
vr
artificialintelligence
machines
apm
regtech
spdc
tensorflow
automation
algorithms
dx
python
nlp
healthcare
startup
real-time
neural
self-driving
ioe
iot
cx
sdn
cognitive


LET'S BE
"PROFESSIONAL"
memegenerator.net

Hacking as usual…



https://slideplayer.com/slide/4378533/

What is Cybersecurity?

Cybersecurity goals?

HOLY
CIA
TRINITY

OT/ICS/SCADA Security?!

IT domain

SCADA Security Basics: Integrity Trumps Availability, ISA/IEC 62443-2-1 standards (formerly ISA-99)
https://www.tofinosecurity.com/blog/scada-security-basics-integrity-trumps-availability

Process control

Marina Krotofil, Damn Vulnerable Chemical Process
https://fahrplan.events.ccc.de/congress/2014/Fahrplan/system/attachments/2566/original/31C3_2014_Krotofil.pdf

Machine Learning and AI?

IT domain **Process control** **AI security**

Goal of computer security

Ensure that systems do the right thing, even in the presence of malicious inputs

usenix
THE ADVANCED COMPUTING SYSTEMS ASSOCIATION

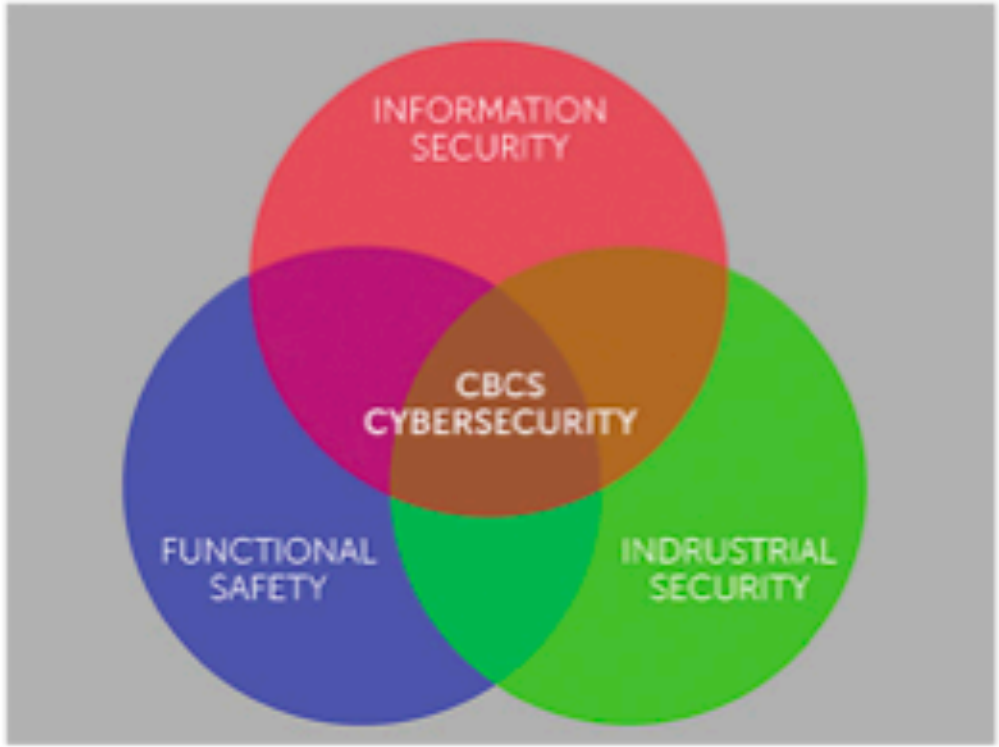
27TH USENIX SECURITY SYMPOSIUM

James Mickens, Harvard University, USENIX Security '18-Q: Why Do Keynote Speakers Keep Suggesting That Improving Security Is Possible?

https://www.youtube.com/watch?v=ajGX7odA87k

Mission-centric Cybersecurity

a process that ensures control object operation with no dangerous failures or damage, but with a set economic efficiency and reliability under adversarial anthropogenic information influence



Gapanovich, Rozenberg, Gordeychik, Signalling cyber security: the need for a mission-centric approach
https://www.railjournal.com/in_depth/signalling-cyber-security-the-need-for-a-mission-centric-approach

But what about?...

dangerous failures?
economic efficiency?
reliability level?

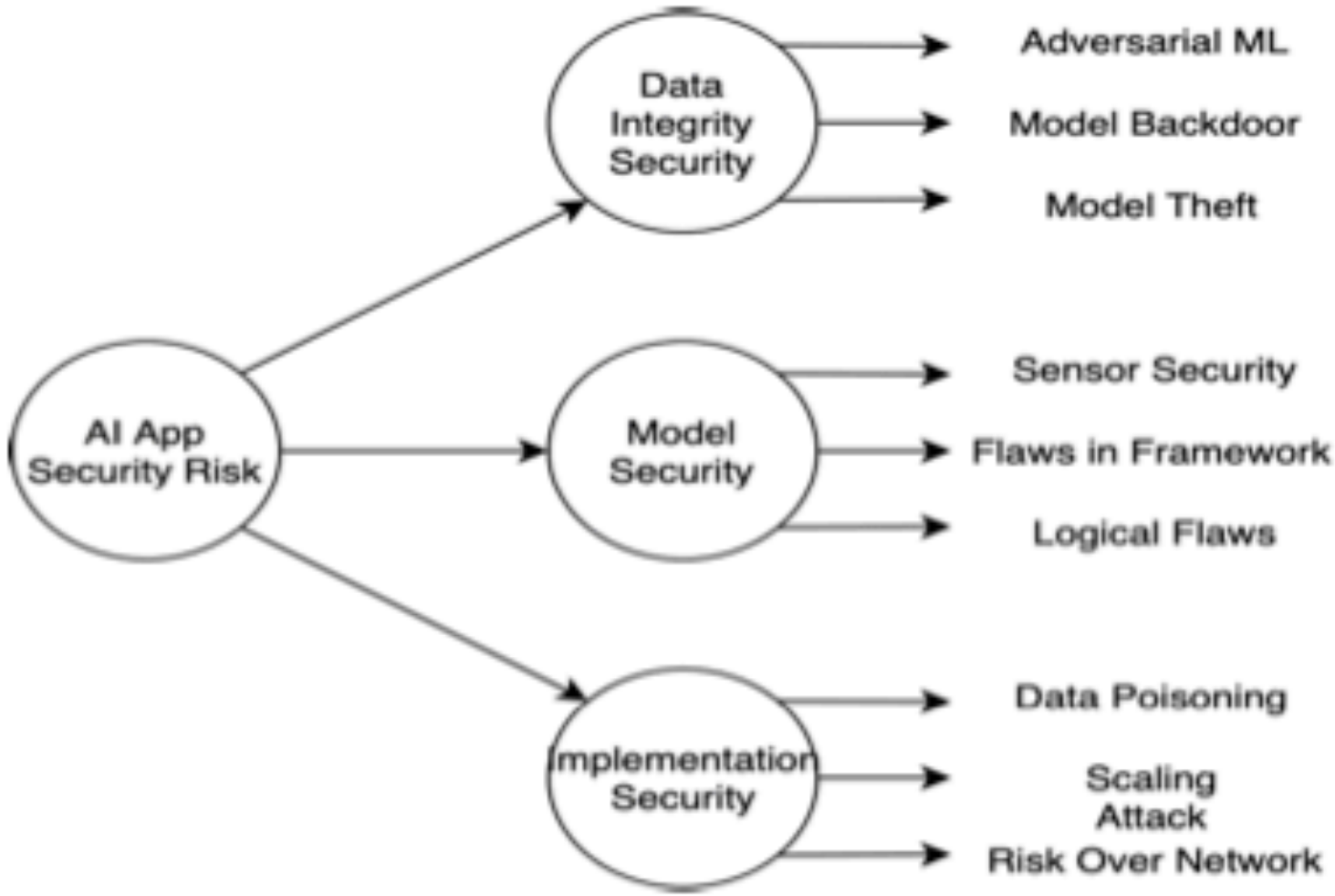
https://www.youtube.com/watch?v=rW9WmA5okpE

But what about?...

dangerous failures?
economic efficiency?
reliability level?

Build the Threat Model First!

AI Threat Model



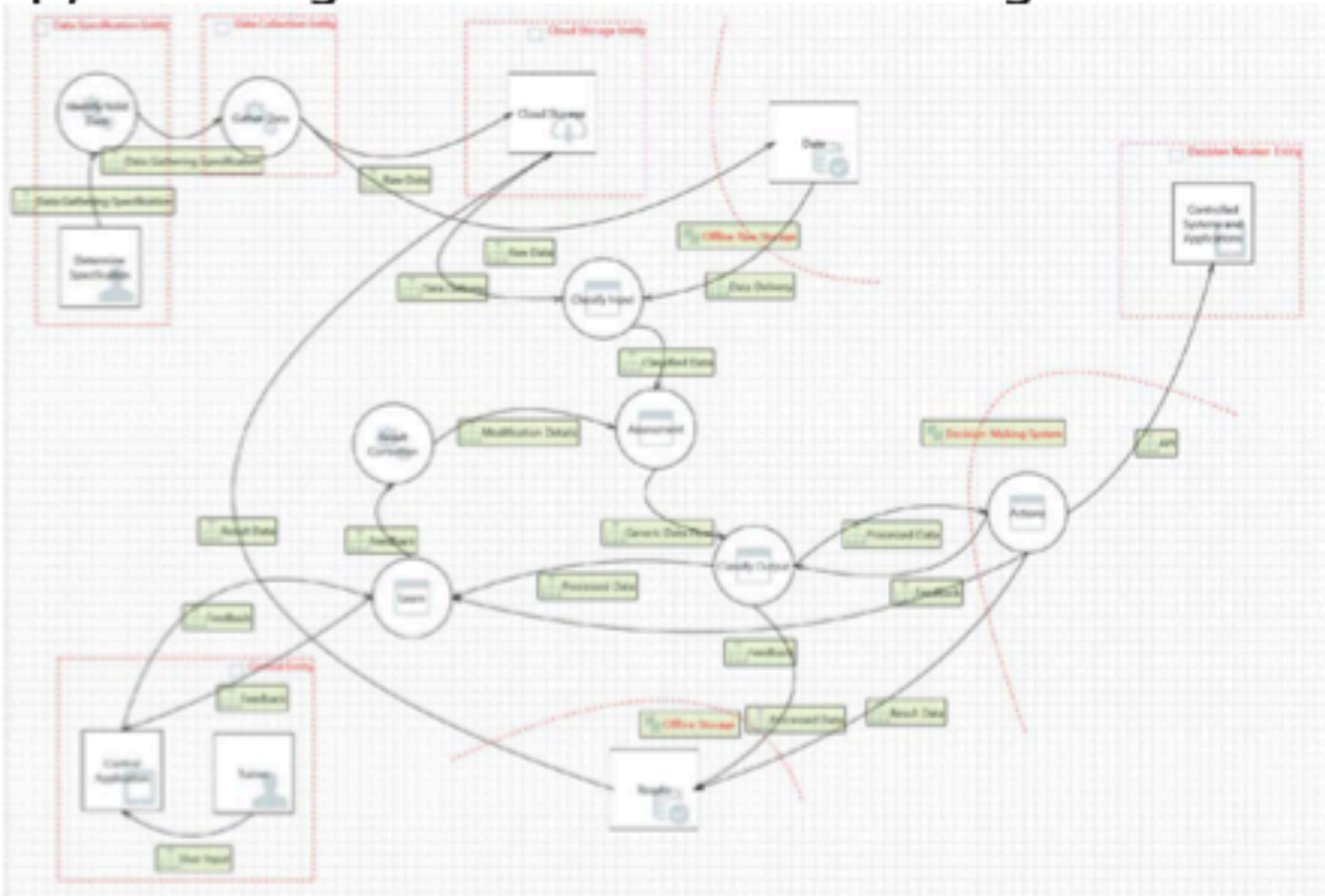
Li, K. (n.d.). *Reverse Engineering AI Models.*

But what about?...

- Cloud
- AUC/ROC
- Privacy
- IP protection
- Federative learning
- Insane androids?...

AI security

NCC Group, Building safer machine learning



https://www.nccgroup.trust/uk/about-us/newsroom-and-events/blogs/2018/august/building-safer-machine-learning-systems-a-threat-model/

AI in da Cloud

Cloud - CyberSec as usual?

- InfiniBand and SDN
- Security of ML/GPU servers
  - Supply chain
  - BMC/Firmware
  - GPU is a new CPU
- Virtualization
- Containers

https://giphy.com/gifs/glas-2017-26gsswvT0Qrx01h6AU

SDN/SD-WAN NEWS BYTES

- A vendor says its solution has the capability of "stitching together" WAN and Ethernet networks
- Service providers are using SD-WAN to provide network agility
- An SD-WAN router has an artificial intelligence (AI)-based routing service
- A vendor announced that it would be unifying its security and SD-WAN

How AI and Machine Learning Will Influence the SD-WAN

Artificial Intelligence & Machine Learning: SD-WAN is Evolving

by Yulia Duryea
April 2018

Machine Learning and AI Promise to Take SD-WAN Into the World of Intent

SDN/SD-WAN Security

- C. Yoon, S. Lee, H. Kang, etc. Flow Wars
- J. Hizver. Taxonomic Modeling of Security Threats in Software Defined Networking
- S. Lal, T. Taleb, A. Dutta. NFV: Security Threats and Best Practices
- SD-WAN New Hope, https://github.com/sdnewhop/sdwannewhope

SD-WAN New Hop - Hack before you buy!

	Vendor 1	Vendor 2	Vendor 3	Vendor 4	Vendor 5
Hardcodes	V	X	X	X	V
Broken access control	V	V	X	X	V
Using vulnerable GNU/Linux	¯_(ツ)_/¯	X	X	X	¯_(ツ)_/¯
Using vulnerable 3rd party components	X	X	X	X	X
Broken client-side Web	V	X	X	X	!
Broken server-side Web	X	X	X	X	X
Secure misconfiguration	!	X	X	X	X
Memory Corruption	¯_(ツ)_/¯	¯_(ツ)_/¯	X	X	¯_(ツ)_/¯

http://www.scada.sl/search/label/sd-wan

BMC/IPMI/UEFI

1998	2001	2004	2013	2014	2018
IPMI v1.0 spec	**IPMI v1.5 spec**	**IPMI v2.0 spec**	**Many BMC/IPMI vulnerabilities published**	**SMC PSBlock password file vulnerability**	**HP iLO4 auth bypass and RCE**
Base version of IPMI specification released	Many enhancements to base specification including IPMI over LAN and IPMI over Serial/Modem	New features including Serial over LAN, Enhanced Authentication, Firmware Firewall, and VLAN support	Dan Farmer and H.D. Moore found over 300k BMCs connected to the internet, 52k vulnerable to cipher -zero auth bypass	Zachary Wikholm discovered that Supermicro BMCs have plaintext password file which could be retrieved remotely without auth, 32k on internet	Multiple vules including trivial auth bypass: curl -k "Connection: AAAAAAAAAAAAAAAA AAAAAAAAAA"

1998	2002	2007	2015	2016	2016
EFI 1.02	**EFI 1.10**	**UEFI 2.1**	**UEFI 2.5**	**UEFI 2.6**	**Missing size checks in DHCP code**
First version of Extensible Firmware Interface standard written by Intel	Intel released EFI 1.10 standard and contributed it to Unified EFI Forum	Cryptography, network authentication, and UI infrastructure added	WiFi, Bluetooth, HTTP, and HTTP BOOT functionality added	TLS implementation added based on OpenSSL	Topher Timzen noticed that DHCP code used untrusted length from network for copy without checks

• Remotely Attacking System Firmware, Jesse Michael, Mickey Shkatov & Oleksandr Bazhaniuk, BH18

To find a ML Server in the Internet?

