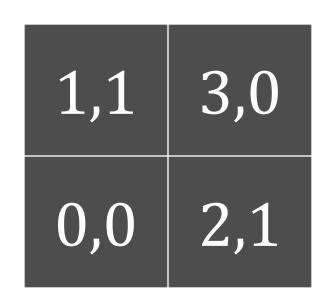
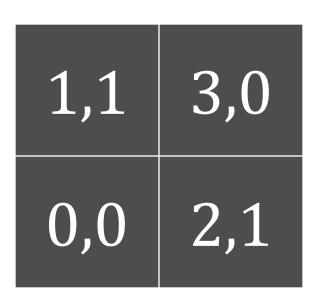


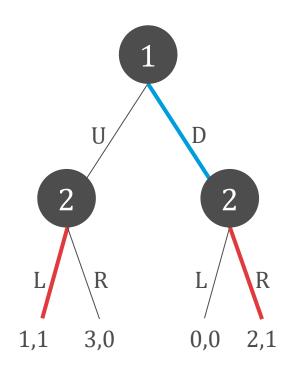
# Fall 2022 | Lecture 11 Security Games Ariel Procaccia | Harvard University

- Playing up is a dominant strategy for row player
- So column player would play left
- Therefore, (1,1) is the only Nash equilibrium outcome



- A Stackelberg game is played as follows:
  - Row player (the leader)
     commits to playing a row
  - Column player (the follower) observes the commitment and chooses column
- The leader can commit to playing down!



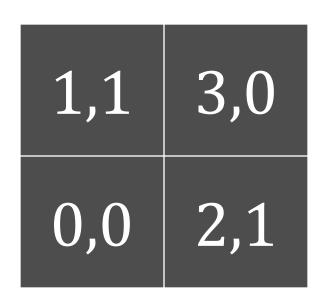


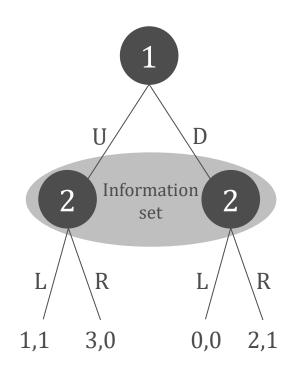
If the leader announces their commitment, the Stackelberg game can be rewritten as an extensive-form game of perfect information

 Poll 1: What reward can the leader get by committing to a mixed strategy? (Assume the follower breaks ties in favor of the leader)



- · 1.5
- 。 2
- · 2.5





Randomness helps the leader due to imperfect information

## COMMITMENT IN REAL LIFE



http://youtu.be/S0qjK3TWZE8

## STACKELBERG EQUILIBRIUM

- For a mixed strategy  $x_1$  of the leader, define the best response set of the follower as  $B_2(x_1) = \operatorname{argmax}_{s_2 \in S} u_2(x_1, s_2)$
- In a strong Stackelberg equilibrium (SSE), the leader plays a mixed strategy in  $\arg\max_{x_1\in\Delta(S)}\max_{s_2\in B_2(x_1)}u_1(x_1,s_2)$ ,

