



# How Many Containers to Inspect to Deter Terrorist Attacks

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# Introduction

- Department of Homeland Security recently announced 100% container screening at several large overseas ports
- Retailers claim that the policy will hinder product transportation:
  - Resulting in higher product prices
- If the US is concerned about deterring terrorist attacks:
  - How many containers should be inspected?
- We develop a method to answer this question using game theory

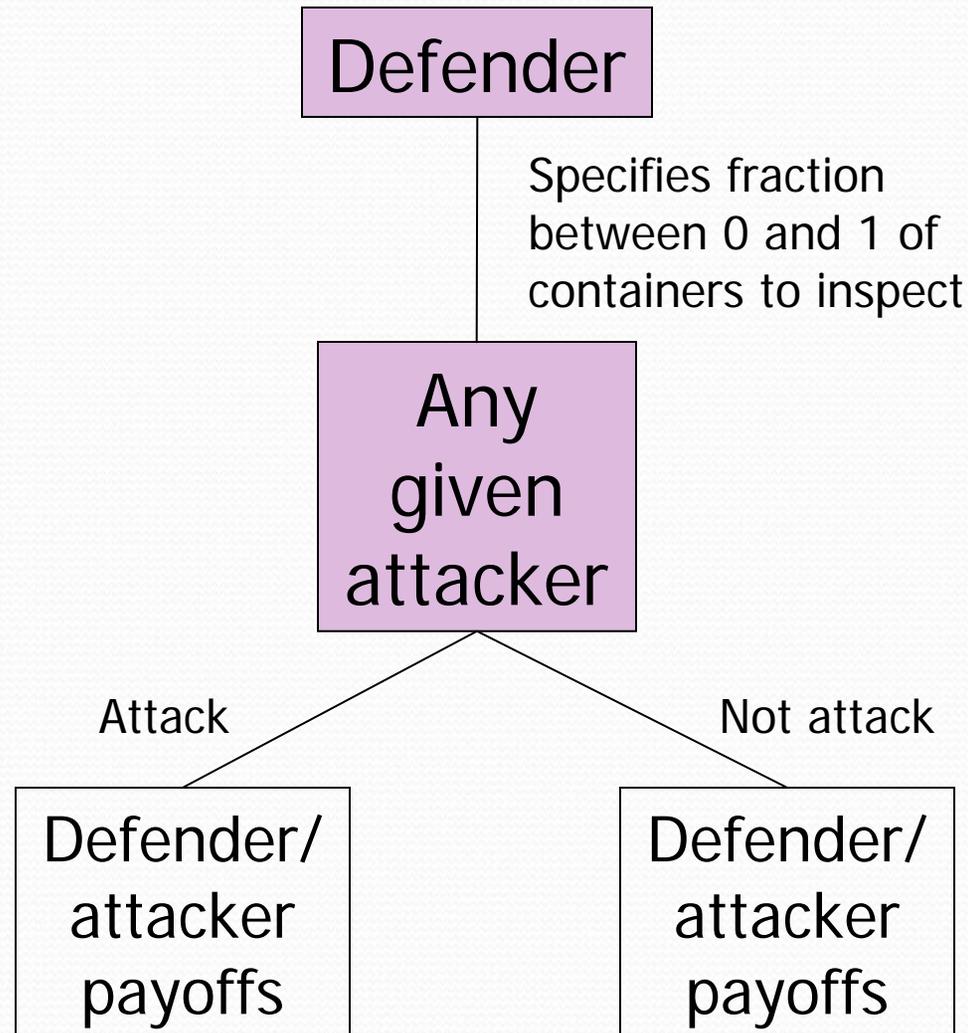
# Assumptions

- We adapted a model by Dighe et al.:
  - Attacks can be deterred with less than 100% inspection
  - Provided that the defender discloses the overall level of defense
  - (But not the detailed defensive allocation)
- We consider multiple attackers:
  - Each trying to smuggle in a particular weapon type
  - E.g., dirty bombs versus nuclear weapons
- An “attack” is defined to be a smuggling attempt:
  - Regardless of whether the attempt succeeds