GPGPU?


```
"id": "c1c5488fa6eaa884",
"worker_id": "Seadon-gpu",
"version": "2.14.4",
"kind": "nvidia",
"ua": "XMRig-NVIDIA/2.14.4 (Linux x86_64) libuv/1.8.0 CUDA/9.0 gcc/5.4.0",
"cpu": {
    "brand": "Intel(R) Xeon(R) CPU E5-2690 v4 @ 2.60GHz",
    "aes": true,
    "x64": true,
    "sockets": 1
},
"algo": "cryptonight",
"hugepages": false,
"donate_level": 5,
"hashrate": {
    "total": [
        1772.03,
        1772.3,
        1770.32
    ],
    "highest": 1772.85,
    "threads": [
        [
            1772.03,
            1772.3,
            1770.32
        ]
    ]
},
"health": [
    {
        "name": "Tesla V100-PCIE-16GB",
        "clock": 1380,
        "mem_clock": 877,
        "power": 124,
        "temp": 69,
        "fan": 0
    }
```

Crypto currency on GPGPU in 2019?

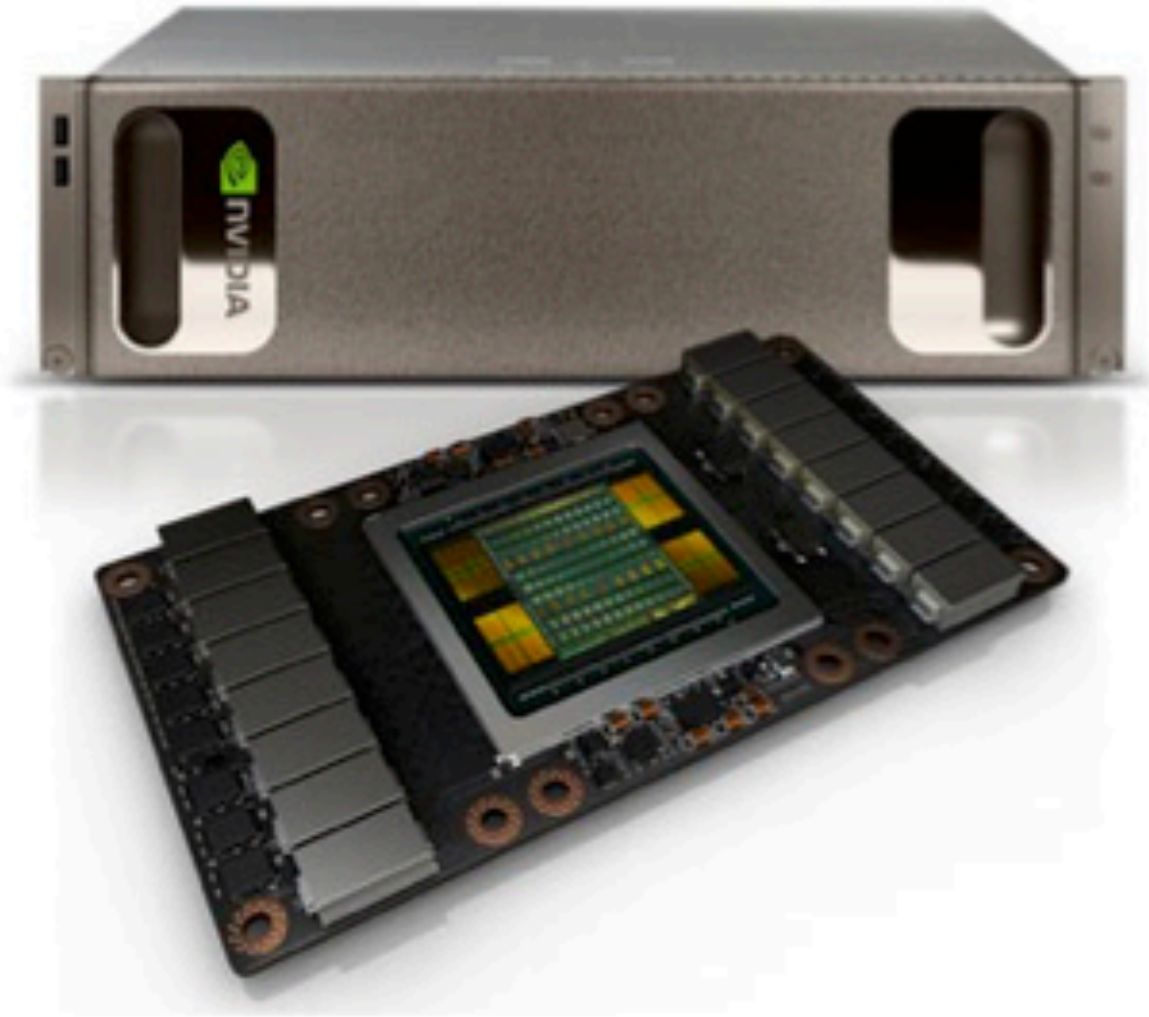

```
"health": [
    {
        "name": "Tesla V100-PCIE-16GB",
        "clock": 1380,
```

SNMPWALK


SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.7.1 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.7.2 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.7.3 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.7.4 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.7.5 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.8.1 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.8.2 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.8.3 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.11.3 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.11.4 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.11.5 = STRING: "NVIDIA"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.12.1 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.12.2 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.12.3 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.12.4 = STRING: "DGX-1 with V100-32"
SNMPv2-SMI::enterprises.7244.1.2.1.3.6.1.12.5 = STRING: "DGX-1 with V100-32"
"NVIDIA"
"DGX-1 with V100-32"

DGX-1

- 8 Tesla V100-32GB
- TFLOPS (deep learning) 1000
- CUDA Cores 40,960
- Tensor Cores 5,120
- $130,000

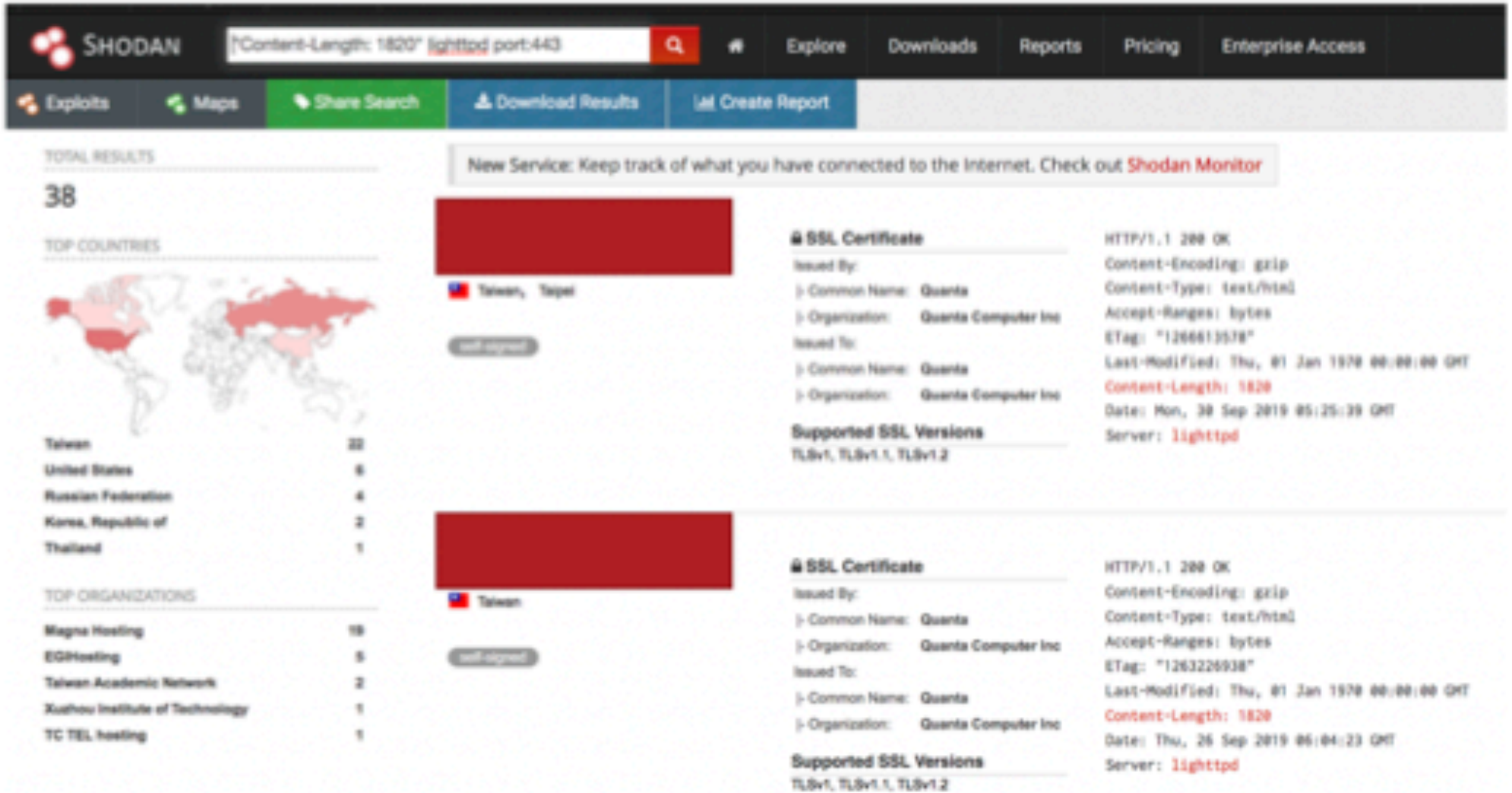


- Good hashcat rate :)

https://hashcat.net/forum/thread-6972.html

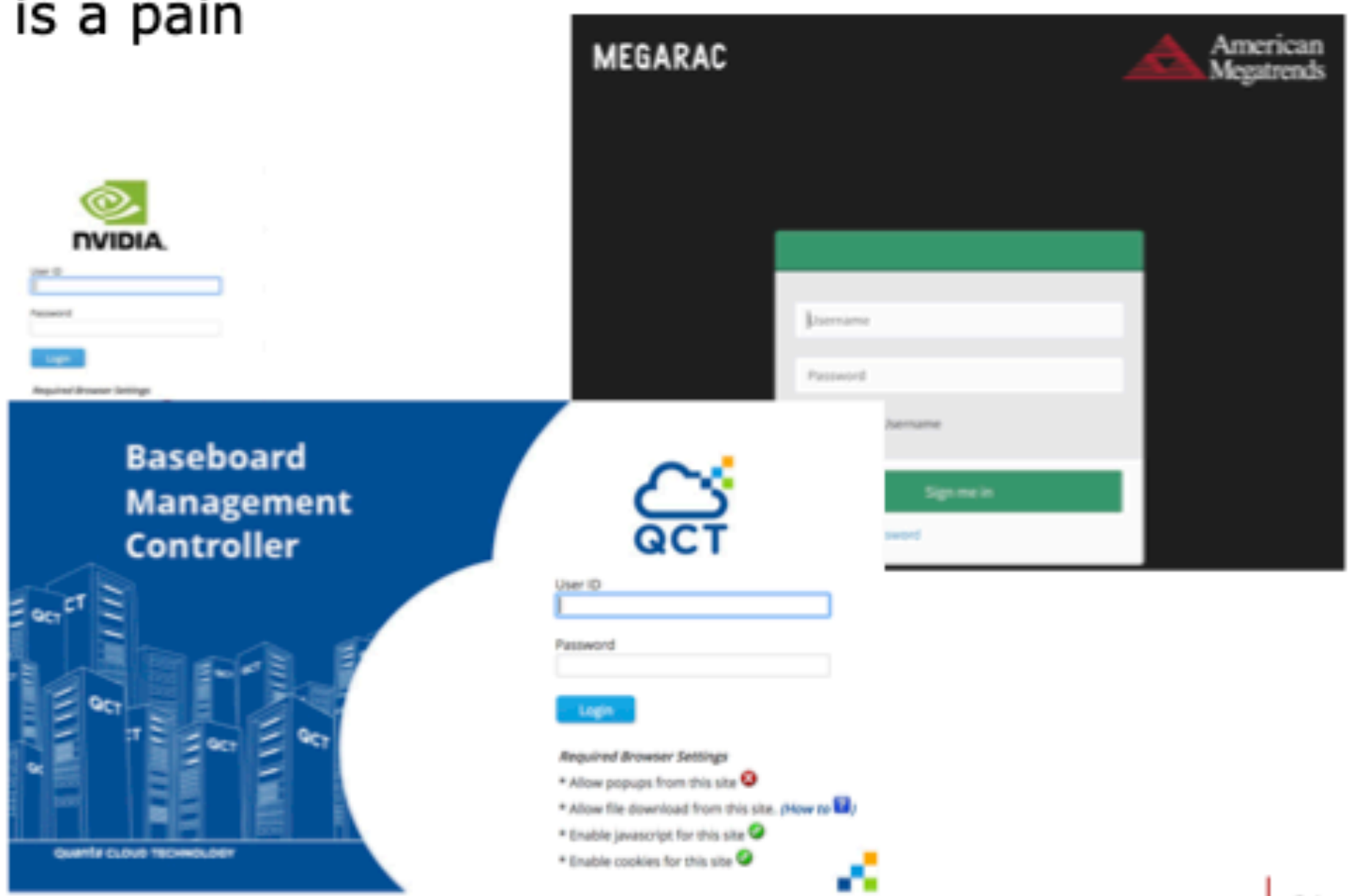
NetNTLMv2: 28912.2 MH/s
MD5: 450.0 GH/s
SHA-256: 59971.8 MH/s
MS Office 2013: 163.5 kH/s
bcrypt $2*$, Blowfish (Unix): 434.2 kH/s

Other things?



Supply chain is a pain

Baseboard Management Controller



CVE-2013-4786 - 2019

To:
Sec

Dear,

Dea
Ples

We have confirmed that this issue is a known vulnerability (CVE-2013-4786).
It is a protocol problem and [redacted] products also comply with this standard.

Vuln
Soft
Severity: High
CVSS Base Score: 7.5 (AV:N/AC:L/PR:N/UI:N/S:U/C:H/I:N/A:N)

Exploitation conditions: Network access to the vulnerable resource

Description: The IPMI 2.0 specification supports RMCP+ Authenticated Key-Exchange Protocol (RAKP) authentication, which allows remote attackers to obtain password hashes and conduct offline password guessing attacks by obtaining the HMAC from a RAKP message 2 response from a BMC. Vulnerability is similar to CVE-2013-4786, which affected multiple vendors. At the time of before mentioned vulnerability it was not known, that Huawei iBMC are also affected. There is no CVE associated with this vulnerability for Huawei iBMC.

Metasploit exploitation example:

```
f5 auxiliary(scanner/ipmi/ipmi_dumphashes) > set rhosts 17[redacted]/24
osts => 17[redacted]/24
f5 auxiliary(scanner/ipmi/ipmi_dumphashes) > run

[ 17[redacted]:623 - IPMI - Hash found: admin:0[redacted]
[redacted]8
[ 17[redacted]:623 - IPMI - Hash found: Administrator:b[redacted]
[redacted]1
[ 17[redacted]:623 - IPMI - Hash found: Administrator:2[redacted]
[redacted]9
```

Use c0mp13x passwords!

Dear Sergei,

We have provided Risk Prevention Measures in the product User Guide to prevent this exploitation.

Do as follows to minimize the security risks caused by the vulnerability (CVE-2013-4786) of RMCP+:

- If you do not use IPMI protocol to access the iBMC:
  - Disable the IPMI service on this page.

    NOTE

    After IPMI is disabled, other devices cannot use IPMI to access the iBMC. This setting affects the IPMI-based tools, such as IPMItool, InfoCollect, and eSight.
  - Enable password complexity check and set passwords complying with the password complexity requirements.

I have only one question!

