



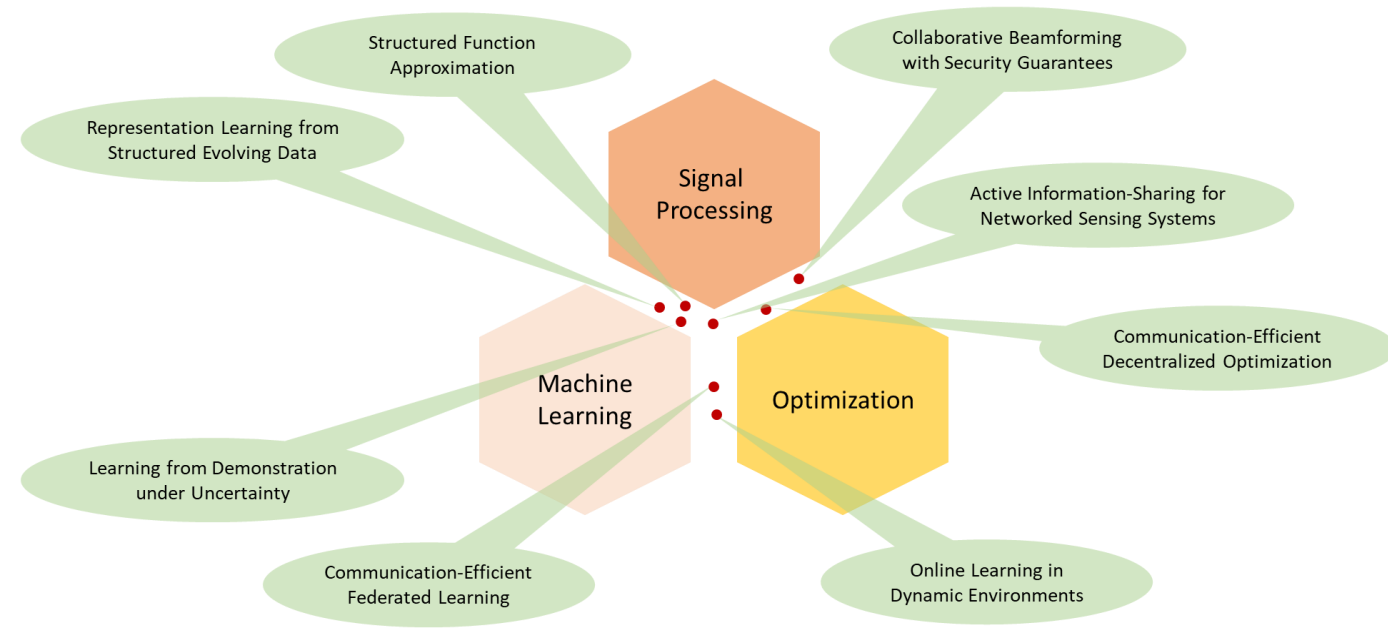
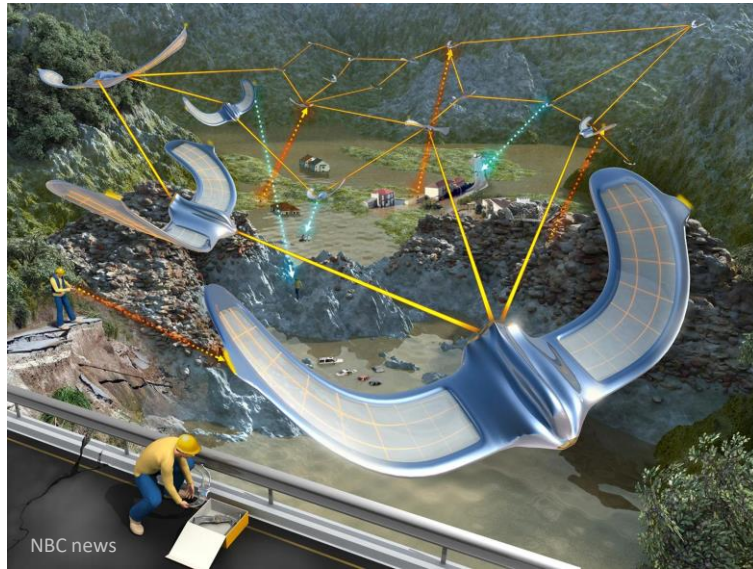
# AI at Scale: Robustness and Security in Adversarial Environments