# Assumptions (cont'd)

- Containers are assumed to be homogeneous
- The cost of inspecting a container is assumed to be the same regardless of whether it contains a weapon
- The cost of a smuggling attempt is assumed to be the same regardless of whether it succeeds:
  - The cost of unsuccessful smuggling attempts is what makes deterrence with less than 100% inspection possible!
  - (This does not include the cost of any possible retaliation)
- The same inspection technology can detect multiple types of attacks

# Model Illustration



# Notation

$n$  = Number of containers inspected

$N$  = Total number of containers

$m$  = Number of attacker types

$V_i$  = Expected damage if attacker  $i$  successfully smuggles a weapon into US

$p_i$  = Probability of successfully detecting a weapon smuggled by attacker  $i$

$I_i$  = Indicator function:

Equals 1 if attacker  $i$  decides to attack, 0 if otherwise

$C_d$  = Inspection cost per container

$C_i$  = Cost of a smuggling attempt by attacker  $i$

# Mathematical Model

- The defender is assumed to minimize expected losses, as given by:

$$\min_{n=1, \dots, N} \left\{ \sum_{i=1}^m \left[ \underbrace{V_i \left(1 - \frac{n}{N} p_i\right) I_i}_{\text{Expected damage caused by attacker } i} \right] + \underbrace{n C_d}_{\text{Inspection cost}} \right\}$$

Expected damage caused by attacker  $i$       Inspection cost

- Attacker  $i$  is assumed to maximize expected reward, as given by:

$$\max_{I_i=0,1} \left\{ \left[ \underbrace{V_i \left(1 - \frac{n}{N} p_i\right)}_{\text{Expected reward to attacker } i} - \underbrace{C_i}_{\text{Cost of an attack}} \right] I_i \right\}$$

Expected reward to attacker  $i$       Cost of an attack

# Attacker's Optimal Decision

- Consider attacker  $i$ 's optimal decision first
- Attacker  $i$  will attack if  $n \leq \frac{N}{p_i} \left( 1 - \frac{C_i}{V_i} \right)$ , and not otherwise
- Attacker  $i$  will always attack with:
  - Sufficiently low detection probability,  $p_i$
  - Sufficiently low attack cost,  $C_i$
  - Sufficiently high expected damage given a successful attempt,  $V_i$

# Two-Attacker Example

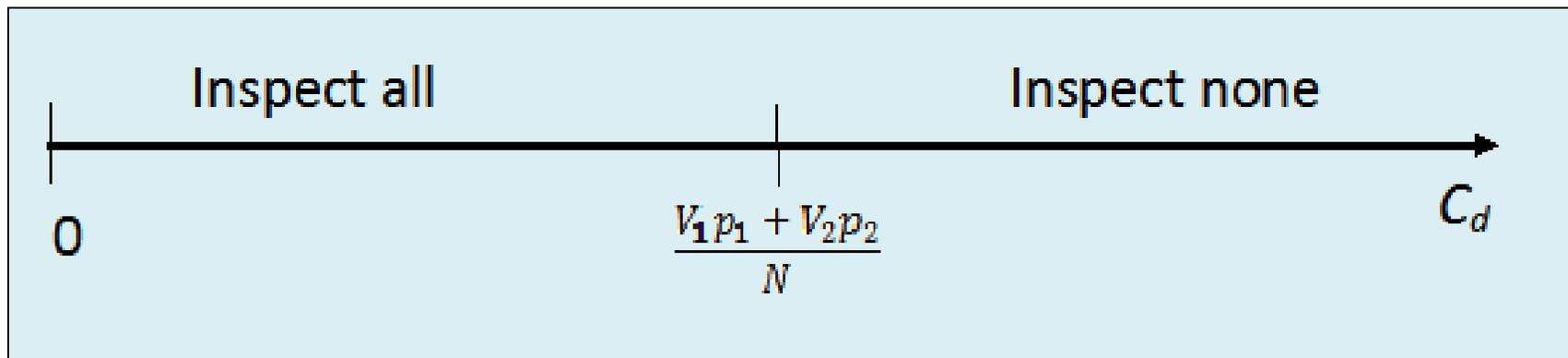
- Consider two attackers:
  - Each attempting to smuggle in a particular type of weapon
- We consider three possible scenarios (based on attack costs):
  - Neither attacker can be deterred with less than 100% inspection when both attack costs are small
  - Attacker 1 can be deterred, but not attacker 2 when the attack cost to attacker 1 is small, but the attack cost to attacker 2 is large
  - Both attackers can be deterred with less than 100% inspection when both attack costs are large