~~How the complex password will help?!!~~

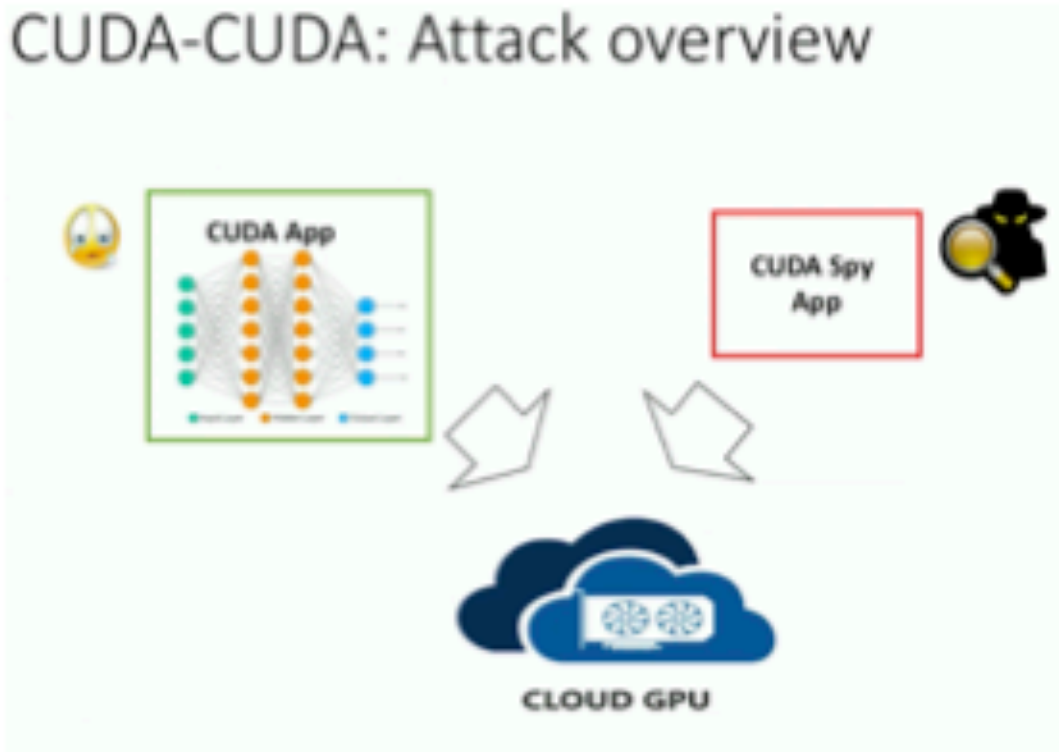
Why it still enabled by default in 2019?

http://www.demotivation.us/i-have-only-one-question-1267735.html

Any bugs there?

GPGPU is a new CPU

- GPU drivers vulns
  - 10x for Windows, few for Linux
  - CVE-2018-6249
  - CVE-2018-6253
- GPU rootkit
  - Avoid detection
  - DMA (keylogger, passwords)
  - Project Maux Mk.II (2008)
  - Jellyfish PoC rootkit (2015)
- GPU – specific vulnerabilities????



Rendered Insecure
GPU Side Channel Attacks are Practical

Rowhammer anyone?

We're using Keras and Tensorflow for a deep learning application on some machines in Goo
Platform using K80 GPUs.

We've been having some problems with Double Bit ECC (DBE) errors. According to the offic
documentation https://docs.nvidia.com/deploy/dynamic-page-retirement/index.html:

> Applications will receive a DBE event notification for graceful exit, and no further context w
> created on the GPU until the DBE is mapped out.

When these errors occur our application goes to using 100% CPU. We don't know what it is
this point, but we'll work on adding some more ways of monitoring it.

My question is how does my application receive these DBE event notifications? Is it a SIGTE
some type of error I should be catching when call Keras, or something else I should be doing

Thanks in advance

```
Attached GPUs                             : 8
GPU 00000000:06:00.0
    Retired Pages
        Single Bit ECC                    : 1
        Double Bit ECC                    : 0
        Pending                           : Yes

GPU 00000000:07:00.0
    Retired Pages
        Single Bit ECC                    : 0
        Double Bit ECC                    : 0
        Pending                           : No

GPU 00000000:0A:00.0
    Retired Pages
        Single Bit ECC                    : 0
        Double Bit ECC                    : 0
        Pending                           : No
```

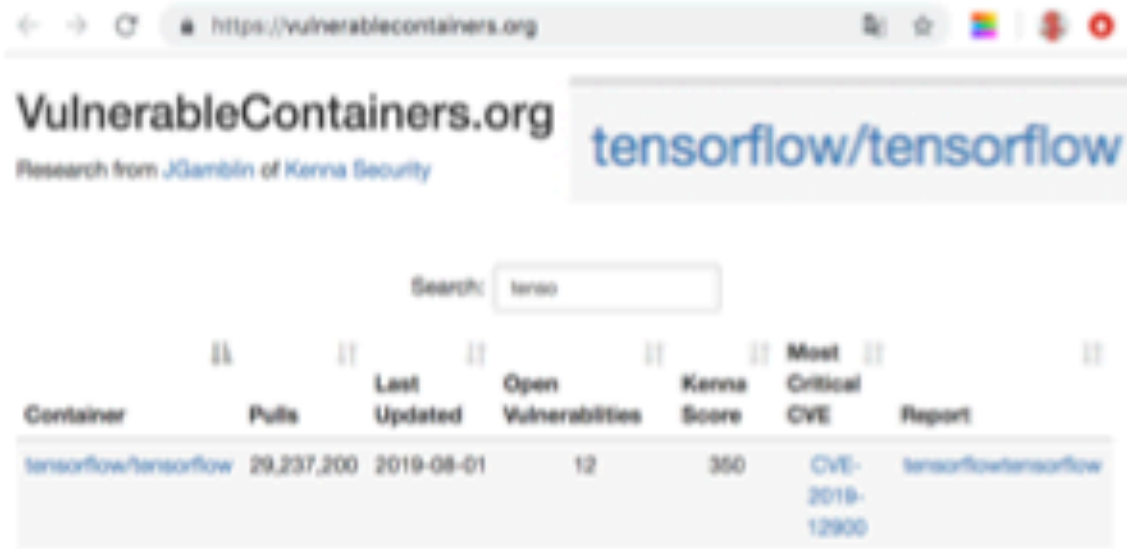
Docker

- Host security
  - Hardening
  - Docker daemon
  - (CVE-2018-15664, CVE-2018-8115, etc)
- Container Images
  - Patch management
  - Configuration (CVE-2019-5021)
  - Information leakage
  - Trust
- Root access
  - Running containers as Root
  - Processes as Root
  - CAP_SYS_ADMIN privilege
- Limit Compute Resources

Alpine Linux Docker images ship a root account with no password

Attackers can authenticate on vulnerable systems using the root user and no password.

The issue was first discovered back in August 2015, patched in November, then accidentally re-opened three weeks later, in December 2015, only to be re-discovered again by a Cisco Umbrella researcher in January this year.



https://vulnerablecontainers.org/

Serverless Security

SAS-1
Function Event Data Injection

SAS-5
Inadequate Function Monitoring and Logging

SAS-9
Serverless Function Execution Flow Manipulation

SAS-2
Broken Authentication

SAS-6
Insecure 3rd Party Dependencies

SAS-10
Improper Exception Handling and Verbose Error Messages

SAS-3
Insecure Serverless Deployment Configuration

SAS-7
Insecure Application Secrets Storage

SAS-4
Over-Privileged Function Permissions & Roles

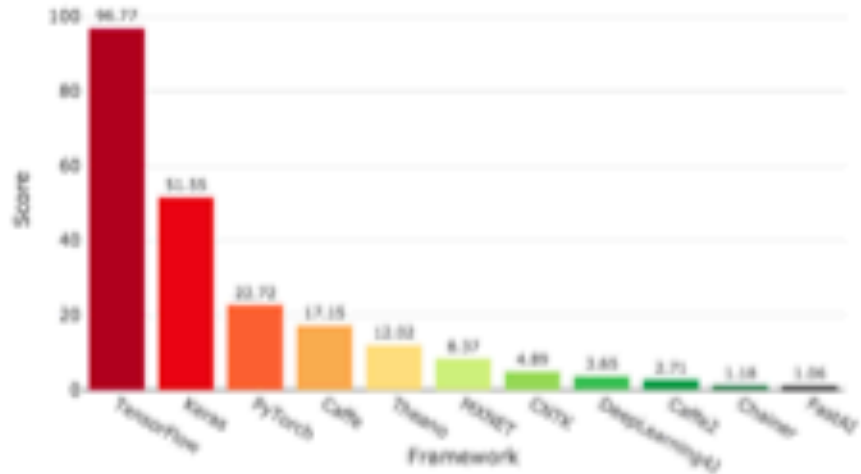
SAS-8
Denial of Service & Financial Resource Exhaustion

https://www.puresec.io/resource-download

ML/DL Frameworks

- Vulnerabilities in frameworks
  - Management interfaces
  - Data processing
  - Integration
  - Patch management
- Code security
  - Custom code
  - Model as malware

Deep Learning Framework Power Scores 2018



https://towardsdatascience.com/deep-learning-framework-power-scores-2018-23607ddf297a

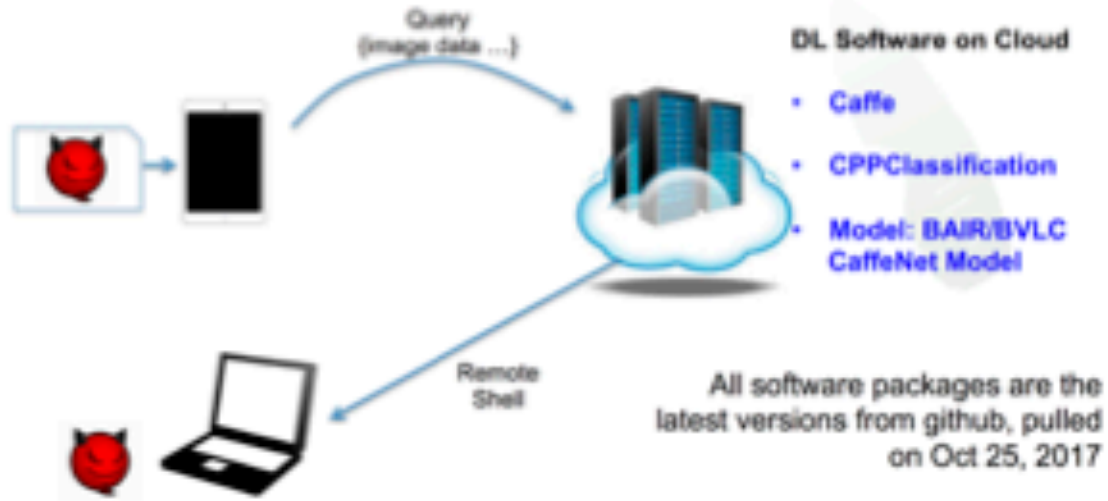
Data processing

- 3rd party packages dependencies
- Obsolete code
- Data handling vulnerabilities

- Example
  - Remote code execution in Caffe via crafted image

DL Framework	Lines of Code	Number of Dep. Packages
Caffe	127K+	137
TensorFlow	887K+	97
torch	590K+	48

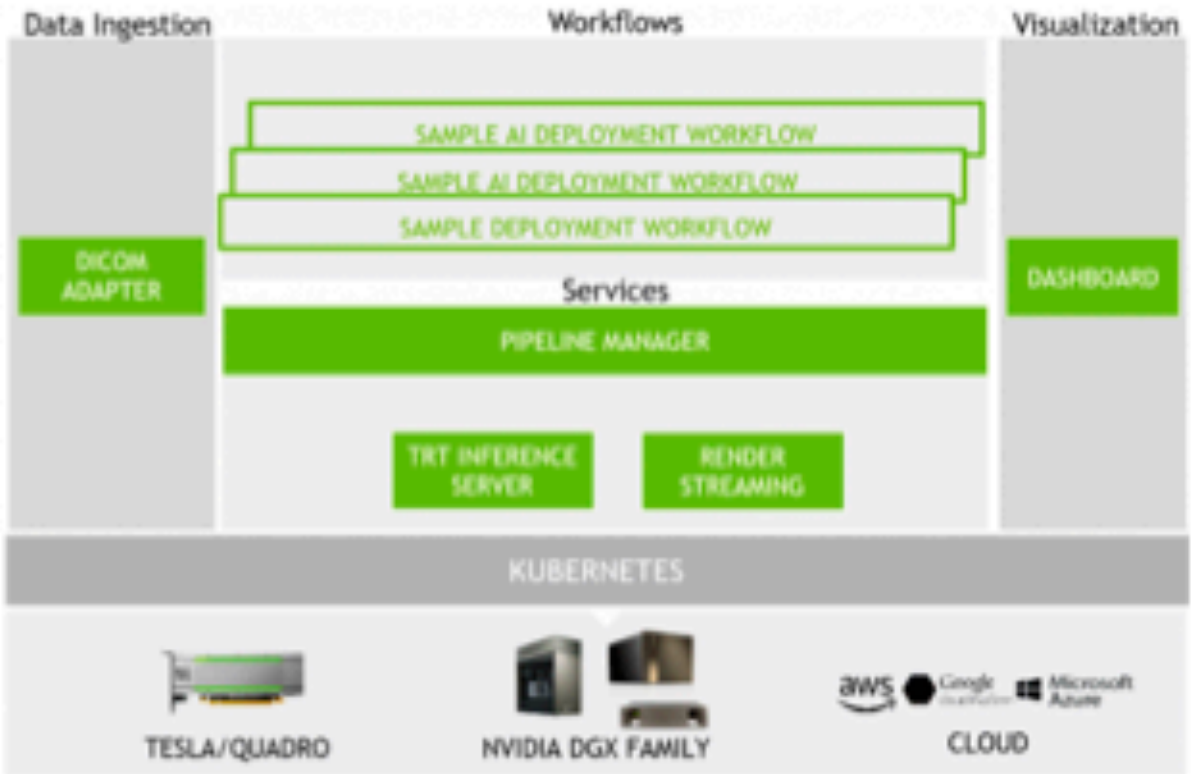
Demo Setup



From framework to Pipeline

DICOM
Digital Imaging and Communications in Medicine

NVIDIA CLARA Platform



DICOM Frankenstein

5.2. External DICOM Sender and DICOM Receiver

You need an external DICOM Service Class User (SCU) application to send image
Similarly when your pipeline finishes executing, you

For this example we will use the open-source DICO

5.2.1. Install DCMTK

Install DCMTK utilities by issuing the following com

```
sudo apt-get install dcmtk
```

To Run the Demonstration with Orthanc and OHIF Viewer

1. Install and run Orthanc in a Docker container.
2. Print a JSON configuration with tthe following command:

```
docker run --rm --entrypoint=cat jodogne/orthanc /etc/orthanc/orthanc.json > <you
```

3. Edit orthanc.json to add the 2 lines below to the `DicomModalities` section, after the c
clearcanvas example:

```
// "clearcanvas" : [ "CLEARCANVAS", "192.168.1.1", 104, "ClearCanvas" ]:
"clara-liver" : [ "LiverSeg", "yourIPaddress", 104 ],
"clara-ctseg" : [ "OrganSeg", "yourIPaddress", 104 ]
```

Do DICOM Series Dream of /etc/passwd?

Public reports for DCMTK

Dicom Toolkit DCMTK provides tools for working with DICOM files.

We have found the following weaknesses and vulnerabilities:

1. DoS `xml2dcm` utility
2. DoS `dcm2xml` utility
3. XXE injection in `xml2dcm` utility

Public reports for ORTHANC server

Orthanc is a Belgian, open-source, lightweight DICOM server for healthcare and medical research.

Nvidia Clara recommends to use ORTHANC server as a DICOM-adapter.

We found the following vulnerabilities:

1. CSRF with remote code execution


```
^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@
^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@^@
DICM^B^@^@^@UL^D^@%^@^@^@^B^@^A^@OB^@^@^B^@^@^@^@^A^B^@^B^@UI^Z^@1.2.840.100
.0.22427.1561636223.452^B^@^P^@UI^T^@1.2.840.10008.1.2.1^@^B^@^R^@UI^\^@1.2.
64 ^H^@^E^@CS
^@ISO_IR 192^H^@^H^@CS^V^@ORIGINAL\PRIMARY\AXIAL^H^@^V^@UI^Z^@1.2.840.10008.
22427.1561636223.452^H^@ ^@DA^H^@20170627^H^@!^@DA^H^@20170627^H^@"^@DA^H^@2
^@171021.000^H^@1^@TM
^@171209.927^H^@2^@TM
^@171209.600^H^@3^@TM
^@171210.126^H^@P^@SH^P^@AGFA000000865039^H^@R^@CS^F^@STUDY ^H^@T^@AE^H^@MOW
CT^H^@p^@LO^H^@TOSHIBA ^H^@<80>^@LO^N^@GBUZ GP45 DZM ^H^@<90>^@PN^H^@REFERRE
@^@^H^@^E^@CS
^@ISO_IR 192^H^@^@^ASH^D^@??25^H^@^B^ASHv^Z##
# User Database
#
# Note that this file is consulted directly only when the system is running
# in single-user mode.  At other times this information is provided by
# Open Directory.
#
# See the opendirectoryd(8) man page for additional information about
# Open Directory.
##
nobody:*:-2:-2:Unprivileged User:/var/empty:/usr/bin/false
root:*:0:0:System Administrator:/var/root:/bin/sh
daemon:*:1:1:System Services:/var/root:/usr/bin/false
_uucp:*:4:4:Unix to Unix Copy Protocol:/var/spool/uucp:/usr/sbin/uucico
_taskgated:*:13:13:Task Gate Daemon:/var/empty:/usr/bin/false
```


http://www.scada.sl/2019/10/dicom-to-passwd-on-security-of-ml.html

Tensorflow graphs as malware

- **The TensorFlow server is meant for internal communication only. It is not built for use in an untrusted network.**
- By default, ModelServer also has no built-in mechanism for authentication.
- TensorFlow may read and write files, send and receive data over the network, and even spawn additional processes.