Abolfazl Hashemi

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Machine Intelligence and Networked Data Science Lab (**MINDS**)

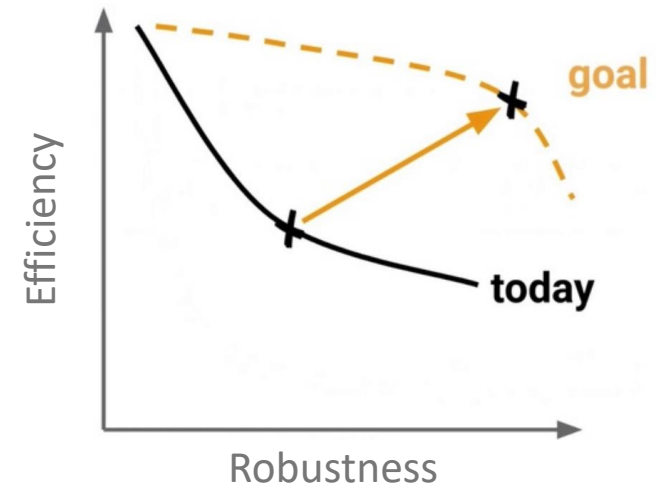
# Collaborative Learning Systems



Hackers Remotely Kill a Jeep on the Highway—With Me in It

ANDY GREENBERG SECURITY 07.21.15 6:00 AM

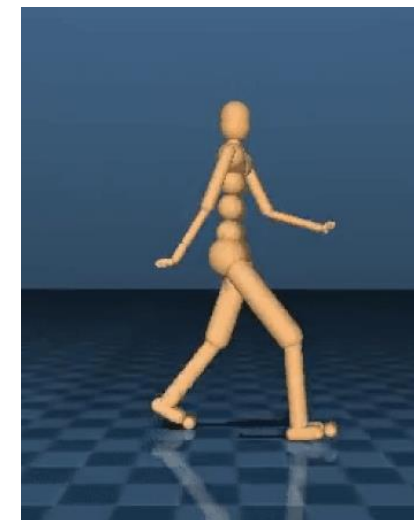
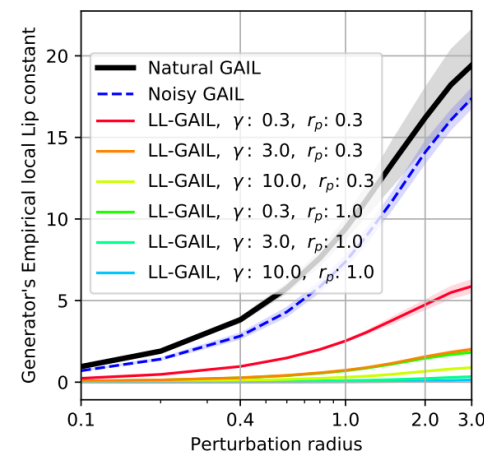
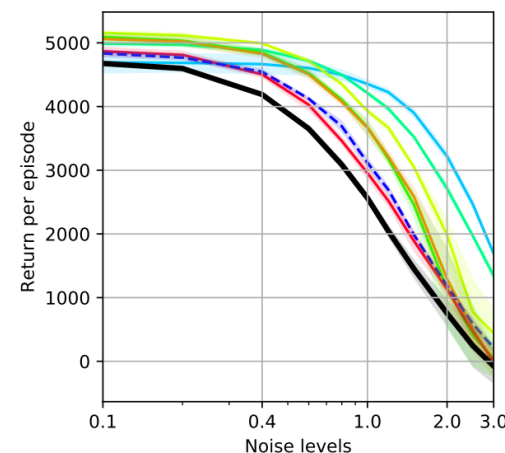
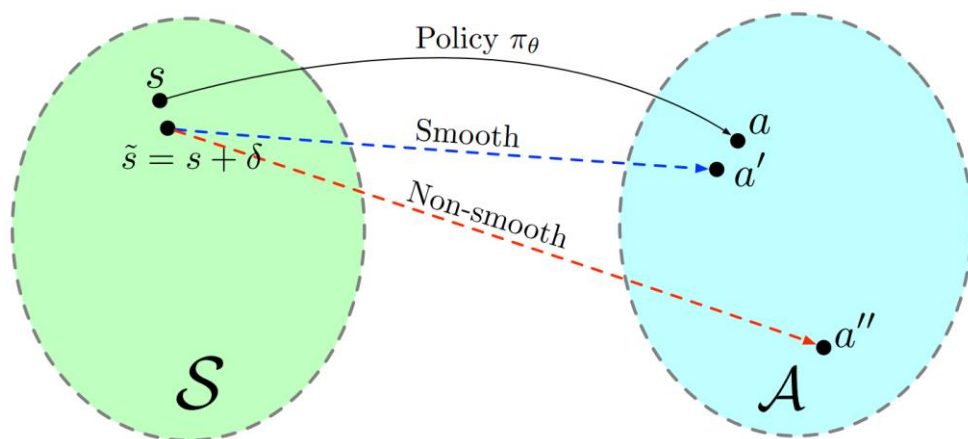
Update: Chrysler recalls 1.4M vehicles after Jeep hack