# Neither Attacker Can Be Deterred

- The defender should inspect no containers if

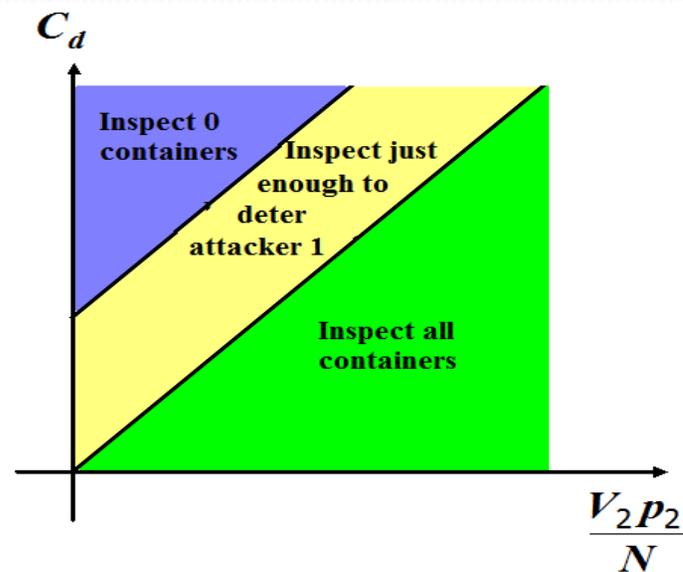
$$\frac{V_1 p_1 + V_2 p_2}{N} \leq C_d$$

and 100% of all containers otherwise



# Only Attacker 1 Can Be Deterred

- The defender's optimal strategy depends on:
  - The inspection cost per container,  $C_d$
  - The expected damage from a successful smuggling attempt,  $V_2$
  - The detection probability for the undeterred attacker,  $p_2$
  - Total number of containers,  $N$