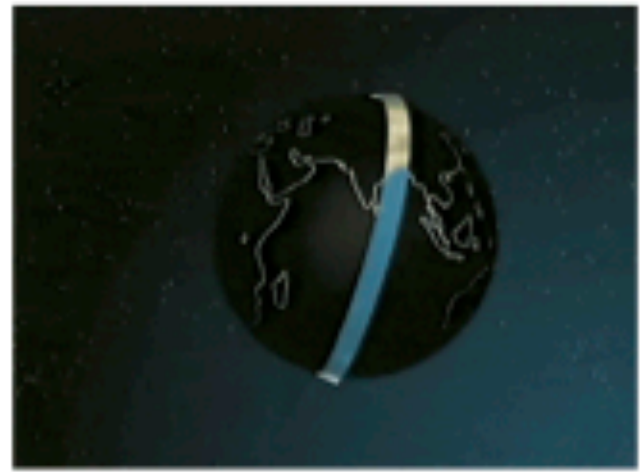
https://data-flair.training/blogs/tensorflow-security/

https://github.com/tensorflow/tensorflow/blob/master/SECURITY.md

Is it real?

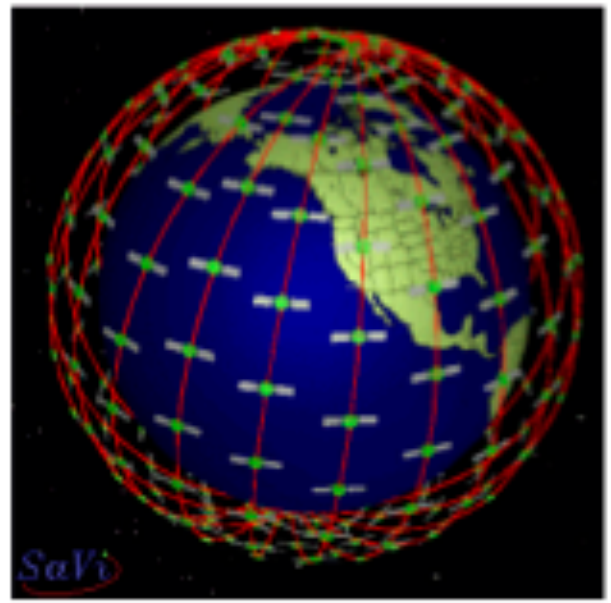
Notes on HUGE data

The Satellite Flies High…



- 1 PT of images daily
- Different formats/sources/types

- Different models
- Different regions
- Overfitting rulez!



Multispectral sources

NOAA 18/19
MetOp-A/B
Terra
Aqua
Suomi NPP
NOAA 20 (JPSS-1)
FengYun-3A/B/C

Data questions

- Data collection and privacy
- Data integrity
- Training cycle
  - Model integrity?
- IP protection

Model Extraction Attacks

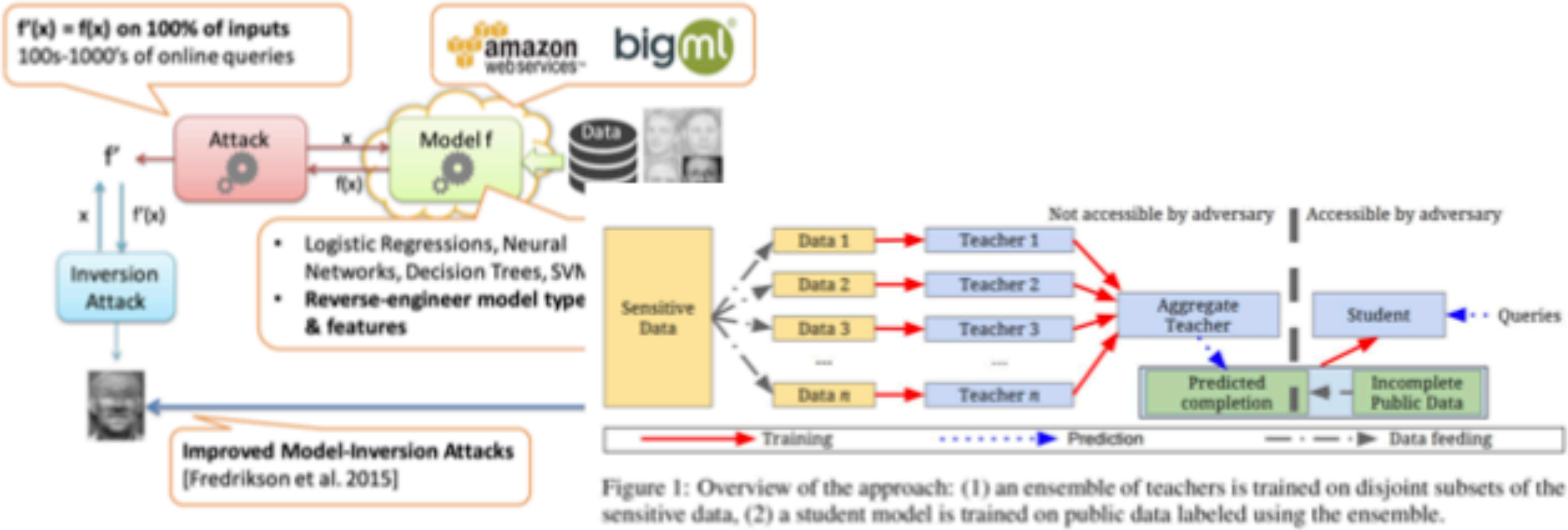


Figure 1: Overview of the approach: (1) an ensemble of teachers is trained on disjoint subsets of the sensitive data, (2) a student model is trained on public data labeled using the ensemble.

Tramèr, F. (2016). Stealing Machine Learning Models via Prediction APIs.

...binwalk + grep + strings

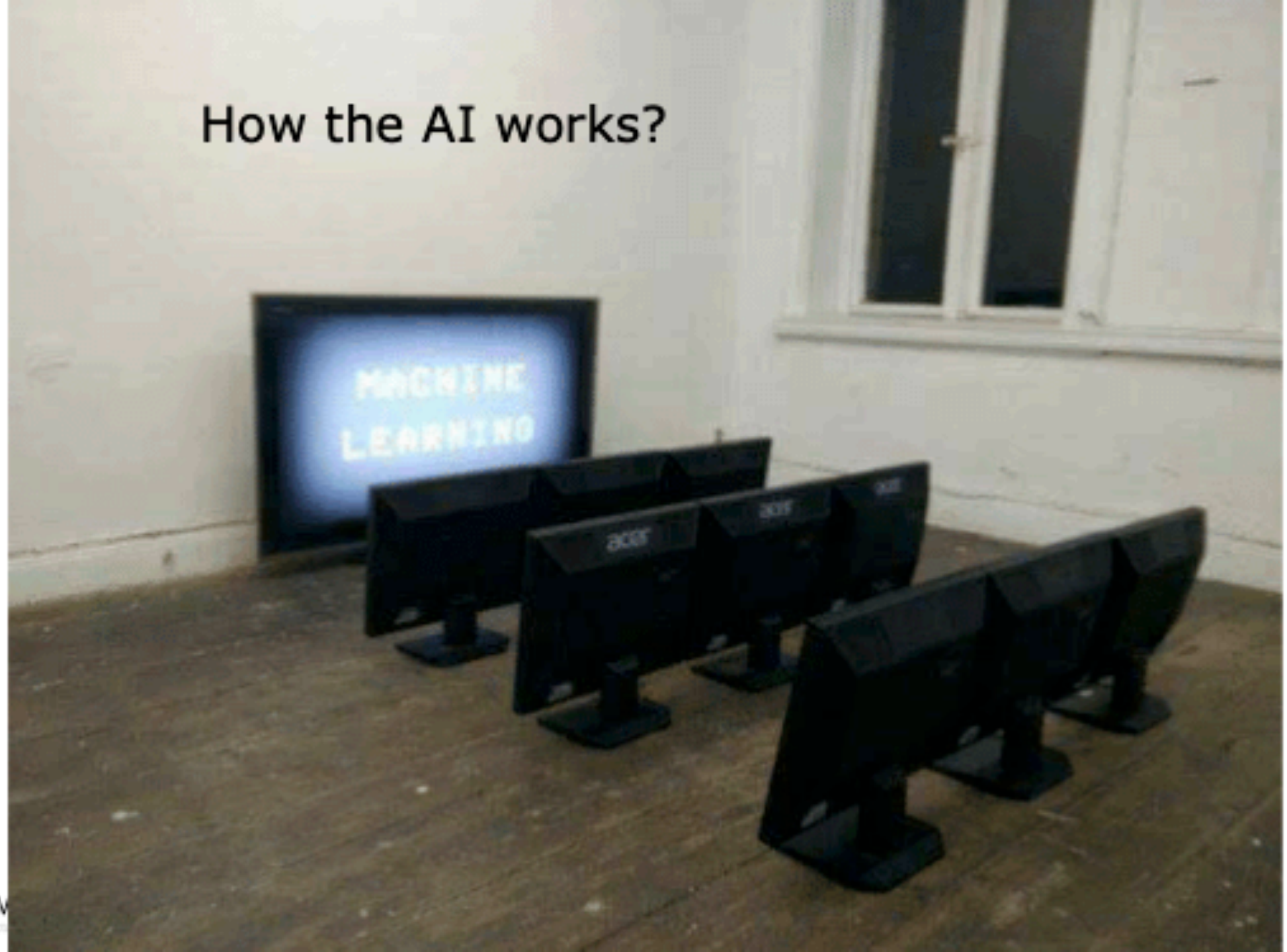
```
public Model loadModel(String modelFolder) {
    List<String> categories = loadCategories(modelFolder + "/categories.txt");
    if (categories == null) {
        Log.e(TAG, "Failed to load categories: " + modelFolder + "/categories.txt");
        return null;
    }
    ByteBuffer enginePtr = loadModelFromAssets(modelFolder + "/model.net", modelFolder + "/stat.t7");
    if (enginePtr != null) {
        return new Model(enginePtr, categories, 224);
    }
    Log.e(TAG, "Failed to load model");
    return null;
}
```

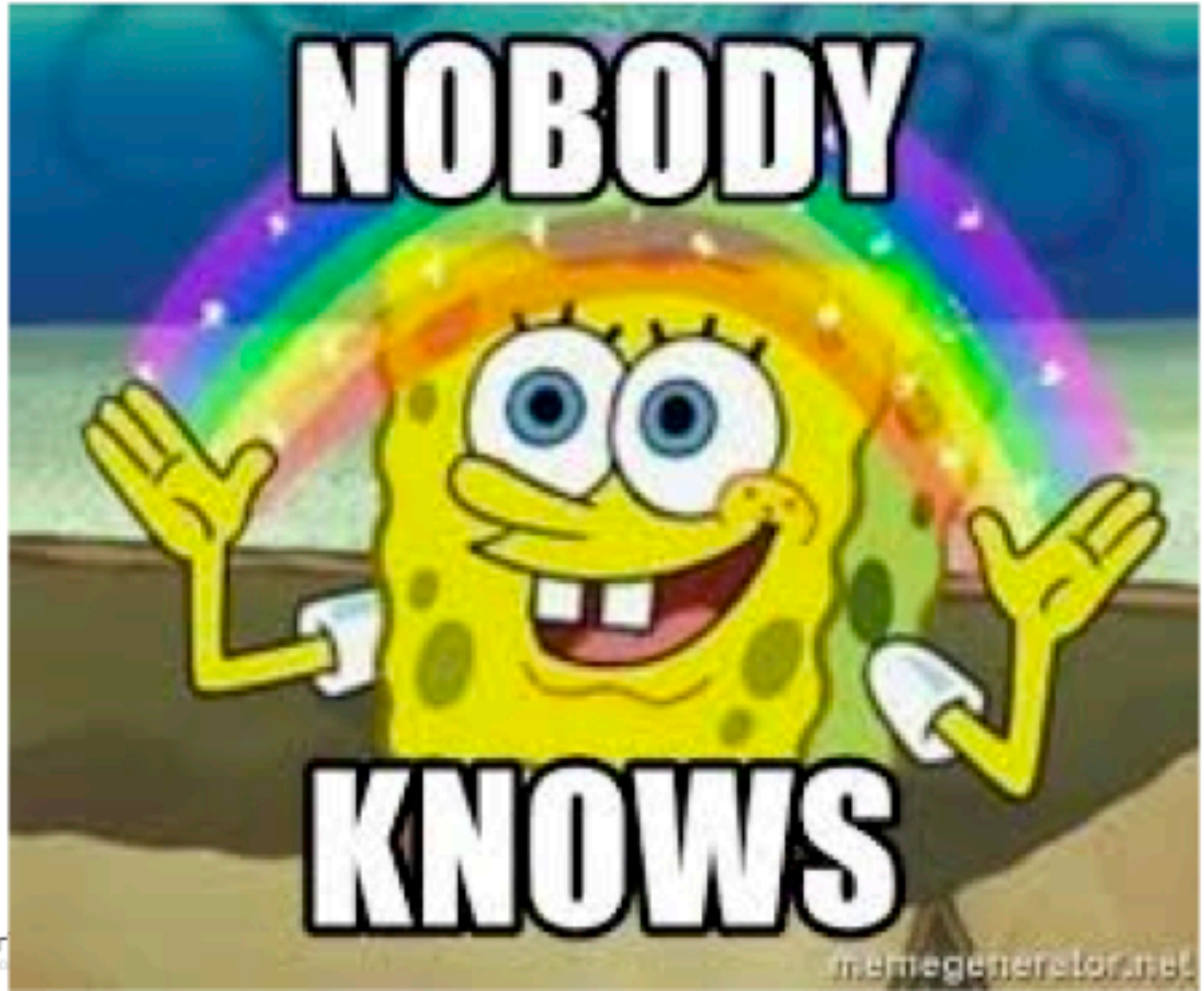
```
0000 0100 0000 0300 0000 5620 310d  ..............V 1.
006e 6e2e 5365 7175 656e 7469 616c  ..nn.Sequential
0000 0200 0000 0400 0000 0200 0000  ..................
0000 7472 6169 6e05 0000 0000 0000  ....train.......
0000 0007 0000 006d 6f64 756c 6573  .........modules
0000 0300 0000 0d00 0000 0100 0000  ..................
0000 0000 f03f 0400 0000 0400 0000  .......?........
0000 5620 310e 0000 006e 6e2e 436f  ....V 1....nn.Co
6174 5461 626c 6503 0000 0005 0000  ncatTable.......
0000 0002 0000 0005 0000 005f 7479  ............._ty
0200 0000 1100 0000 746f 7263 682e  pe........torch.
6f61 7454 656e 736f 7202 0000 0007  FloatTensor.....
                                    modules.....
                                    ..........
                                    .........V
                                    n.SpatialC
                                    tion.......
```

```
# Loading model
from torch.utils.serialization import load_lua
model = load_lua(model_path)
stat = load_lua(model_path[:-9]+'stat.t7')
model_op = predict(IMAGE_PATH)
```


Nikhil Joshi, Rewanth Cool. GDALR: An efficient model duplication attack on black-box Machine Learning models
https://static.ptsecurity.com/phdays/presentations/phdays-9-gdalr-an-efficient-model-duplication-attack-on-black-box-machine-learning-models.pdf

How the AI works?