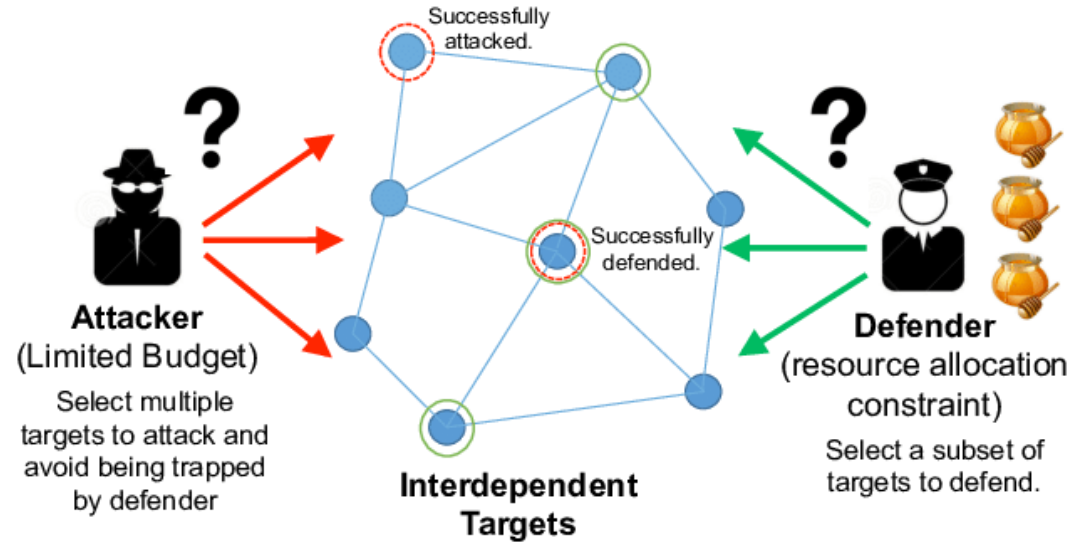
# Online Learning in Adversarial Environment (AFOSR)



