# Complexity analysis of Evolution of Dual Preference Orderings in Games of International Conflict 

Overview

- Introduction
- Motivation
- Modeling
- Complexity Analysis
- Implication of Complexity Analysis
- References


## Introduction

- International Conflict
- General disagreement
- Conflict - an agent of change
- Models of conflict resolution
, Conflict Game, Deterrence Game
- Conflict Game
- Overarching concept of Deterrence Game
- Two-player sequential game


## Deterrence Game

- Model of
- persuasion and ideology exchange
- initiation and avoidance of war in international relations
- Decision Tree
- CI, C2, ..., Cn - Challenger decision points
- DI, D2, ..., Dn-Defender decision point



## Deterrence Game

- Outcomes: leaf nodes
- For example,
- Status Quo (S) - no change
- Acquiesce $(A)$ - defender gives in
- Capitulate (C) - challenger gives in
- Payoff Matrix: payoff received for decision made

| Challenger moves | Defender moves |  |  | 0 - player lost the game/replaced <br> I - player unchanged |
| :---: | :---: | :---: | :---: | :---: |
|  |  | Defend | Do not defend |  |
|  | Challenge | -- | A $(2,0)$ | 2 - player won the game |
|  | Do not challenge | C (0,2) | S ( 1,1 ) | -- - we do not know as this is an game is played indefinitely |

## Deterrence Game

- How to play the deterrence game?
- Each player has a strategy
- Complete or incomplete information
- With complete information, decision making starts at leaf node (our research)
- Decision tree for our research



## Deterrence Game

## - Illustration:

- Pl's strategy: $A>C>S>W$ (Challenger)
- P2's strategy: $\mathrm{C}>\mathrm{S}>\mathrm{A}>\mathrm{W}$ (Defender)

- At C2: Capitulate
- At DI: Capitulate
- At CI: Capitulate
- Outcome: Capitulate, Payoffs: Challenger - 0, Defender - 2


## Deterrence Game

- 24 possible strategies

| Code Letter | Payoff Vector | Preference Ordering | Code <br> Letter | Payoff Vector | Preference Ordering |
| :---: | :---: | :---: | :---: | :---: | :---: |
| @ | (1,2,3,4) | $W A R>C A P>A C Q>S Q$ | 1 | (3, 1, 2, 4) | $W A R>S Q>C A P>A C Q$ |
| a | (1,2,4, 3) | $C A P>W A R>A C Q>S Q$ | m | (3, 1, 4, 2) | $C A P>S Q>W A R>A C Q$ |
| b | (1,3,2,4) | $W A R>A C Q>C A P>S Q$ | n | (3, 2, 1, 4) | $W A R>S Q>A C Q>C A P$ |
| c | (1,3,4,2) | $C A P>A C Q>W A R>S Q$ | o | (3,2,4,1) | $C A P>S Q>A C Q>W A R$ |
| d | (1,4, 2, 3) | $A C Q>W A R>C A P>S Q$ | p | (3,4, 1, 2) | $A C Q>S Q>W A R>C A P$ |
| e | (1,4,3,2) | $A C Q>C A P>W A R>S Q$ | q | (3,4, 2, 1) | $A C Q>S Q>C A P>W A R$ |
| f | (2,1,3,4) | $W A R>C A P>S Q>A C Q$ | r | (4, 1, 2, 3) | $S Q>W A R>C A P>A C Q$ |
| g | (2, 1, 4, 3) | $C A P>W A R>S Q>A C Q$ | s | (4, 1, 3, 2) | $S Q>C A P>W A R>A C Q$ |
| h | (2,3, 1, 4) | $W A R>A C Q>S Q>C A P$ | t | (4,2, 1, 3) | $S Q>W A R>A C Q>C A P$ |
| i | (2,3,4,1) | $C A P>A C Q>S Q>W A R$. | u | (4, 2, 3, 1) | $S Q>C A P>A C Q>W A R$ |
| j | (2,4, 1, 3) | $A C Q>W A R>S Q>C A P$ |  | (4, 3, 1, 2) | $S Q>A C Q>W A R>C A P$ |
| k | (2,4, 3, 1) | $A C Q>C A P>S Q>W A R$ | w | (4, 3, 2, 1) | $S Q>A C Q>C A P>W A R$ |

, Traditionally studied strategies
b Hard defender (m) CAP > SQ >WAR >ACQ

- Soft defender (o) $\quad C A P>S Q>A C Q>W A R$
- Hard challenger (p) $\quad A C Q>S Q>W A R>C A P$
- Soft challenger (q) $\quad A C Q>S Q>C A P>W A R$
- Rogue challenger (j) ACQ > WAR $>S Q>C A P$


## Motivation

- Are we studying the correct 5 strategies?
- Previous work
- One player one strategy
- However, one player can be both - a challenger and a defender
- Is there a set of optimal strategy pairs?
- Strategies that ensure that the player survives in the game
- What are their characteristics?