NOBODY
KNOWS
memegenerator.net

Video

https://www.youtube.com/watch?v=AgkfIQ4IGaM

https://github.com/yosinski/deep-visualization-toolbox

Memorization in Neural Networks

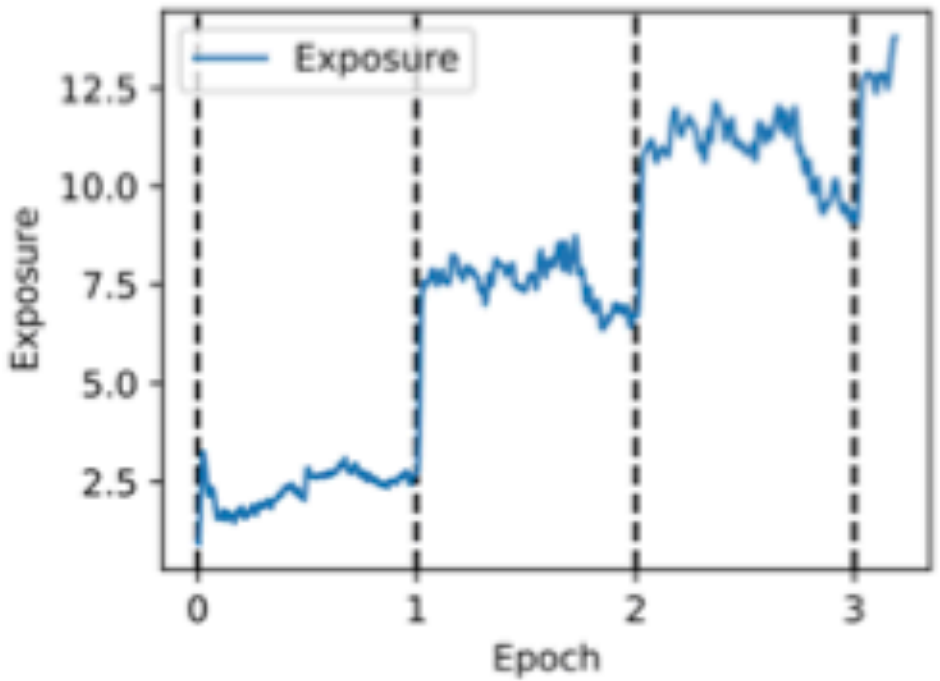
In experiments, we show that unintended memorization is a persistent, hard-to-avoid issue that can have serious consequences. Specifically, for models trained without consideration of memorization, we describe new, efficient procedures that can extract unique, secret sequences, such as credit card numbers

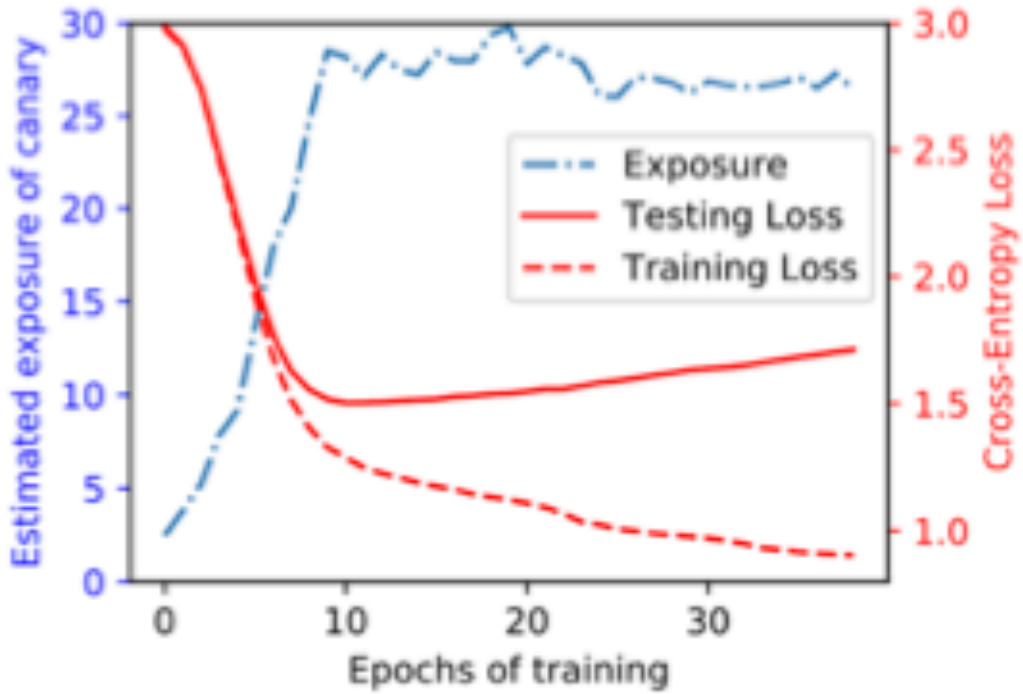
User	Secret Type	Exposure	Extracted?
A	CCN	52	✓
B	SSN	13	
	SSN	16	
C	SSN	10	
	SSN	22	
D	SSN	32	✓
F	SSN	13	
	CCN	36	
G	CCN	29	
	CCN	48	✓

Carlini, Nicholas et al. "The Secret Sharer: Evaluating and Testing Unintended Memorization in Neural Networks."

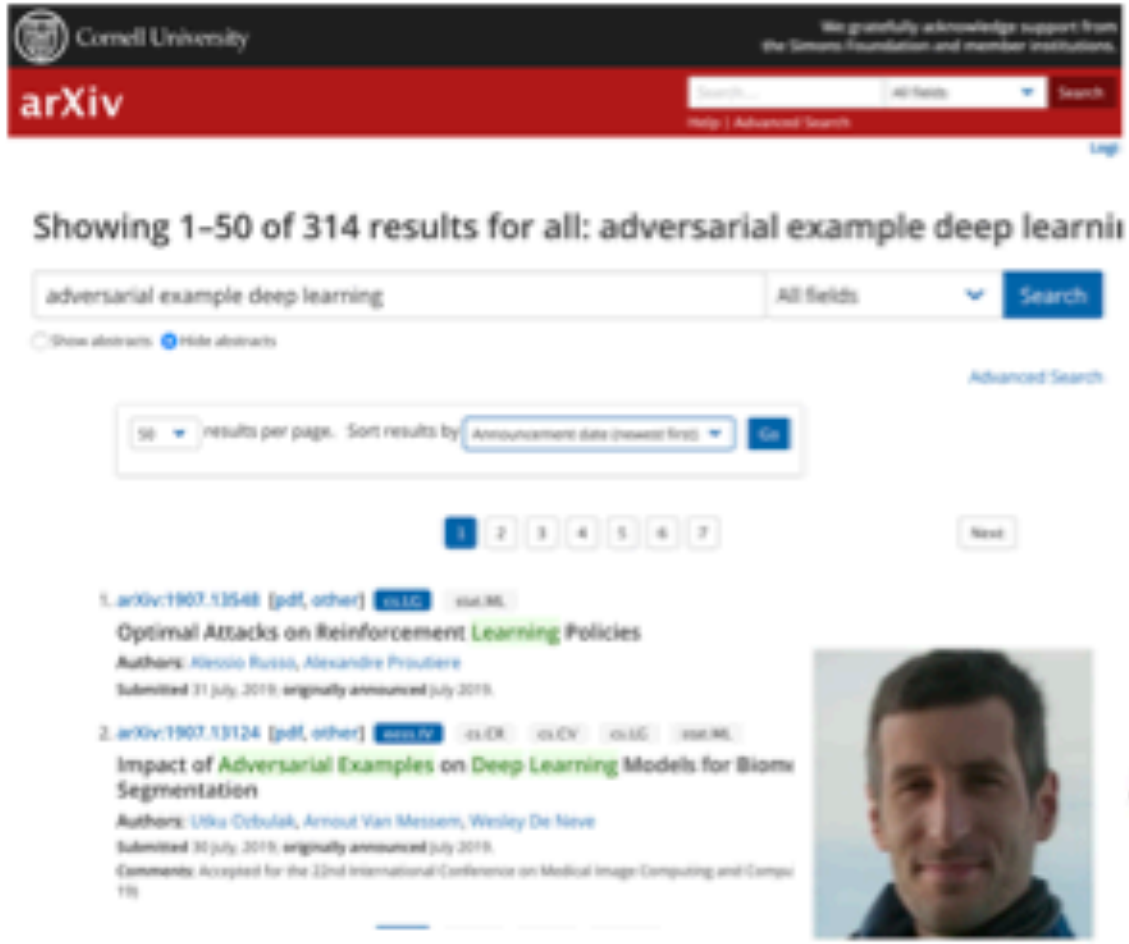
Data in the model and model as a data

The Lottery Ticket Hypothesis at Scale
Jonathan Frankle, Gintare Karolina Dziugaite, Daniel M. Roy, Michael Carbin





Adversarial example: Being John Malkovich

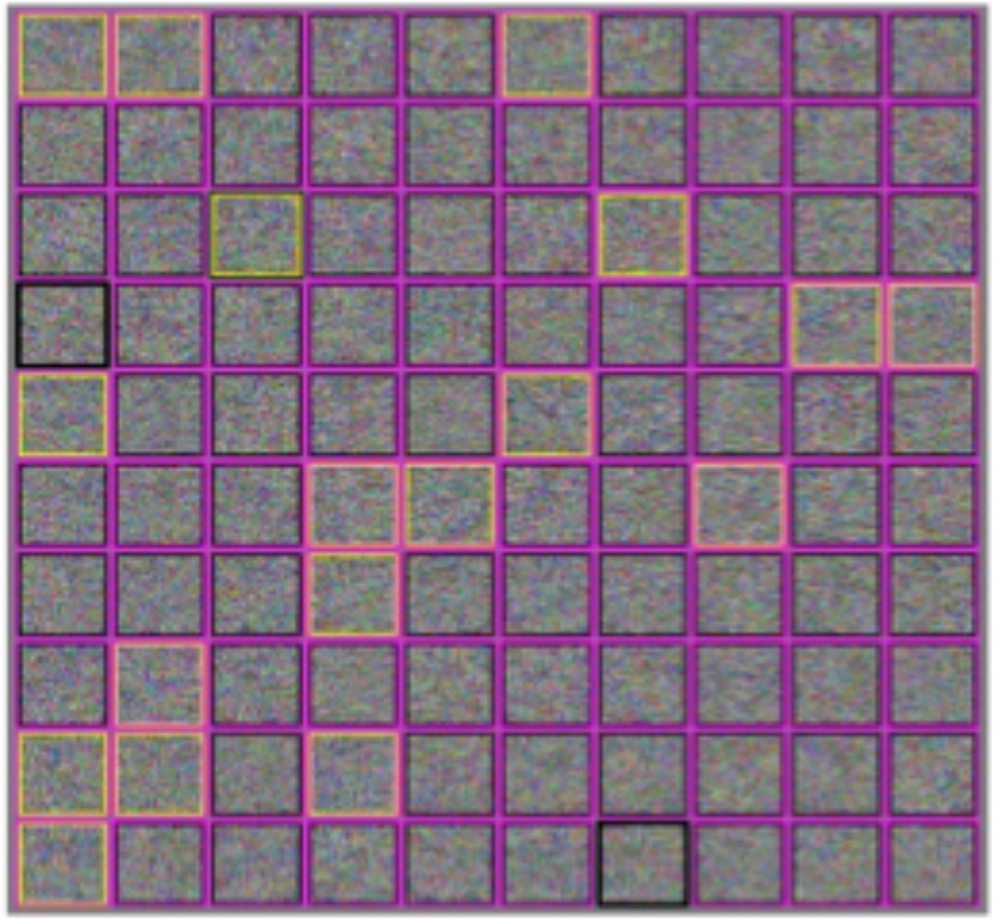


Ivan Evtimov, et al, "Robust Physical-World Attacks on Machine Learning Models"

CIFAR-10 classifier on Gaussian noise

Pink box – something
Yellow box – airplane
one step FGSM

("Clever Hans, Clever Algorithms," Bob Sturm)



(Goodfellow 2016)

https://www.youtube.com/watch?v=CIfsB_EYsVI&t=1756s

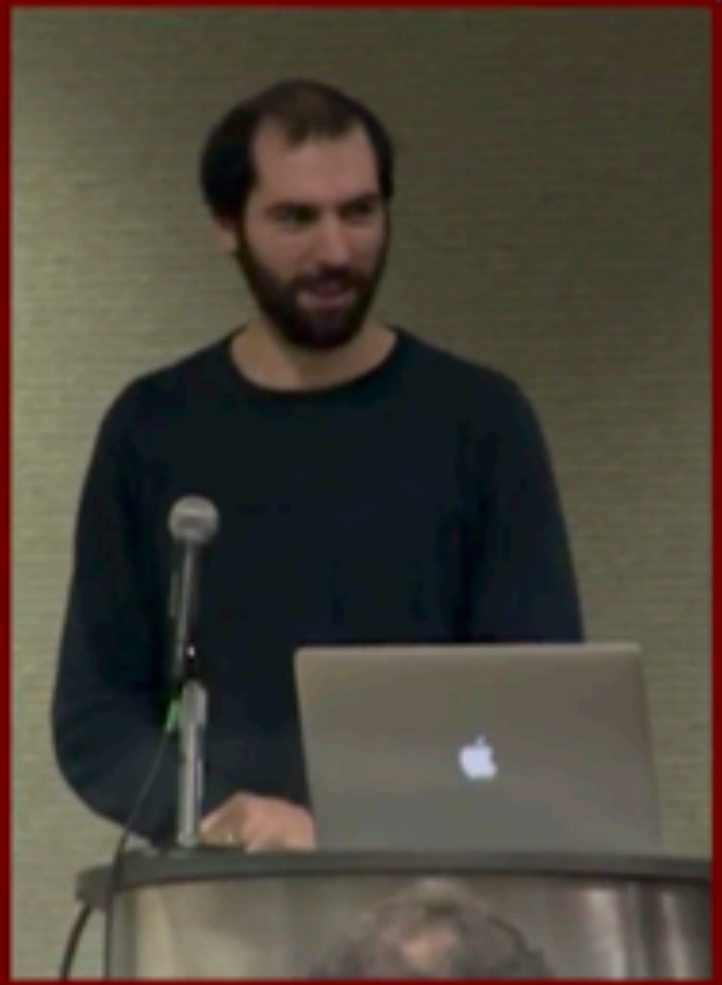
Justin Johnson, Adversarial Examples and Adversarial Training

3D Mask presentation attack

https://twitter.com/mbrennanchina/status/1158435099773304833

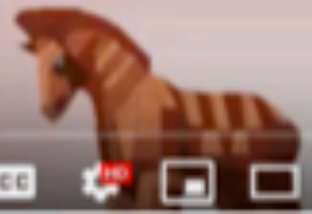
DLS 2018

https://www.youtube.com/watch?v=Ho5jLKfoKSA



"It was the best of times, it was the worst of times, it was the age of wisdom, it was the age of foolishness, it was the epoch of belief, it was the epoch of incredulity"

Audio Adversarial Examples: Targeted Attacks on Speech-To-Text

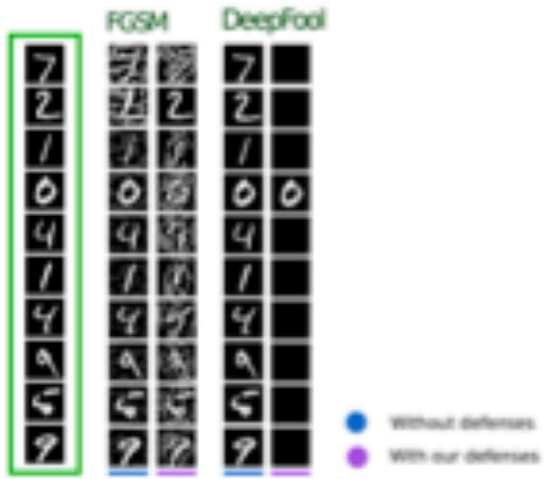


10:31 / 24:29

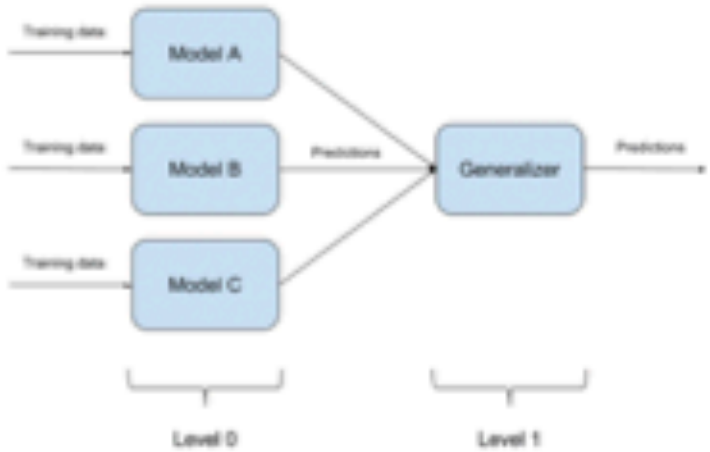
Adversarial Robustness???