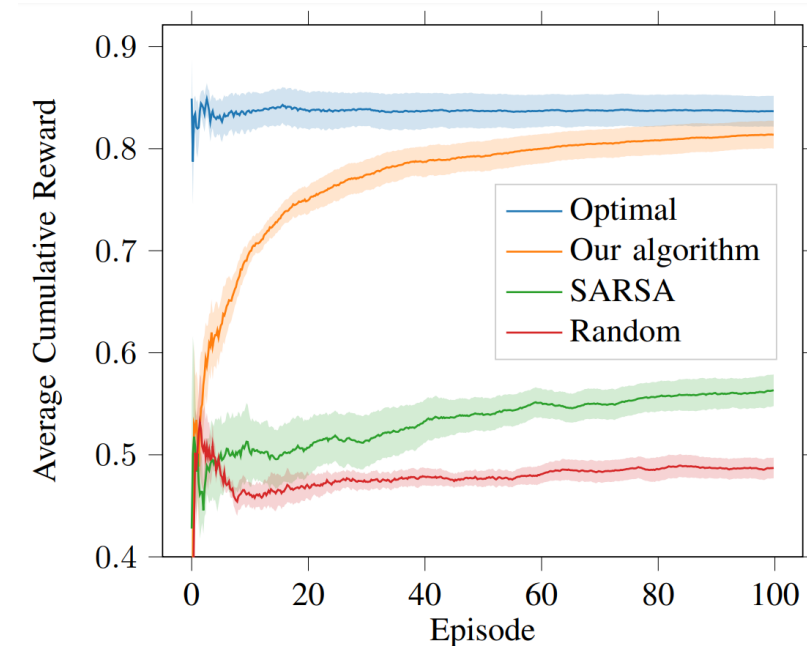
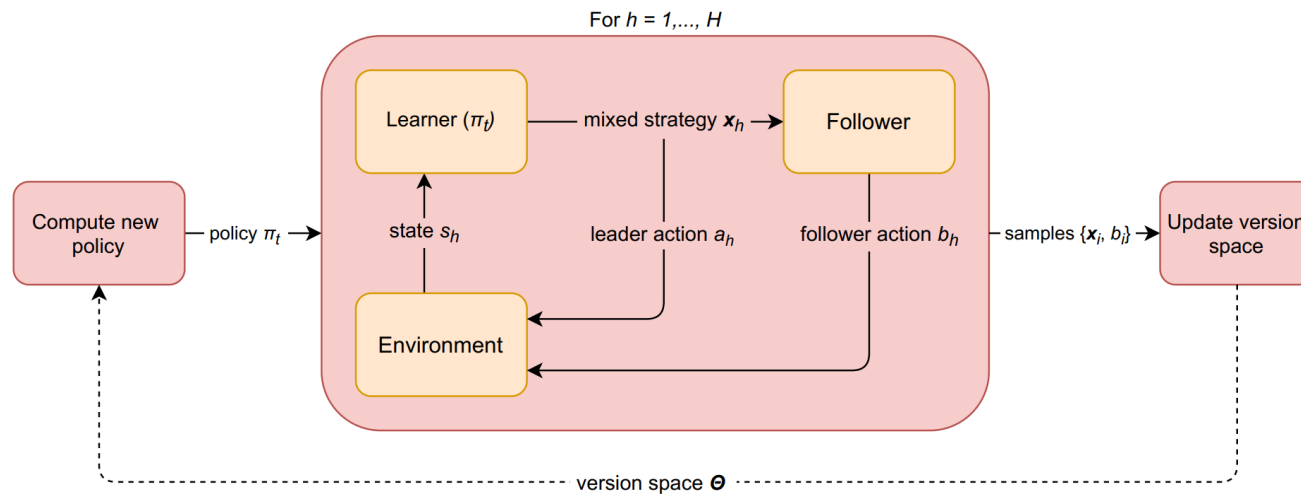
- **Structured** reward estimation and policy update
- **Minimax optimal** guarantees with **high probability**