where  $\Delta(S)$  is the set of mixed strategies

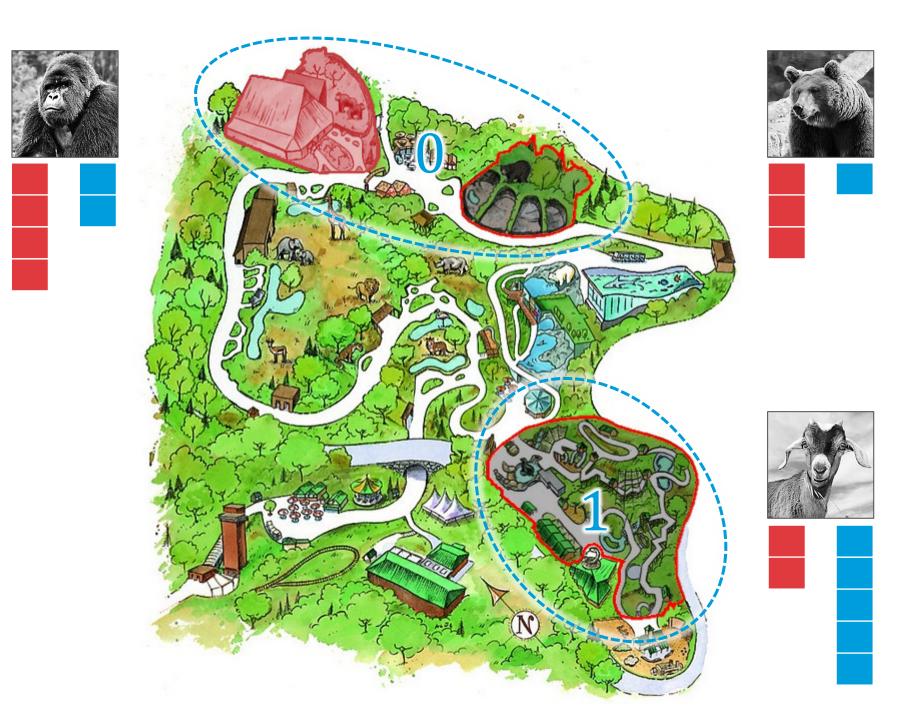
#### **COMPUTING SSE**

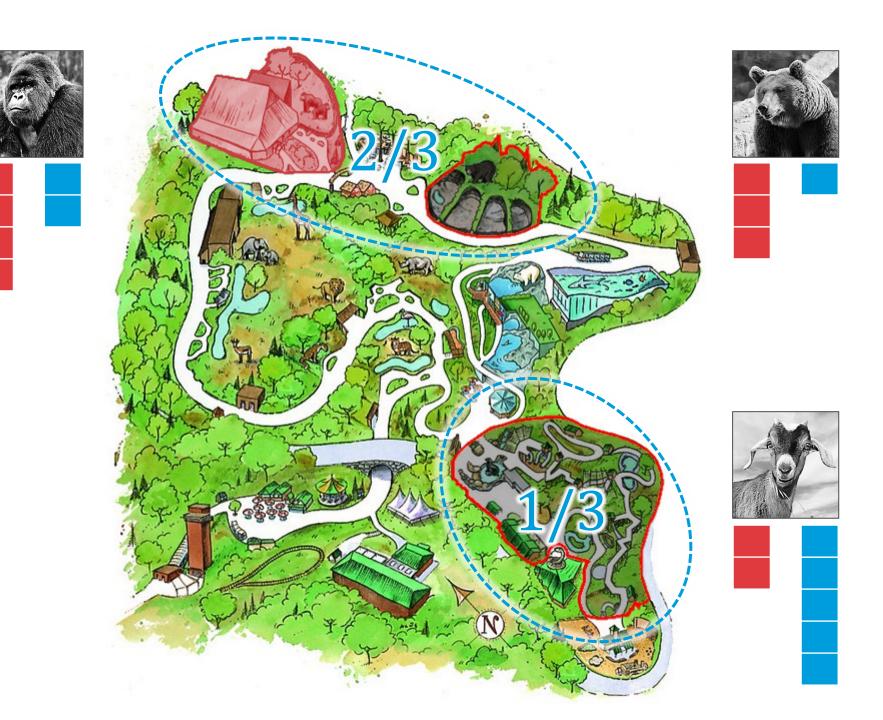
- In 2-player normal form games, an SSE can be computed in polynomial time through a linear program
- The leader's mixed strategy is defined by variables  $x(s_1)$ , which give the probability of playing each strategy  $s_1 \in S$
- For each follower strategy  $s_2^*$ , we compute a strategy x for the leader such that
  - Playing  $s_2^*$  is a best response for the follower
  - Under this constraint, x is optimal

$$\max \sum_{s_1 \in S} x(s_1) u_1(s_1, s_2^*)$$
s.t  $\forall s_2 \in S, \sum_{s_1 \in S} x(s_1) u_2(s_1, s_2^*) \ge \sum_{s_1 \in S} x(s_1) u_2(s_1, s_2)$ 