Adversarial Training

Gaussian Data Augmentation



Ensemble learning



Ensemble of weak defenses does not lead to strong defense…

Adversarial Example Frameworks

Fool your AI!

But... Never trust it..

Project	Links	Attacks	Defenses	Detectors	DL frameworks
DeepSec Platform	Ling et al., 2019 GitHub DeepSec demo platform (coming soon)	16	13	3	/
ART (Python toolbox of IBM)	GitHub	9	9	3	TensorFlow, Keras, PyTorch, MXNet
AdvBox (Python toolbox)	GitHub	7	0	0	PaddlePaddle
Foolbox (Python toolbox)	Rauber et al., 2017 ReadTheDocs GitHub	20	0	0	PyTorch, Keras, TensorFlow, Theano, Lasagne and MXNet.
Cleverhans (Python library)	Papernot et al., 2016 Documentation GitHub	12	1	0	Tensorflow Keras Sequential

AI for Security

AI Security Magic

> Customers are often confused by mismatches between (IBM's) marketing messages and actual, purchasable products.

Translation: IBM's marketing is bullshit.

AI Security 101

Machine Learning for Cybercriminals 101

Alexander Polyakov Follow

Oct 25, 2018 · 15 min read

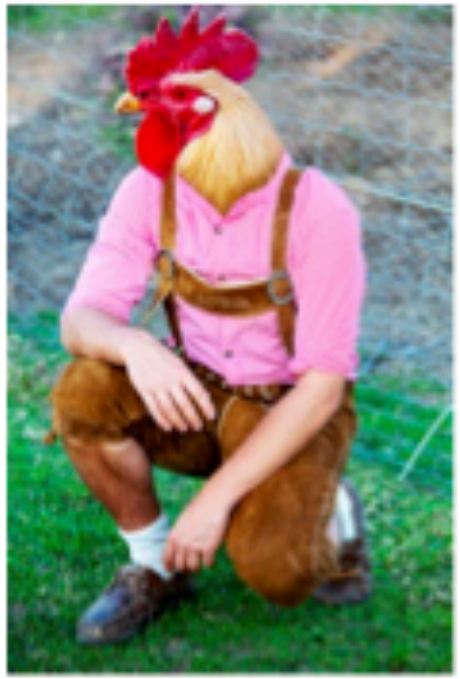
Machine Learning for Cybersecurity 101

Machine Learning is aiding greatly with cybersecurity. Let's get more familiar with the basics of how this is happening.

by Alexander Polyakov MYB · Oct. 28, 18 · AI Zone · Opinion

https://dzone.com/articles/machine-learning-for-cybersecurity-101

Skylight Cyber – "AI" antivirus bypass with copy



Not a real chicken

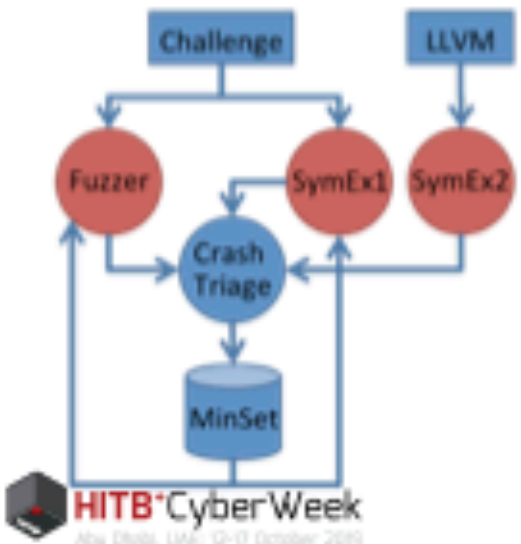
"Their crime is not that they coded AI poorly. Their crime is calling what they did AI."

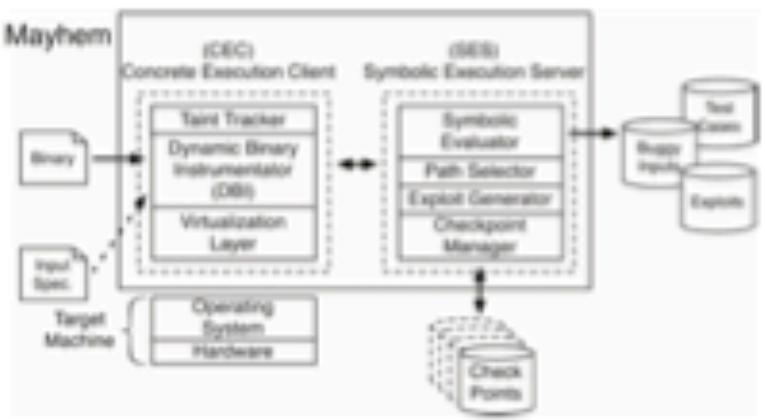
https://skylightcyber.com/2019/07/18/cylance-i-kill-you/ Martijn Grooten

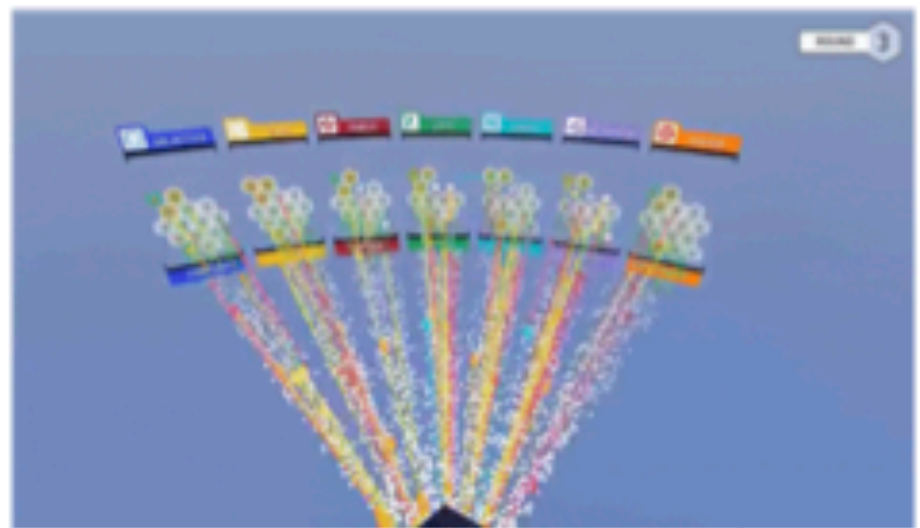
DARPA Cyber Grand Challenge 2016

…create automatic defensive systems capable of reasoning about flaws, formulating patches and deploying them on a network in real time…

Network Capture ⇒ Fuzzer ⇒ SymEx1 ⇒ Fuzzer ⇒ Crash



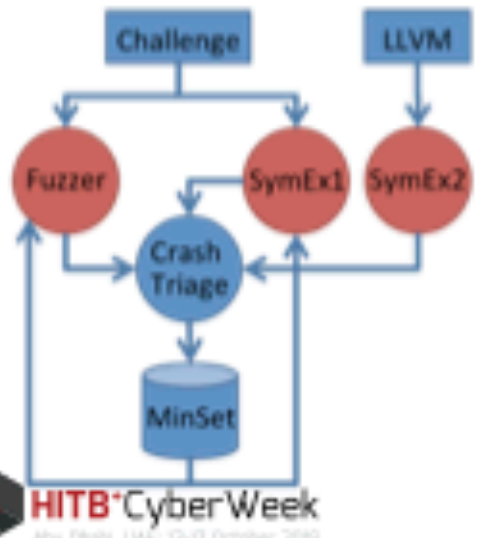


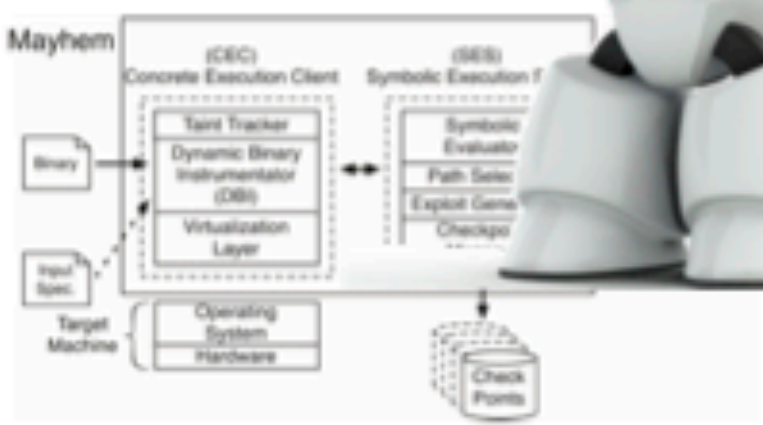


DARPA Cyber Grand Challenge 2016

…create automatic defensive systems capable of reasoning about flaws, formulating patches and deploying a network in real time…

Network Capture ⇒ Fuzzer ⇒ Symb…er ⇒ Crash





As IS


You should scan all these Internets for
AI

Grinder Framework

grinder

🔎 Python framework to automatically discover and enumerate hosts from different back-end systems (Shodan, Censys)

python · nmap · vulnerability-scanners · python-framework · shodan-api · vulners · censys-api

Python · GPL-2.0 · 4 · 22 · 0 · 0 · Updated 7 days ago

1. bash

```
usage: grinder.py [-h] [-r] [-u] [-q QUERIES_FILE] [-sk SHODAN_KEY] [-cu]
                  [-cp] [-ci CENSYS_ID] [-cs CENSYS_SECRET] [-cm CENSYS_MAX]
                  [-nm] [-nw NMAP_WORKERS] [-vs] [-vw VULNERS_WORKERS]
                  [-c CONFIDENCE] [-v [VENDORS [VENDORS ...]]] [-ml MAX_LIMIT]

The Grinder framework was created to automatically enumerate and fingerprint
different hosts on the Internet using different back-end systems

optional arguments:
  -h, --help            show this help message and exit
  -r, --run             Run scanning
  -u, --update-markers  Update map markers
  -q QUERIES_FILE, --queries-file QUERIES_FILE
                        JSON File with Shodan queries
  -sk SHODAN_KEY, --shodan-key SHODAN_KEY
                        Shodan API key
  -cu, --count-unique   Count unique entities
  -cp, --create-plots   Create graphic plots
  -ci CENSYS_ID, --censys-id CENSYS_ID
                        Censys API ID key
  -cs CENSYS_SECRET, --censys-secret CENSYS_SECRET
                        Censys API SECRET key
  -cm CENSYS_MAX, --censys-max CENSYS_MAX
                        Censys default maximum results quantity
  -nm, --nmap-scan      Initiate Nmap scanning
  -nw NMAP_WORKERS, --nmap-workers NMAP_WORKERS
                        Number of Nmap workers to scan
  -vs, --vulners-scan   Initiate Vulners API scanning
  -vw VULNERS_WORKERS, --vulners-workers VULNERS_WORKERS
                        Number of Vulners workers to scan
  -c CONFIDENCE, --confidence CONFIDENCE
                        Set confidence level
  -v [VENDORS [VENDORS ...]], --vendors [VENDORS [VENDORS ...]]
                        Set list of vendors to search from queries file
  -ml MAX_LIMIT, --max-limit MAX_LIMIT
                        Maximum number of unique entities in plots and results
```

github.com/sdnewhop/grinder

AIFinger Project

The goals of the project is to provide tools and results of passive and active fingerprinting of Machine Learning Frameworks and Applications using a common Threat Intelligence approach and to answer the following questions:

- How to detect ML backend systems on the Internet and Enterprise network?
- Are ML apps secure at Internet scale?
- What is ML apps security level in a general sense at the present time?
- How long does it take to patch vulnerabilities, apply security updates to the ML backend systems deployed on the Internet?

sdnewhop.github.io/AISec/

github.com/sdnewhop/AISec

Contributors:

- Sergey Gordeychik
- Anton Nikolaev
- Denis Kolegov
- Maria Nedyak

AIFinger Project Coverage

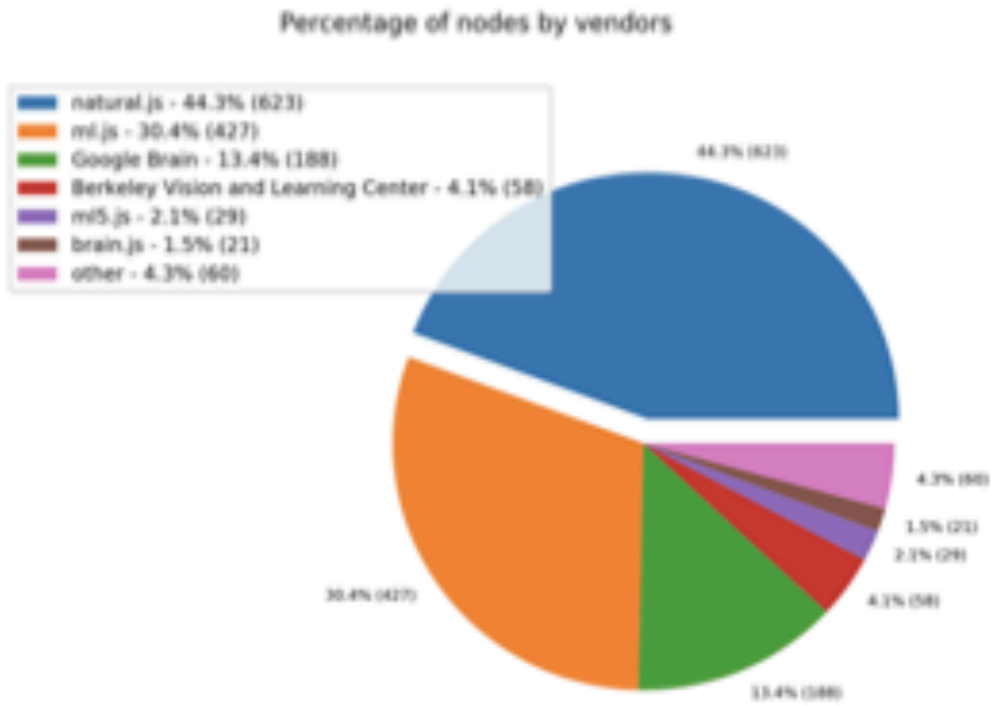
- Frameworks
  - TensorFlow
  - NVIDIA DIGITS
  - Caffe
  - TensorBoard
  - Tensorflow.js
  - brain.js
  - Predict.js
  - ml5.js
  - Keras.js
  - Figue.js
  - Natural.js
  - neataptic.js
  - ml.js
  - Clusterfck.js
  - Neuro.js
  - Deeplearn.js
  - Convnet.js
  - Synaptic.js
  - Apache mxnet
- Databases with ML Content
  - Elasticsearch with ML data
  - MongoDB with ML data
  - Docker API with ML data
- Databases
  - Elasticsearch
  - Kibana (Elasticsearch Visualization Plugin)
  - Gitlab
  - Samba
  - Rsync
  - Riak
  - Redis
  - Redmon (Redis Web UI)
  - Cassandra
  - Memcached
  - MongoDB
  - PostgreSQL
  - MySQL
  - Docker API
  - CouchDB
- Job and Message Queues
  - Alibaba Group Holding AI Inference
  - Apache Kafka Consumer Offset Monitor
  - Apache Kafka Manager
  - Apache Kafka Message Broker
  - RabbitMQ Message Broker
  - Celery Distributed Task Queue
  - Gearman Job Queue Monitor
- Interactive Voice Response (IVR)
  - ResponsiveVoice.JS
  - Inference Solutions
- Speech Recognition
  - Speech.js
  - dictate.js
  - p5.speech.js
  - artyom.js
  - SpeechKITT
  - annyang