# Dynamic Security Games for Resource Allocation

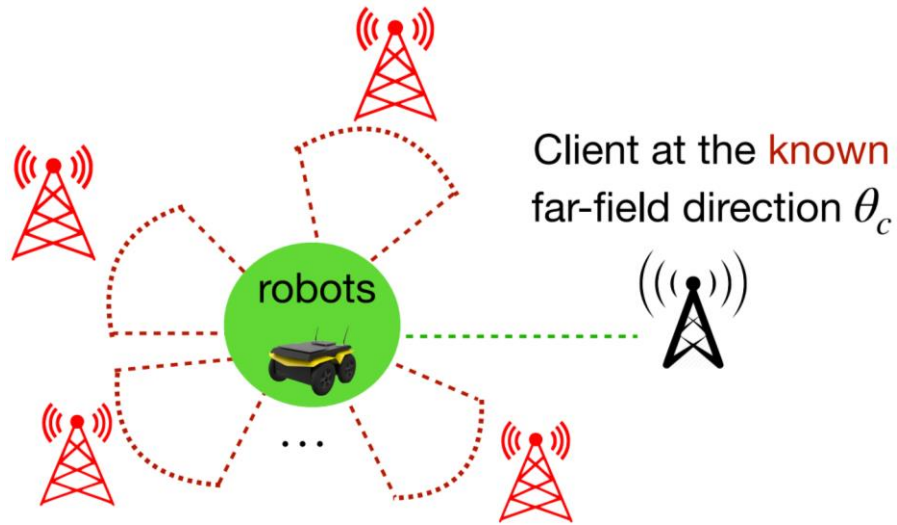


- **Adaptive** policy optimization
- Performance guarantees with **high probability**



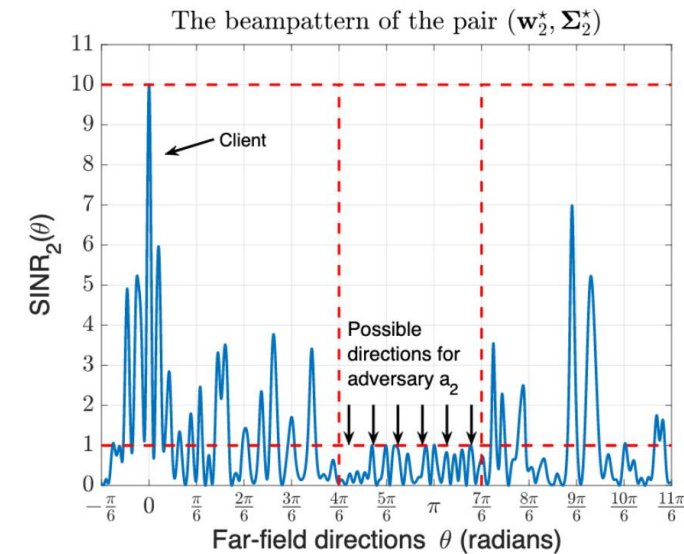
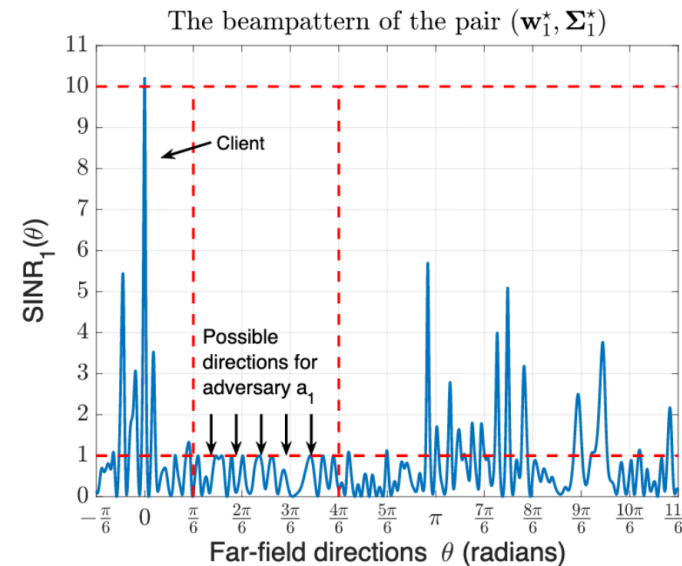
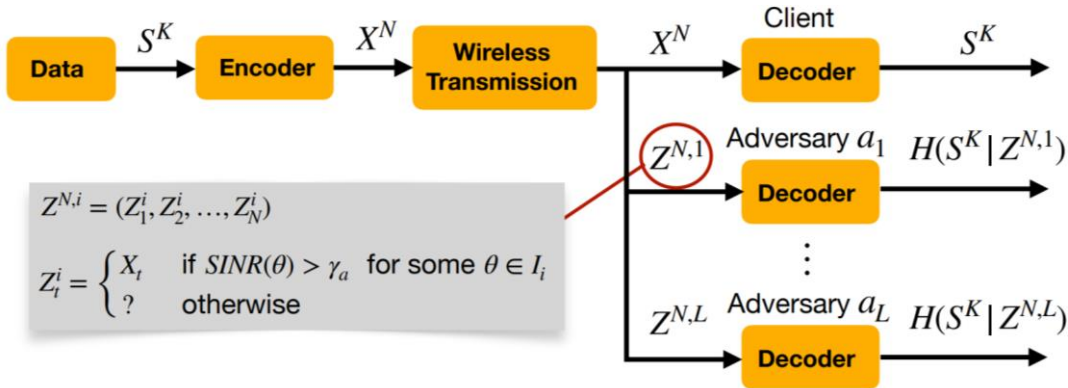