$$\sum_{s_1 \in S} x(s_1) = 1$$

• Take the x resulting from the "best"  $s_2^*$ 

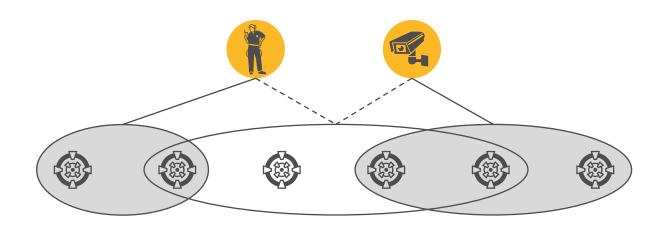




# **SECURITY GAMES**



#### SECURITY GAMES: MODEL



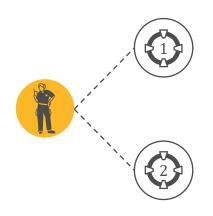
- Set of targets  $T = \{1, ..., n\}$
- Set of m security resources  $\Omega$  available to the defender (leader)
- Set of schedules  $\Sigma \subseteq 2^T$
- Resource  $\omega$  can be assigned to one of the schedules in  $A(\omega) \subseteq \Sigma$
- Attacker chooses one target to attack

## SECURITY GAMES: MODEL

- For each target t, there are four numbers:  $u_d^+(t) \ge u_d^-(t)$  and  $u_a^+(t) \le u_a^-(t)$
- Mixed defender strategy induces coverage probabilities  $\mathbf{c} = (c_1, ..., c_n)$
- The utilities to the defender/attacker under
   c if target t is attacked are

$$u_d(t, \mathbf{c}) = u_d^+(t) \cdot c_t + u_d^-(t)(1 - c_t)$$
  
 $u_a(t, \mathbf{c}) = u_a^+(t) \cdot c_t + u_a^-(t)(1 - c_t)$ 

#### SECURITY GAMES: EXAMPLE

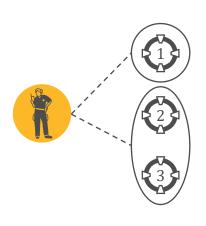


	Attacker		Defender	
Target	Covered	Uncovered	Covered	Uncovered
1	0	1/2	0	-1
2	0	1	0	-1

Poll 2: What is the defender's utility in an SSE?

- 0
- −1/3
- −1/2
- -2/3

#### SECURITY GAMES: EXAMPLE

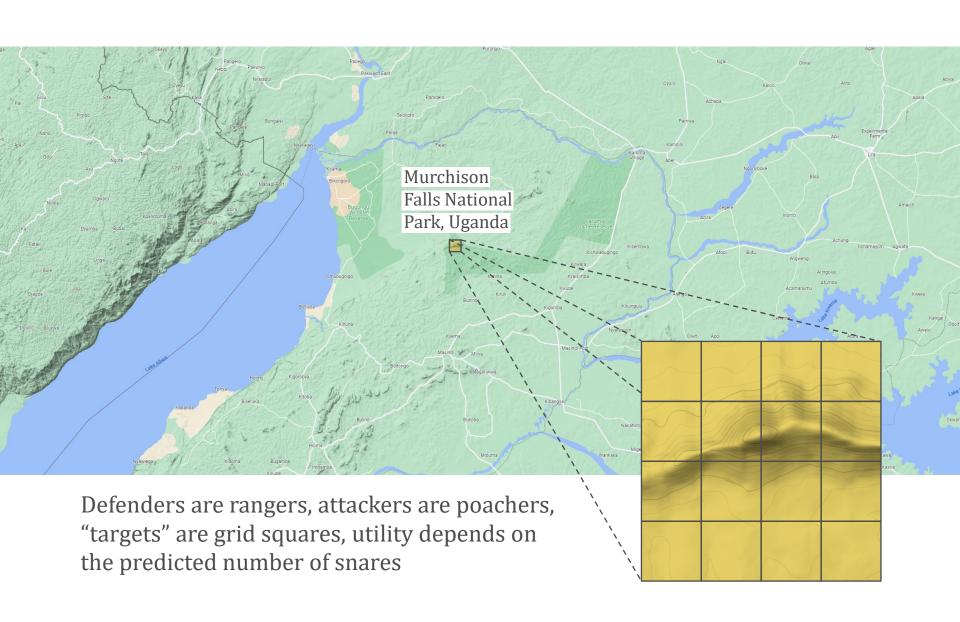


	Attacker		Defender	
Target	Covered	Uncovered	Covered	Uncovered
1	0	4	0	-2
2	0	3	0	-1
3	0	2	0	<b>-</b> 5

Poll 3: What is the defender's utility in an SSE?