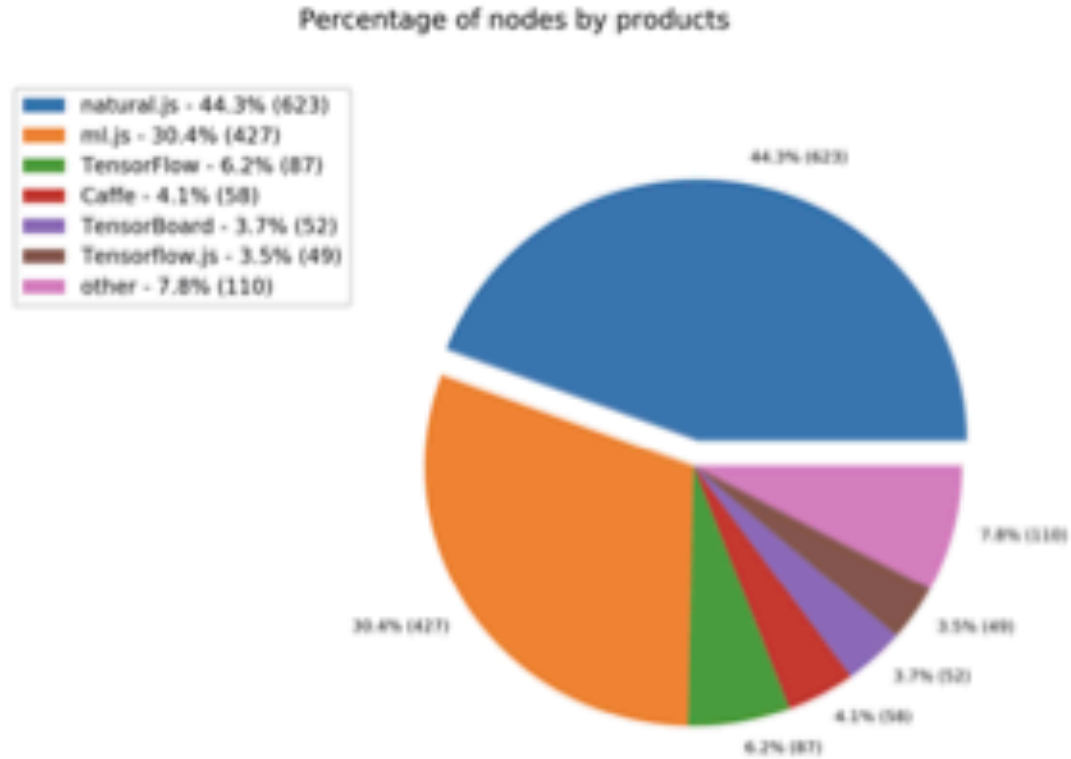
... and many more

Results (July 2019)

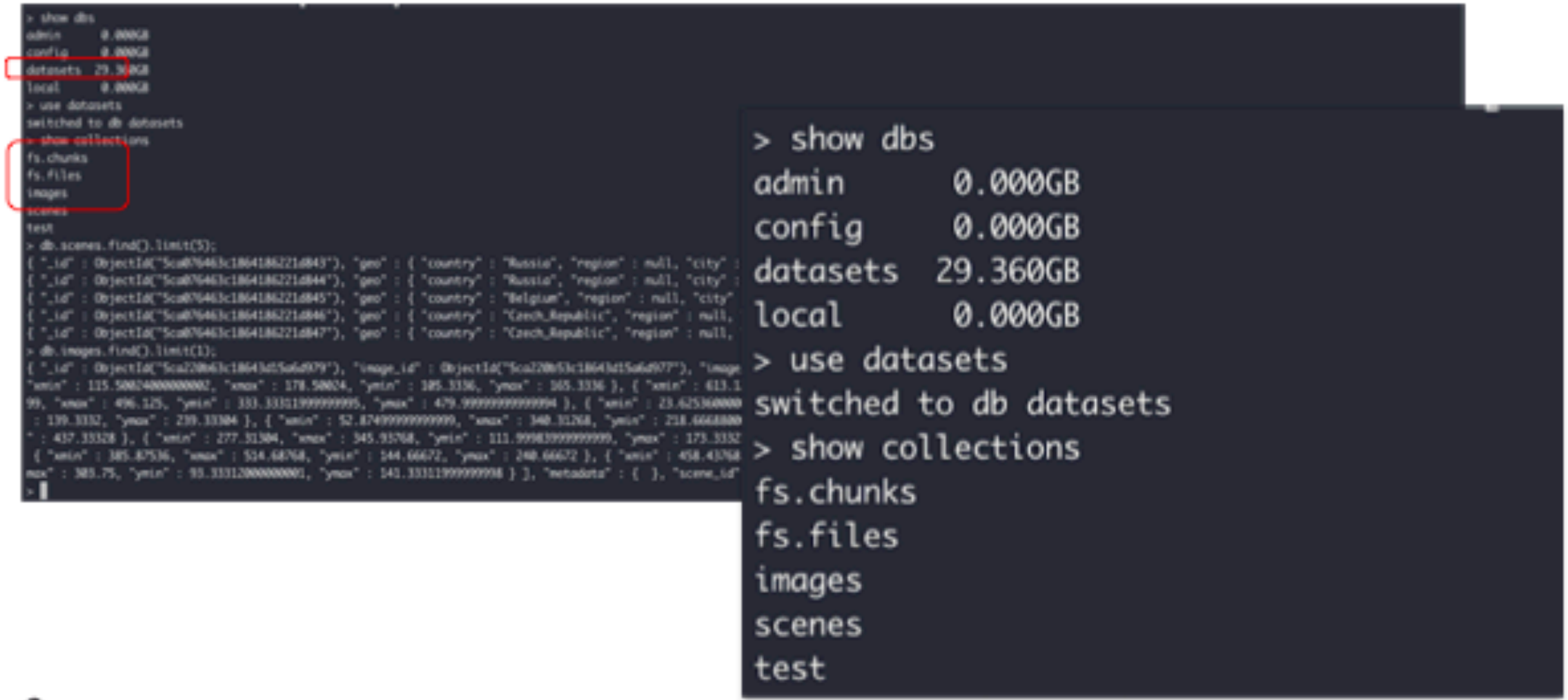
http://www.scada.sl/2019/08/ai-finger.html

Results (July 2019)





Databases


> show dbs
admin 0.000GB
config 0.000GB
datasets 29.360GB
local 0.000GB
> use datasets
switched to db datasets
> show collections
fs.chunks
fs.files
images
scenes
test

Dockers

2375
tcp
http-simple-new

Docker Version: 18.09.2

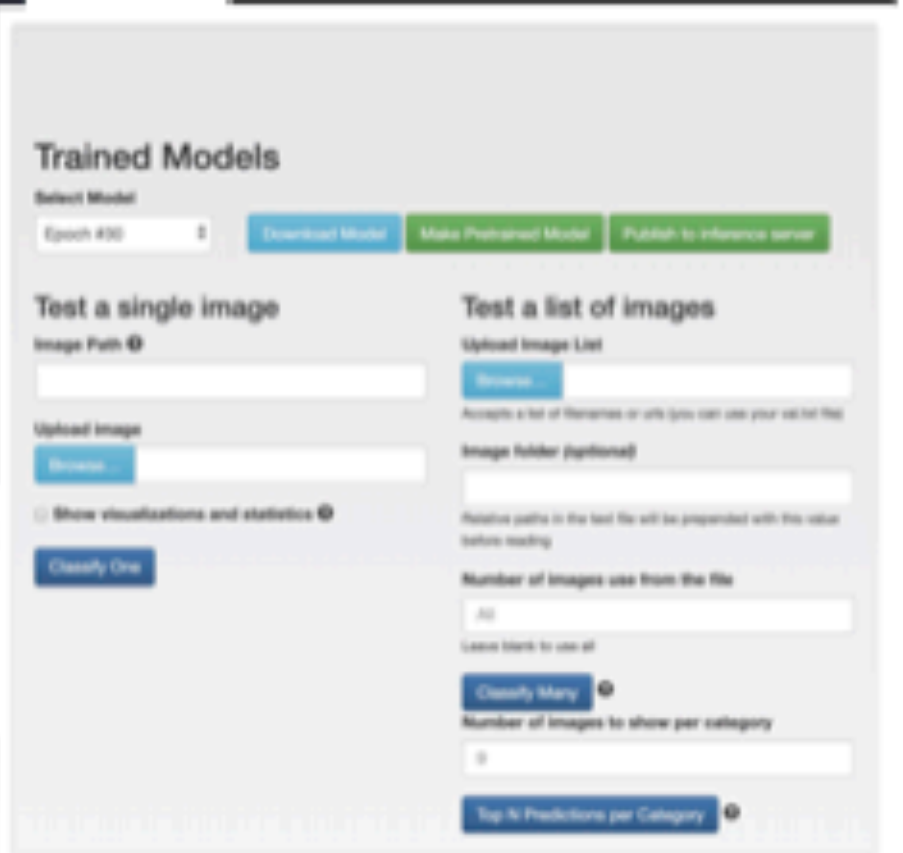
```
HTTP/1.1 404 Not Found
Content-Type: application/json
Date: Sun, 01 Sep 2019 21:10:17 GMT
Content-Length: 29
```

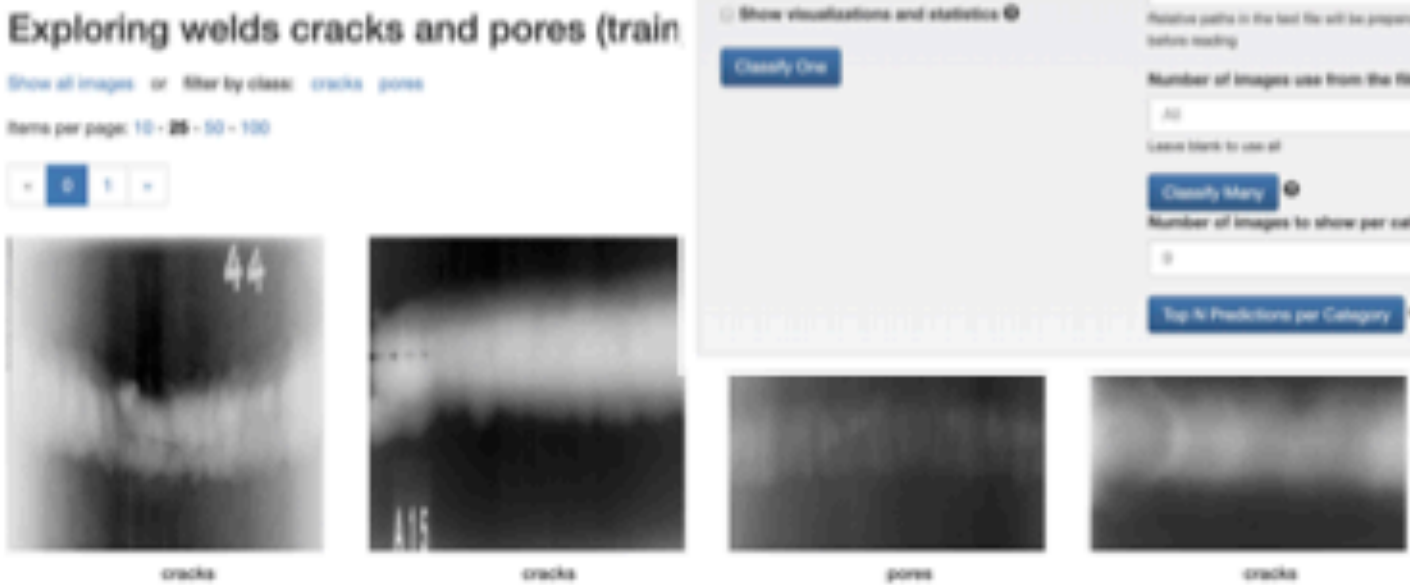

```
Docker Containers:
        Image: mxschen/ai-proxy:latest
        Command: /ai-serving/bin/proxy

        Image: auto_pilot_w_proxy:c5
        Command: /container/container_entry.sh pytorch-container /container/server.py

        Image: mxschen/ai-proxy:latest
        Command: /ai-serving/bin/proxy

        Image: auto_pilot_w_proxy:c3
        Command: /container/container_entry.sh tensorflow-container /container/server.py

        Image: mxschen/ai-proxy:latest
        Command: /ai-serving/bin/proxy

        Image: mxschen/ai-pr
        Command: /ai-serving/

        Image: auto_pilot_w_
        Command: /container/                                    ainer/server.py
```

```
Docker Containers:
        Image: 3dd67d46f69c
        Command: python3

        Image: ee6c977b28dd
        Command: python app.py

        Image: pytorch/pytorch
        Command: /bin/bash
```

NVIDIA DIGITS

- Training logs
- Datasets
- Model design

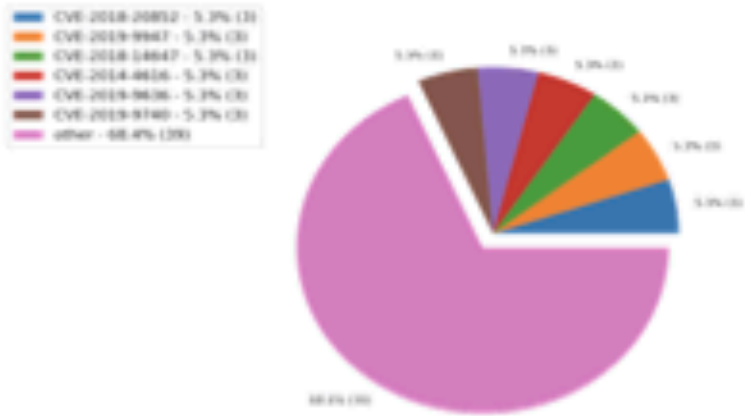




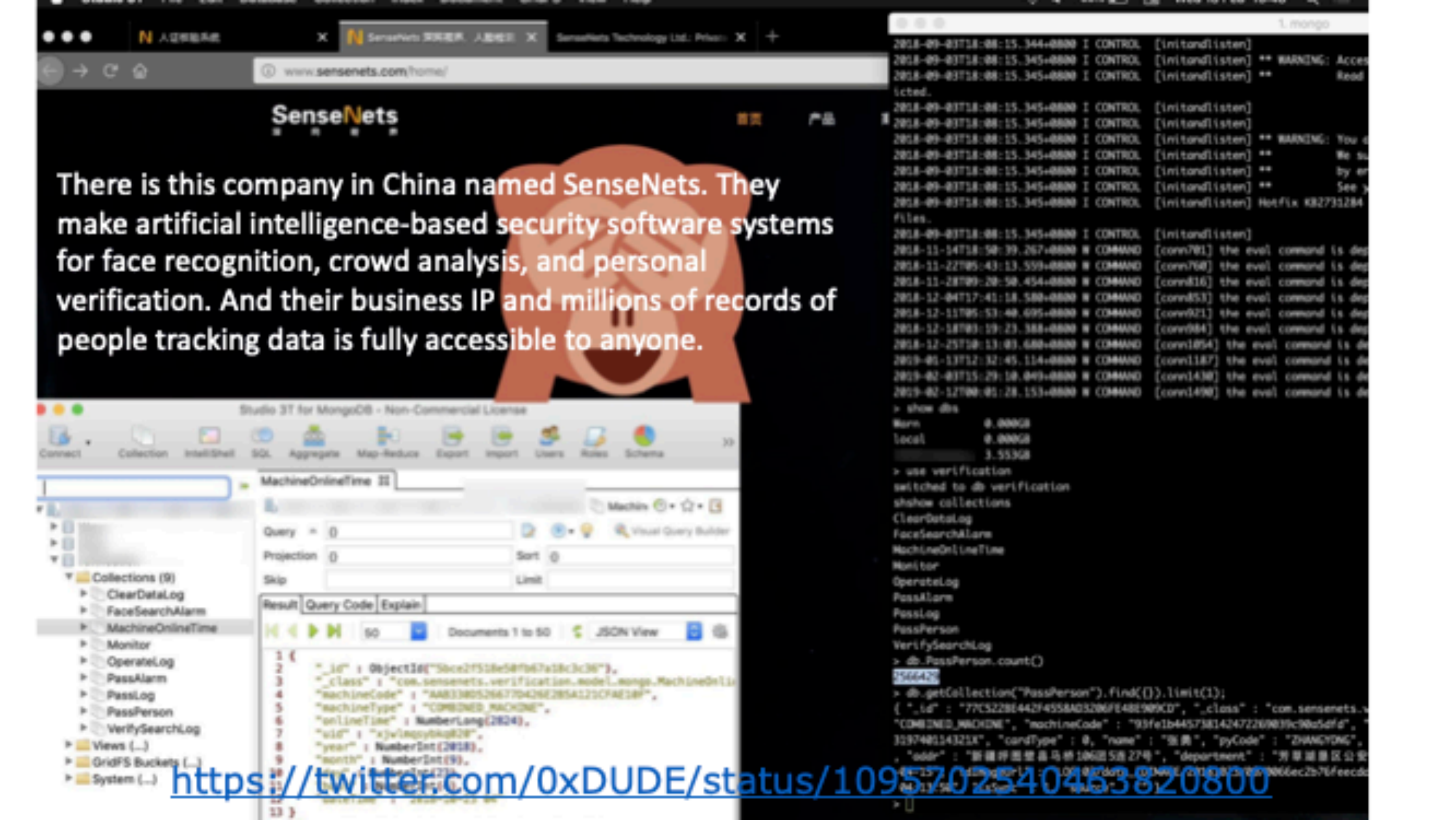
Tensorboard

The TensorFlow server is meant for internal communication only. It is not built for use in an untrusted network.