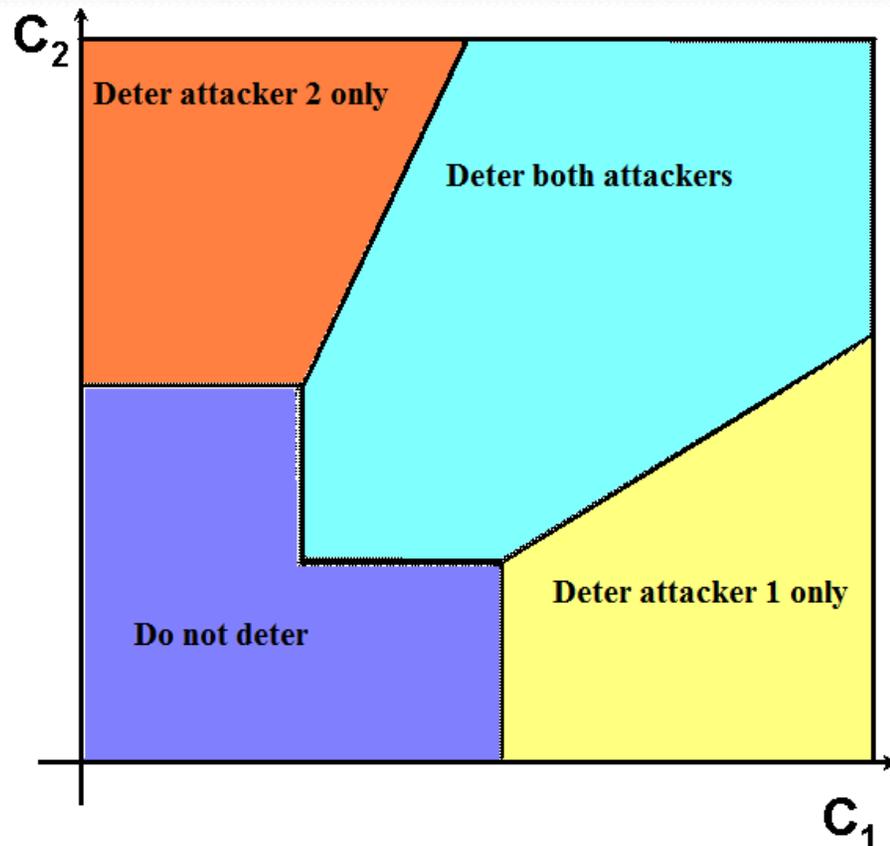


# Both Attackers Can Be Deterred

- 100% inspection is not desirable:
  - Since both attackers can be deterred with less inspection effort
- However, the required inspection level might be virtually 100%:
  - Especially if the detection probability is low
- We identify the defender's optimal strategies as a function of:
  - The attack costs,  $C_1$  and  $C_2$
  - The detection probabilities,  $p_1$  and  $p_2$