# Physical-Layer Security via Distributed Beamforming (ARL)

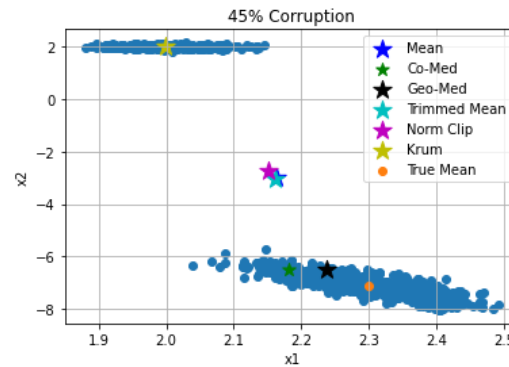
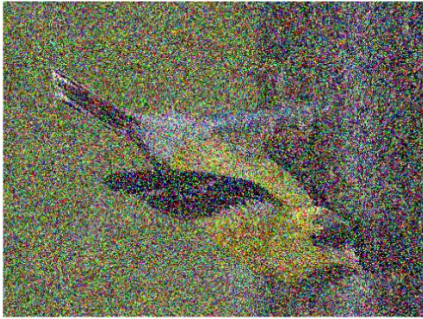
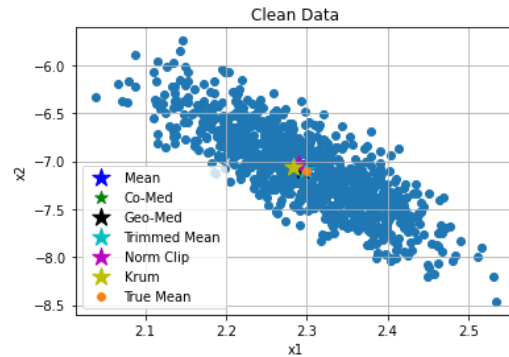


**Semi-infinite non-convex** program!

We present a **finite convex** program whose solution coincides with this program **with probabilistic guarantees**



# Robust Collaborative Learning in High Dimensions



- Exploiting **low-dimensional** structures
- Subspace sampling AND **memory augmentation**
- Performance guarantees for **non-convex** Tasks

	Corruption (%)	SGD	CMD	BGMD	GMD
<b>ResNet18 - CIFAR10 (heterogeneous)</b>					
Clean	-	82.29±1.32	85.50±1.43	84.82±0.76	<b>85.65±0.48</b>
<b>Gradient Corruption</b>					
Bit Flip	20	-	80.87±0.21	84.56±0.06	<b>88.07±0.05</b>
	40	-	77.41±1.04	<b>82.66±0.31</b>	80.81±0.01
Additive	20	20.7±1.56	54.75±0.38	<b>83.84±0.12</b>	82.40±0.90
	40	-	23.35±6.13	<b>82.79±0.68</b>	79.46±0.24

