

### ADVERSARIAL MACHINE LEARNING

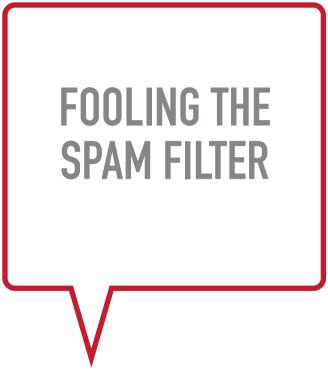


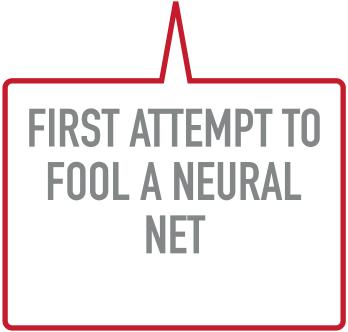












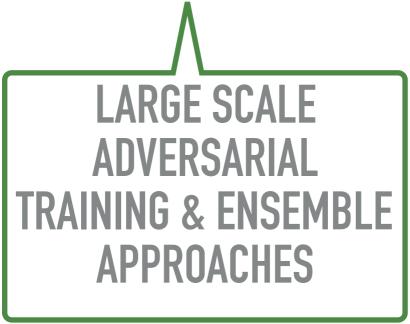
### IMPERCEPTIBLE ADVERSARIAL EXAMPLES







### **ADVERSARIAL EXAMPLES IN PHYSICAL WORLD & BLACK BOX ATTACKS**



# ADVERSARIAL 3D MODELS & STRONGER L2 ATTACKS

A. Athale et al.

## FAST & PRACTICAL ATTACK MODEL

### DEFENCE STRATEGIES

- Varies based on goal of adversary
- For multi class targeted or non-targeted attack defence means making classifier robust against adversarial perturbations (e.g. Self Driving Cars)
- For anomaly detection etc scenario defence means detecting adversarial examples

### TIMELINE **ADVERSARIAL** ADVERSARIAL 3D MODELS **IMPERCEPTIBLE EXAMPLES IN PHYSICAL FAST & PRACTICAL FOOLING THE ADVERSARIAL WORLD & BLACK BOX** ATTACK MODEL SPAM FILTER STRONGER L2 ATTACKS **EXAMPLES** ATTACKS A. Athale et al. 2016 2013 2014 2015 2017 2004 LARGE SCALE FIRST ATTEMPT TO **ADVERSARIAL DEFENSIVE ADVERSARIAL** TRAINING AS **FOOL A NEURAL** DISTILLATION TRAINING & ENSEMBLE **NET** DEFENCE **APPROACHES**