- -3/7
- −4/7
- −3/4
- −4/3

## WILDLIFE PROTECTION



#### LIMITATIONS OF SECURITY GAMES



• Poll 4 (brainstorm): What are some of the gaps between the security games model and reality?

# Newsweek

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#### WORLD

#### Random Security: LAX's ARMOR System

BY **ANDREW MURR** ON 10/13/07 AT 11:32 AM EDT

















WORLD



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00:00

any given day.

ecurity officials at Los Angeles International Airport now have a new weapon in their fight against terrorism: randomness. Anxious to thwart future terror attacks in the early stages while plotters are casing the airport, security patrols have begun using a computer program called ARMOR (Assistant for Randomized Monitoring of Routes) to make the placement of security checkpoints completely unpredictable. Now all airport security officials have to do is press a button labeled RANDOMIZE, and they can throw a sort of digital cloak of invisibility over where they place the cops' antiterror checkpoints on

#### THE DEBATE



Our Economic House Is on Fire

BY VERONIKA DOLAR



The Fed Created the Next Recession

BY ALFIE MEEK



#### **OPINION**



(10) 1.0x

I've Seen Kate Middleton With Her Children, She **Doesn't Deserve Trolling** 

BY LULU SINCLAIR



WTO Cannot Continue as **Barrier to COVID-19 Medicines** 

BY JOSEPH E. STIGLITZ AND LORI WALLACH



Zelensky is Betting Time is on Ukraine's Side

BY DANIEL R. DEPETRIS



MAGA Madness Was on Full Display at Jan. 6





Antipoaching patrols like this team at the Lewa Wildlife Conservancy in Kenya may soon use Al technology to stay one step ahead of criminals.

PHOTOGRAPH BY AMI VITALE, NATIONAL GEOGRAPHIC CREATIVCE

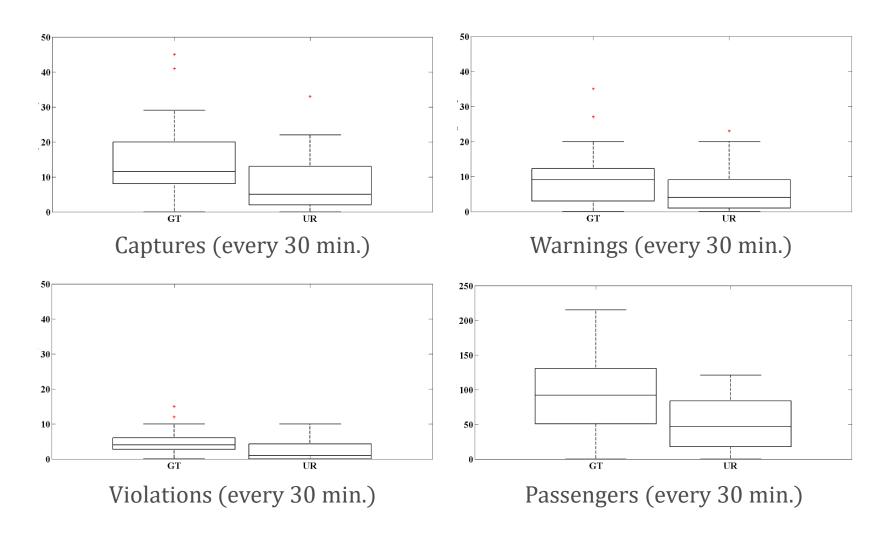
#### WILDLIFE WATCH

# Rangers Use Artificial Intelligence to Fight Poachers

Emerging technology may help wildlife officials beat back traffickers.

PAWS, which stands for Protection Assistant for Wildlife Security, is a newly developed AI that takes data about previous poaching activities and outputs routes for patrols based on where poaching is likely to occur. These routes are also randomized to keep poachers from learning patrol patterns. Using machine learning, a branch of AI, PAWS can continually find new insights as more data is added.

## DOES THIS WORK?



Game theory (GT) vs. uniform random (UR) in the LA metro [Delle Fave et al., 2014]