# Optimal Defender Strategies

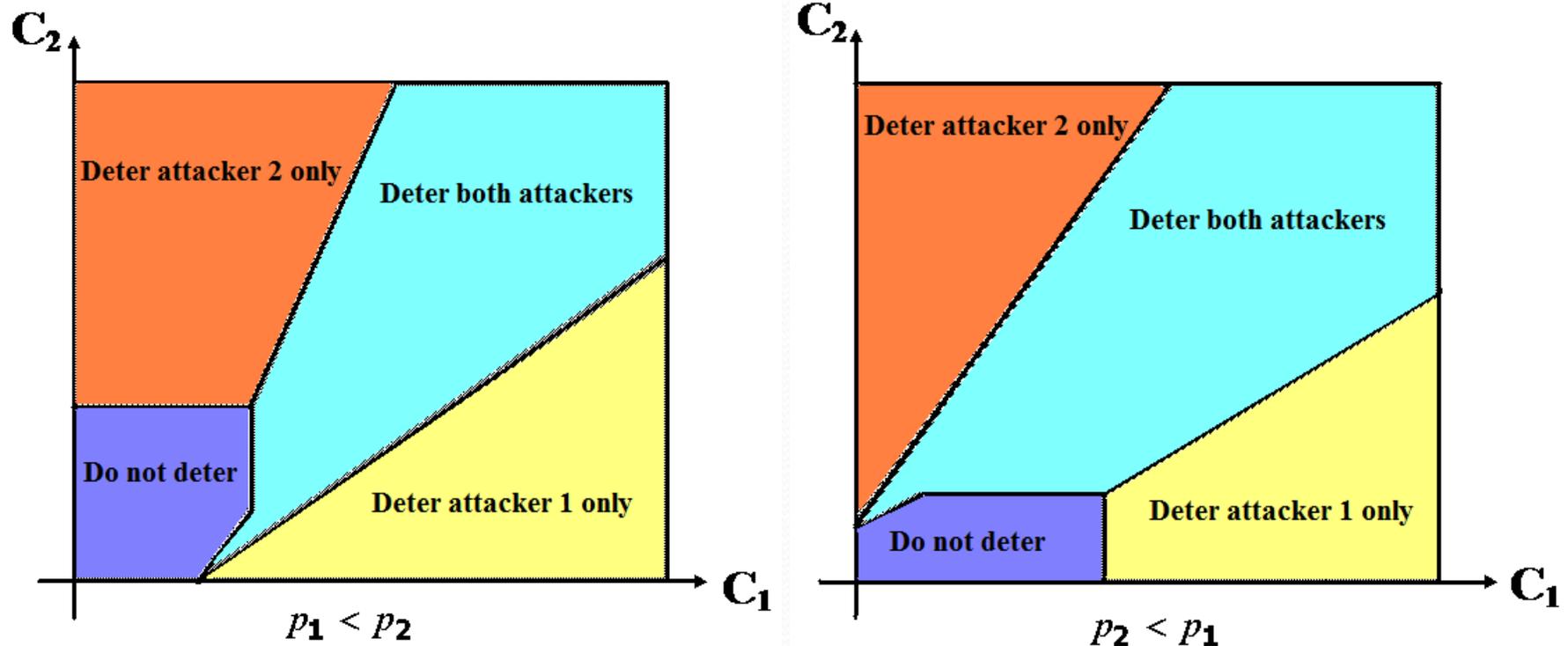
Case 1: Inspection cost extremely large



- Do not inspect when the attack costs are too low to achieve deterrence
- Deter only attacker  $i$  when that attacker's cost is relatively high
- Inspect enough to deter both attackers when attack costs are high

# Optimal Defender Strategies

Case 2: Inspection cost moderately large

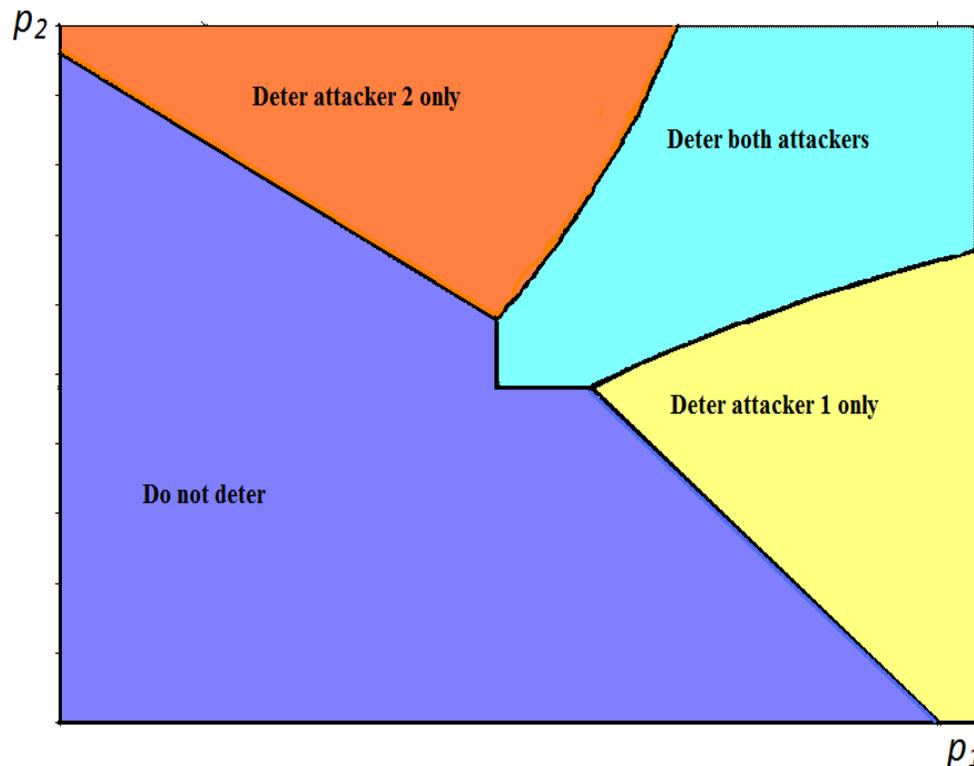


- Attacker  $i$  can be deterred even with arbitrary small attack cost if:
  - The inspection cost required to deter the other attacker is almost sufficient to also deter attacker  $i$
  - The probability of detection is sufficiently large

