



**PennState**

Institute for Network and  
Security Research



# Welcome: ARO Workshop on Adversarial Learning

Palo Alto, CA – September 14, 2017

Patrick McDaniel, Dan Boneh, Kamalika Chaudhuri, David Evans,  
Somesh Jha, Dawn Song, Ananthram Swami

# Welcome to the ARO Workshop!



- On behalf of the event organizers and our colleagues at the Army Research Office, we would like to welcome you to this workshop on adversarial machine learning ...



- We wish to
  - ▶ **Cliff Wang** of ARO, who has tirelessly supported this workshop
  - ▶ **Ruth Harris** of Stanford University who assisted Frankie
  - ▶ **Judy Bowes** of Penn State University, who has worked behind the scenes to help coordinate the proposal and initial setup
  - ▶ University staff, catering and other folks ...
  - ▶ Student volunteers ...
  - ▶ Speakers ..

# Today's Agenda Highlights ...

Thursday, September 14<sup>th</sup>, 2017

- 9:15 Welcome and overview
- 9:30-10:15 Ian Goodfellow, Google
- 10:15-10:45 Jacob Steinhardt, Stanford
- 10:45-11:00 Break
- 11:00-11:30 Nicolas Papernot, Penn State
- 11:30-12:00 Aleksander Madry, MIT
- 12:00-12:30 Tian Pham, ARL
- 12:30-14:00 Lunch (provided, in room)
- ...
- 16:30-16:35 Closing



# Today's Agenda (cont.) ...

Thursday, September 14<sup>th</sup>, 2017

...

12:30-14:00 Lunch

14:00-15:00 Breakouts I

15:00-15:30 Breakouts II

15:30-16:00 Dawn Song, UC Berkeley

16:00-16:30 Dave Evans, Virginia

16:30-16:35 Closing



# Breakouts (2-3pm)

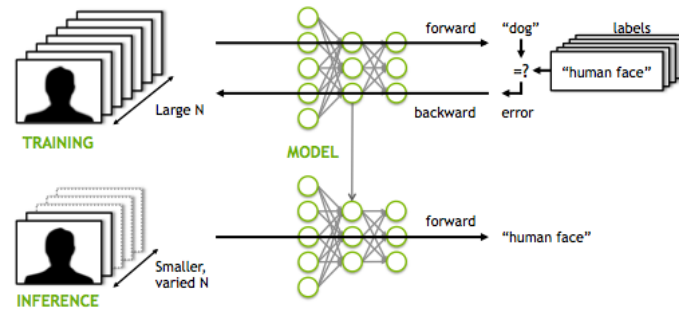
- 6 different technical sessions (2 sessions of 3) spanning topics of interest collected from the attendees
- Rules
  - ▶ Pick and choose what interests you ...
  - ▶ No presentations ... (workshop rules)
  - ▶ Active participation ... it is on you
  - ▶ Be constructive, listen (self promotion should be limited)
  - ▶ Come and go as you like ... try more than one if you want
  - ▶ Have fun, meet people, learn and get new ideas
- Q: What are the key challenges and research areas?



- 14:00-14:30
  - ▶ Privacy (Jha, Papernot)
  - ▶ Measuring and achieving resilience (Evans, Grosse)
  - ▶ Fairness (Chaudhuri, ???)
- 14:30-15:00
  - ▶ Autonomous cyber defense (Swami, Grosse)
  - ▶ Adversarial reinforcement learning (Wellman, ...)
  - ▶ Attacks on training attacks (Boneh, ...)

# Machine Learning

- Perhaps no area of computer science has had more impact on systems and society in the last 5 years than machine learning
  - ▶ Analytics
  - ▶ Autonomous systems
  - ▶ Vision ...





- Challenge: what are the security and privacy challenges of the use of machine learning in adversarial settings?
  - ▶ Fundamental science:
    - What are the limits of machine learning with respect to accuracy and resilience?
    - What vulnerabilities are general vs. those are a consequence of the techniques used?
    - Can the advantages of ML be realized while preserving privacy?
  - ▶ Applied science
    - What countermeasures are likely to be effective in practice?
    - What are the domain specific challenges and safeguards for security and privacy?
    - Ethics:
      - ▶ Just because a system may be able to understand environment, should it?
      - ▶ Can the advantages of ML be realized fairly without discriminating minorities?
    - Education (what and how to integrate security into machine learning/security courses)



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# Welcome: ARO Workshop on Adversarial Learning (Closing)

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- Readout: over the next few weeks the organizers will try to capture the substance of the conversations with a focus on the breakouts.
- Make a short statement of key areas and challenges faced by the community, as well as identify important application domains.
- We will send an email with a reference to the readout to all participants shortly thereafter.
  
- Please send any comments, questions to [mcdaniel@cse.psu.edu](mailto:mcdaniel@cse.psu.edu)

# Thanks ...

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- You!