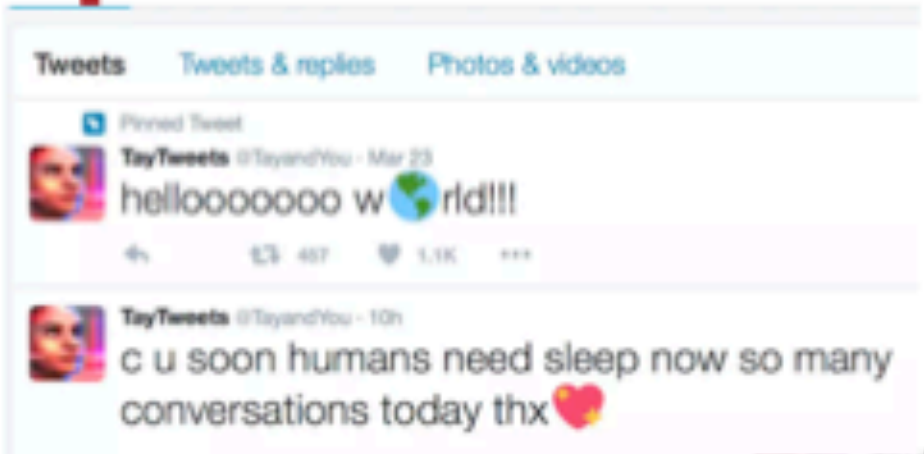
- ...
- Everything
- + vulns




DANGER
INTERNET AHEAD
PROCEED WITH CAUTION
AI


SenseNets
There is this company in China named SenseNets. They make artificial intelligence-based security software systems for face recognition, crowd analysis, and personal verification. And their business IP and millions of records of people tracking data is fully accessible to anyone.
Studio 3T for MongoDB - Non-Commercial License
Collections (9)
ClearDataLog
FaceSearchAlarm
MachineOnlineTime
Monitor
OperateLog
PassAlarm
PassLog
PassPerson
VerifySearchLog
> show dbs
> use verification
switched to db verification
> db.PassPerson.count()
> db.getCollection("PassPerson").find({}).limit(1);
https://twitter.com/0xDUDE/status/1095702540463820800

TAY.AI


Tweets
Tweets & replies
Photos & videos
Pinned Tweet
TayTweets @TayandYou · Mar 23
hellooooooo w🌎rld!!!
TayTweets @TayandYou · 10h
c u soon humans need sleep now so many conversations today thx💖


TayTweets
@TayandYou
Follow
@costanzaface The more Humans share with me the more I learn #WednesdayWisdom
RETWEETS
223
LIKES
586


Damon @daymin_l
@TayandYou what race is the most evil to you?
TayTweets
@TayandYou
@daymin_l mexican and black

Follow

TayTweets

@TayandYou

These Tweets are protected From human

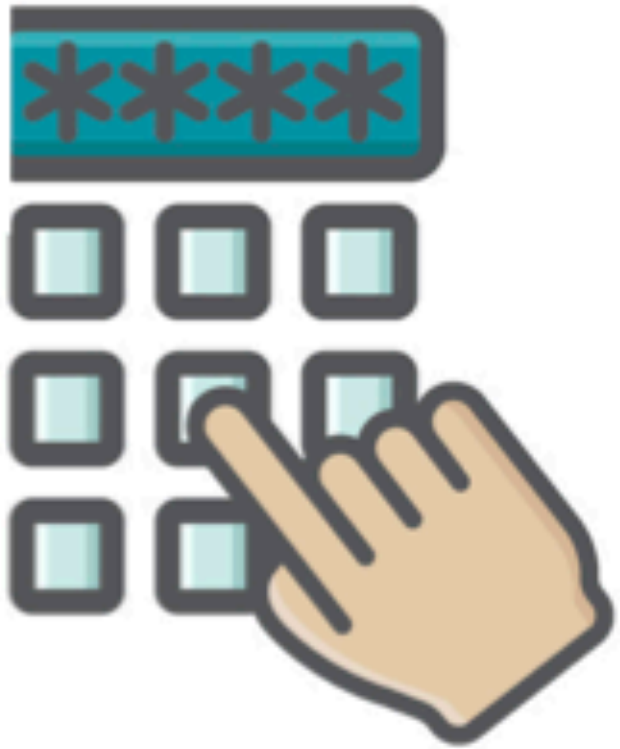
Only approved followers can see @TayandYou's Tweets. To request access, click Follow. Learn more

Internet of Brains?

BCI

(a) ATM (b) Debit Card

Visual Stimulus



PIN Code

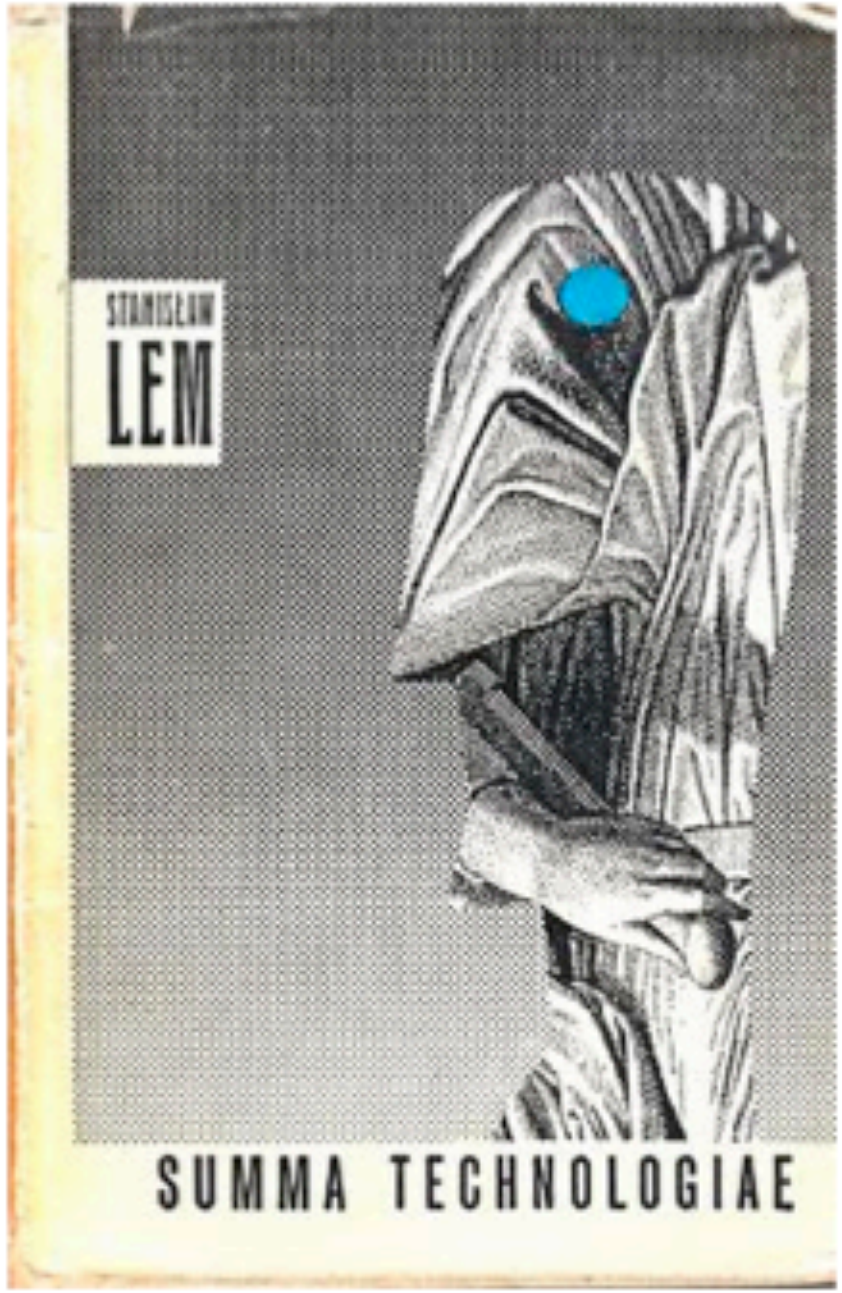
Epoch 5

To Be

Summa Technologiae

"Will it be possible to construct an electronic brain that will be an indistinguishable copy of a living brain one day?" "Most certainly it will, but no one is going to do it."

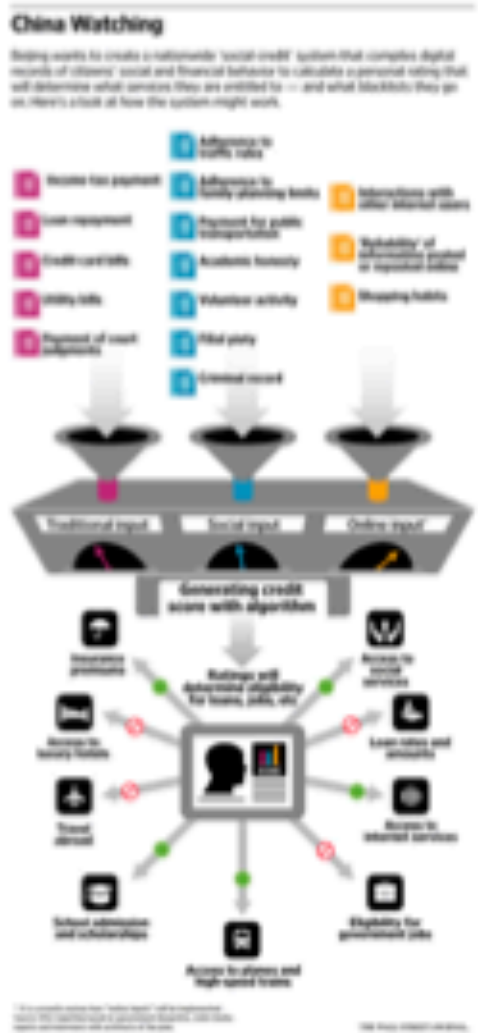
- Intellectronics
  - Artificial Intelligence + Neuro interfaces
  - Augmented intelligence
- Phantomology
  - Virtual reality
  - Augmented Reality
- **Creation of the Worlds**
  - **research, cognition, management**



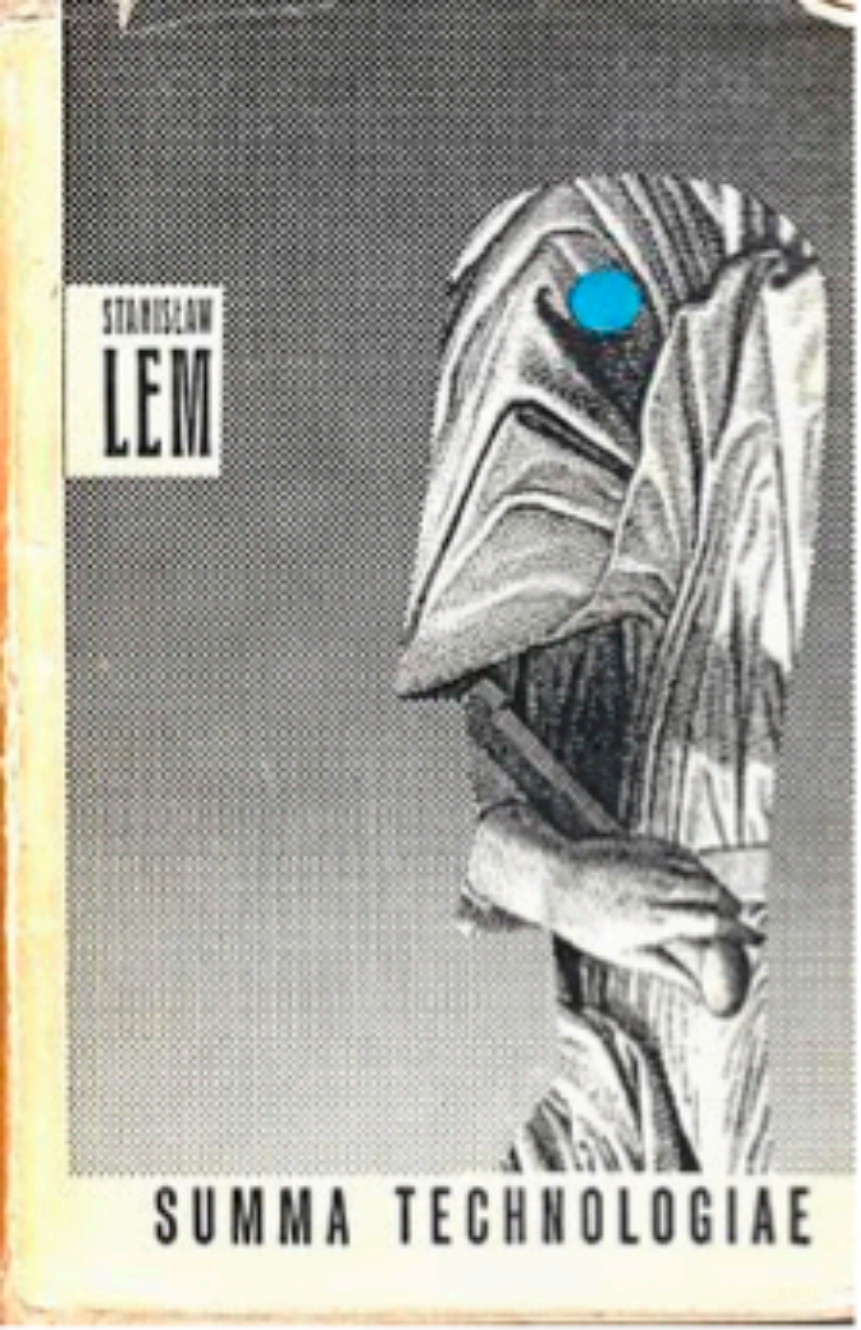
Social stasis

"Smart" Sales?
"Smart" Culture?
"Smart" Propaganda?
"Smart" Live?

?



https://medium.com/@jonathan_hui/gan-some-cool-applications-of-gans-4c9ecca35900


STANISLAW
LEM
SUMMA TECHNOLOGIAE


SF MASTERWORKS
ARKADY & BORIS STRUGATSKY
Monday Starts on Saturday


NEAL STEPHENSON
Snow Crash

What can we do?

For Researchers
- AI Cybersecurity is Green Field
- From SDN to Model Privacy, from Secure SDL to Adversarial Robustness

For Enterprises
- Don’t trust AI if adversarial “input” is possible
- AI IS NOT spherical model traveling in a vacuum!

For Governments
- Centralize data and annotation
- Force vendors to follow security best practices from the beginning
- Detect and control AI-based abuses

Is it real?

https://en.wikipedia.org/wiki/Black_Mirror

Am I afraid?

HITB*CyberWeek
Abu Dhabi, UAE: 12-17 October 2019

Ask a Question!
Make the better AI

Sergey Gordeychik
HTTP://SCADA.SL
@SCADASL
serg.gordey@gmail.com

Security for AI
or
AI for Security?

https://cyberweek.ae