# Smaller Inspection Costs

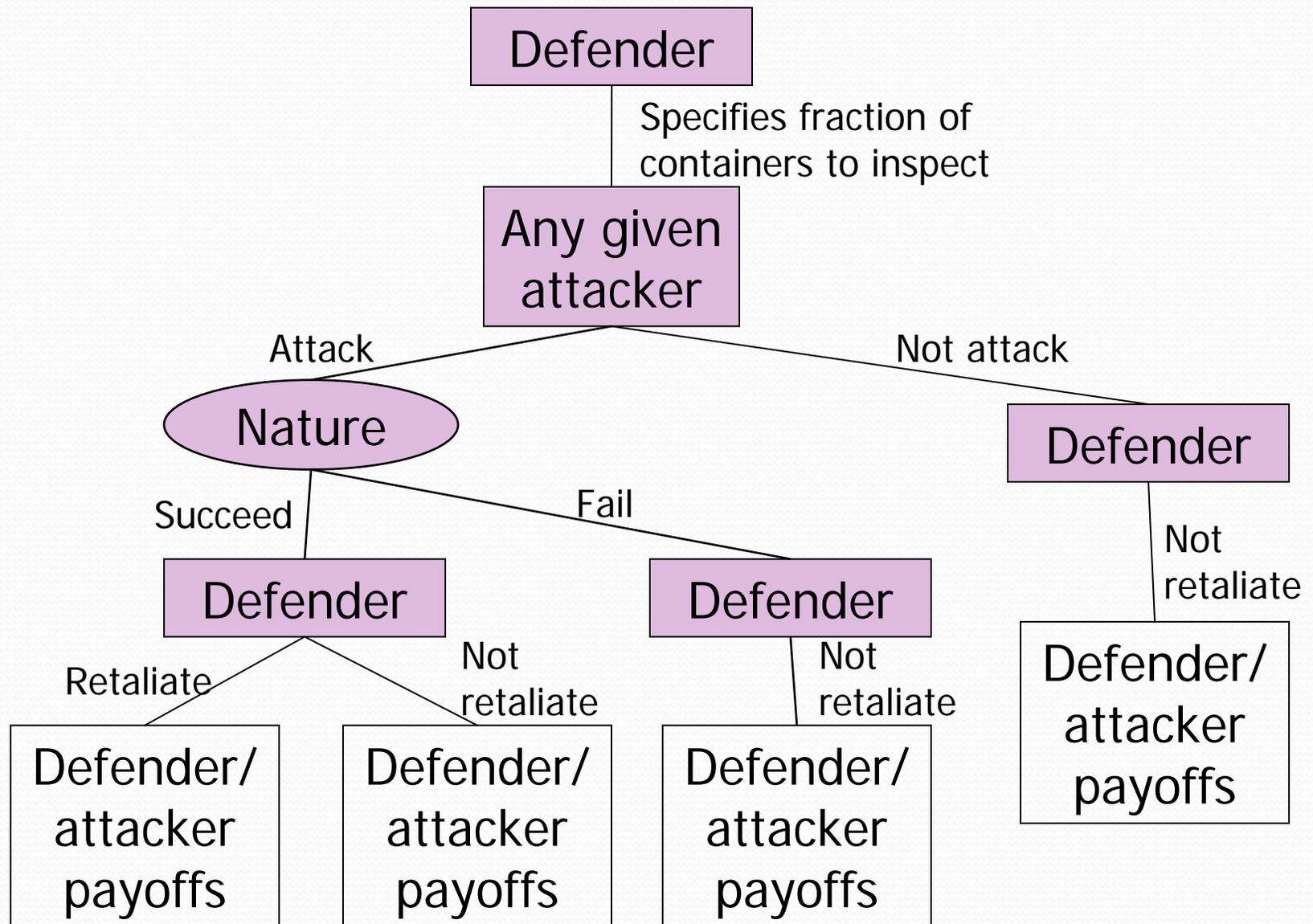
- The “do not deter” region becomes undesirable
- At least one attacker will always be deterred at optimality
- Defender will deter both when the attack costs are comparable:
  - Otherwise, deter the attacker with the higher attack cost
  - (Relative to the detection probability and expected damage for that type of attacker)

# Optimal Defender Strategies as a Function of Detection Probabilities



- Do not inspect when the detection probabilities are too low to achieve deterrence:
  - But 100% inspection may still be optimal, to detect undeterred attacks
- Deter only attacker  $i$  when that attacker's cost is relatively high
- Inspect enough to deter both attackers when both attack costs are high

# Model with Retaliation



# Model with Retaliation

- Defender minimizes expected losses, as given by:

$$\min_{n=1,\dots,N} \left\{ \sum_{i=1}^m \left[ (V_i + R_{d_i} D_i) \left(1 - \frac{n}{N} p_i\right) I_i \right] + n C_d \right\}$$

- Attacker  $i$  maximizes expected reward, as given by:

$$\max_{I_i=0,1} \left\{ \left[ (V_i - R_{a_i} D_i) \left(1 - \frac{n}{N} p_i\right) - C_i \right] I_i \right\}$$

$R_{d_i}$  = Cost of retaliation against attacker  $i$  to the defender

$R_{a_i}$  = Cost of retaliation to attacker  $i$

$D_i$  = Indicator function:

1 if defender retaliates against attacker  $i$

0 otherwise

# Retaliation

- The model depends critically on the idea of “credible threat”:
  - Attackers must believe that the defender will retaliate
  - Even if that is no longer advantageous after an attack
- Otherwise, attackers will treat the threat as “cheap talk”
- To ensure a credible threat, one can assume a repeated game:
  - With sufficiently high damage  $V_i$

# Analysis of Results

- Results indicate that the threat of retaliation (if credible) reduces how many containers must be inspected to deter attacks
- Retaliation also makes it possible to deter some attackers who cannot be deterred in the previous model:
  - Especially when retaliation is sufficiently costly to those attackers
- The model recommends retaliation against all deterred attackers:
  - In order to reduce inspection costs
- However, this may not be credible for attackers with low  $V_i$ :
  - Since future attacks will not be sufficiently damaging to justify retaliation

# Defender's Strategies

- The defender's strategy is of the form  $(d_a, r_b)$

where  $d_a \in D = \{d_0, d_1, d_2, d_N\}$  gives the level of inspection

$r_b \in R = \{r_0, r_1, r_2, r_{12}\}$  gives the retaliation policy

$d_0$  = Inspect no containers

$d_1$  = Inspect exactly enough to deter attacker 1

$d_2$  = Inspect exactly enough to deter attacker 2

$d_N$  = Inspect all containers

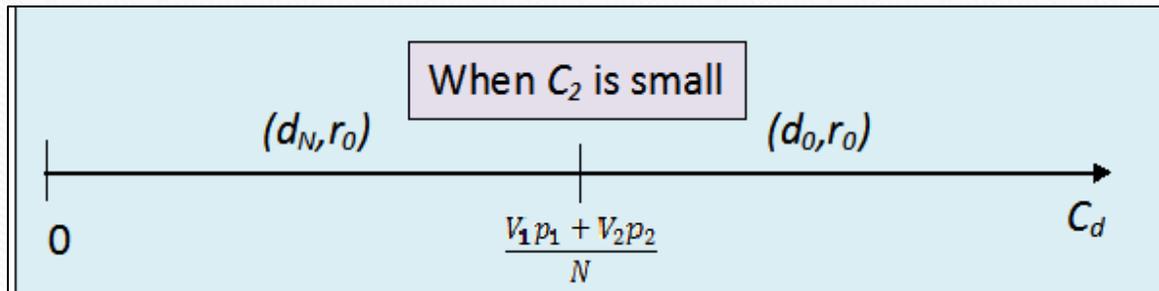
$r_0$  = Not retaliate

$r_1$  = Retaliate against attacker 1

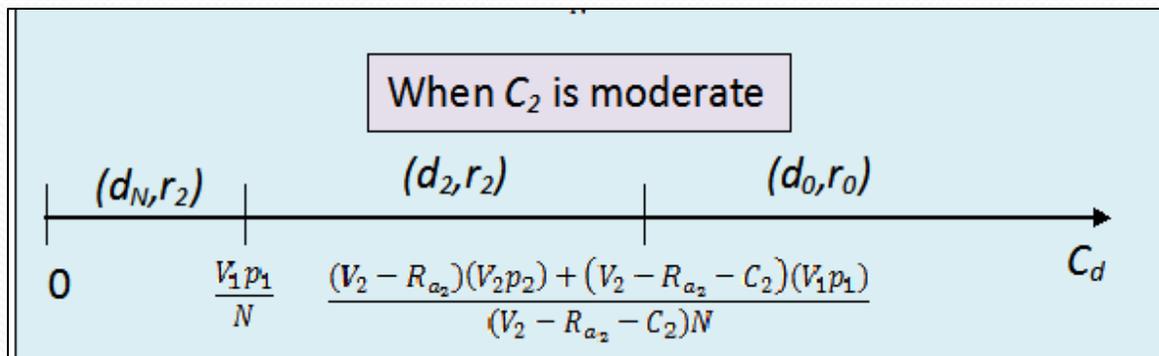
$r_2$  = Retaliate against attacker 2

$r_{12}$  = Retaliate against both attackers

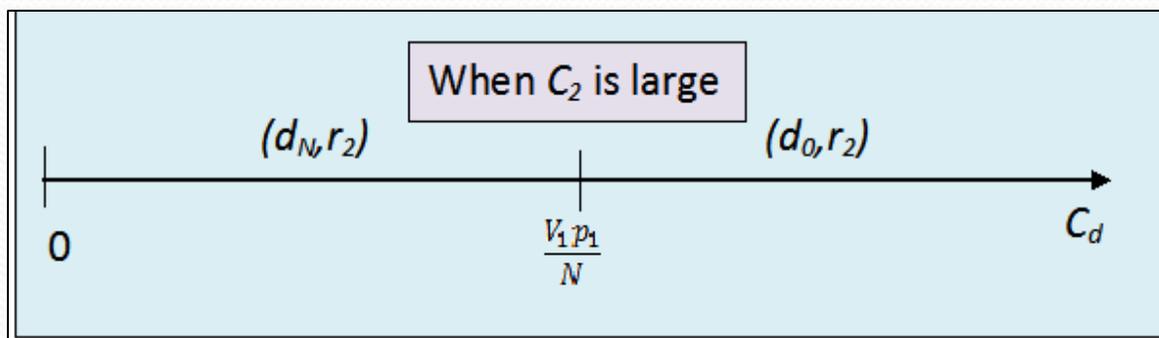
# Optimal Defender Strategies for $C_1$ Small



Inspect all or none;  
Don't deter



Deter attacker 2  
or no attackers;  
Inspect all if not  
too costly



Deter attacker 2 by  
retaliation alone;  
Inspect all if not  
too costly

# Analysis of Results

- If the attack cost to attacker  $i$  is small:
  - The defender should not try to deter attacker  $i$
- If the attack cost to attacker  $i$  is moderate:
  - The defender should inspect enough to deter attacker  $i$
  - And also threaten to retaliate against that attacker
  - (Assuming a credible threat)
- If the attack cost to attacker  $i$  is large:
  - The defender can deter attacker  $i$  by threat of retaliation alone
  - (100% inspection may still be optimal, to detect other attackers)

# Conclusions

- 100% inspection might not be necessary if the most severe attacks can be deterred with less inspection effort:
  - Especially if technology yields high detection probabilities
- Deterrence will be easier for attackers with high attack costs:
  - Deterring someone attempting to smuggle in a nuclear bomb may require much lower levels of inspection than deterring someone attempting to smuggle in a dirty bomb or assault rifle



# Conclusions (cont'd)

- Retaliation, if credible, decreases the needed inspection effort:
  - Threat of retaliation alone may be enough to deter some attackers!
- Deterrence could result in attacks being deflected elsewhere:
  - Overland smuggling attempts from Canada or Mexico
  - Attacks against US interests outside of the US

# Extensions

- Model has been extended to the case of multiple attackers:
  - Results are generally consistent with the case of two attackers
- Other possible extensions:
  - Allow for heterogeneous containers
  - Take into account the effects of inspection effort on product prices
  - Consider trade-offs between border security and target hardening

# Acknowledgment

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Further questions/comments?  
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