## Modeling of Deterrence Game in our research

Population

| $P(I, I)$ | $P(I, 2)$ | $\ldots$ | $P(I, n)$ |
| :--- | :--- | :--- | :--- |
| $P(2, I)$ | $P(2,2)$ | $\ldots$ | $P(2, n)$ |
| $\ldots$ | $\ldots$ | $\ldots$ | $\ldots$ |
| $P(n, I)$ | $P(n, 2)$ | $\ldots$ | $P(n, n)$ |

Strategies : $24 \times 24=576$ strategy pairs 24 challenger strategies


24 defender strategies

Defender strategies

Randomly assign
one challenger strategy one defender strategy to a player

| $P(I, I)-C_{1,1}, D_{1,1}$ | $P(I, 2)-C_{1,2}, D_{1,2}$ | $\ldots$ | $P(I, n)-C_{1, n}, D_{1, n}$ |
| :--- | :--- | :--- | :--- |
| $P(2, I)-C_{2,1}, D_{2,1}$ | $P(2,2)-C_{2,2}, D_{2,2}$ | $\ldots$ | $P(2, n)-C_{2, n}, D_{2, n}$ |
| $\ldots$ | $\ldots$ | $\ldots$ | $\ldots$ |
| $P(n, I)-C_{n, 1}, D_{n, 1}$ | $P(n, 2)-C_{n, 2}, D_{n, 2}$ | $\ldots$ | $P(n, n)-C_{n, n}, D_{n, n}$ |

Play the deterrence game - winner replaces loser

## Modeling

- Outcome table

Defender strategy

b Outcome of 24 challengers against 24 defenders
, W - war

- A-Acquiesce
- C-Capitulate
- . Status Quo


## Modeling

- Previous work's acyclic dominance graph for a one player one strategy methodology

b Based on dominance of one strategy over another
- Dominance - higher payoff
> Number of incoming edges determine dominance
- Winners
- Status Quo - r, s, t, u, v, w
- Hard Challenger - $p$
, Soft Challenger - q


## Modeling

- Acyclic dominance graph ideal tool to predict winning strategies
- Winning strategies
- highest payoff strategies: Status Quo -r, s, t, u, v, w
- second highest payoff strategies: Hard Challenger - p, Soft Challenger - q
- Present research has 576 strategies
- 576 vertices in the acyclic dominance graph
- Is there a dominating set in this dominance graph?
- This can be found in polynomial time since there are only 576 vertices


## Modeling

- Payoff look-up table for 576 strategy pairs

|  | (0) | a | b | C | d | e | f | 9 | h | 1 | j | k | 1 | m | 17 | 0 | $p$ | 9 | r | 5 | t | - | $V$ | W |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| (Q) | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0.0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2,0 | 2,0 |
| a | 0.2 | 0,2 | 2,0 | 0.2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 |
| $b$ | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2,0 | 2,0 |
| c | 0,2 | 0,2 | 2,0 | 0.2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0.2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2.0 | 0.2 | 2,0 | 2,0 |
| d | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2.0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2,0 | 2.0 | 0.0 | 0.0 | 0,0 | 2,0 | 2.0 | 2,0 |
| e | 0,2 | 0,2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0,2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 |
| f | 0,0 | 0,0 | 0.0 | 1,1 | 1.1 | 1.1 | 0,0 | 0.0 | 0.0 | 1.1 | 1.1 | 1.1 | 0.0 | 0,0 | 0,0 | 1.1 | 1.1 | 1.1 | 0.0 | 0.0 | 0.0 | 1,1 | 1.1 | 1,1 |
| 9 | 0,2 | 0,2 | 1,1 | 0.2 | 1.1 | 1.1 | 0.2 | 0.2 | 1.1 | 0.2 | 1.1 | 1,1 | 0.2 | 0.2 | 1,1 | 0,2 | 1,1 | 1.1 | 0,2 | 0.2 | 1.1 | 0.2 | 1.1 | 1,1 |
| h | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0.0 | 2,0 | 2.0 | 2,0 |
| I | 0,2 | 0,2 | 2,0 | 0.2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0,2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 |
| , | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0,0 | 0,0 | 2,0 | 2,0 | 2,0 | 0,0 | 0.0 | 0,0 | 2,0 | 2,0 | 2,0 |
| k | 0,2 | 0,2 | 2,0 | 0,2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0.2 | 2,0 | 2,0 | 0,2 | 0.2 | 2,0 | 0,2 | 2,0 | 2,0 | 0.2 | 0.2 | 2,0 | 0.2 | 2,0 | 2,0 |
| I | 0,0 | 0,0 | 0,0 | 1.1 | 1,1 | 1.1 | 0,0 | 0.0 | 0,0 | 1,1 | 1.1 | 1.1 | 0,0 | 0,0 | 0,0 | 1,1 | 1.1 | 1,1 | 0,0 | 0.0 | 0,0 | 1,1 | 1,1 | 1,1 |
| m | 0.2 | 0,2 | 1.1 | 0.2 | 1.1 | 1.1 | 0.2 | 0.2 | 1.1 | 0.2 | 1.1 | 1.1 | 0.2 | 0.2 | 1.1 | 0.2 | 1.1 | 1.1 | 0.2 | 0.2 | 1.1 | 0.2 | 1.1 | 1,1 |
| n | 0,0 | 0,0 | 0,0 | 1,1 | 1,1 | 1,1 | 0,0 | 0.0 | 0,0 | 1,1 | 1,1 | 1,1 | 0,0 | 0,0 | 0,0 | 1,1 | 1,1 | 1,1 | 0,0 | 0.0 | 0,0 | 1,1 | 1,1 | 1,1 |
| 0 | 0,2 | 0,2 | 1,1 | 0,2 | 1,1 | 1,1 | 0,2 | 0.2 | 1,1 | 0,2 | 1,1 | 1,1 | 0,2 | 0,2 | 1,1 | 0,2 | 1,1 | 1,1 | 0,2 | 0.2 | 1,1 | 0,2 | 1,1 | 1,1 |
| $p$ | 1.1 | 1.1 | 1.1 | 2,0 | 2,0 | 2,0 | 1.1 | 1.1 | 1.1 | 2,0 | 2.0 | 2,0 | 1.1 | 1.1 | 1.1 | 2,0 | 2,0 | 2.0 | 1,1 | 1.1 | 1.1 | 2,0 | 2.0 | 2,0 |
| q | 1,1 | 1,1 | 2,0 | 1,1 | 2,0 | 2,0 | 1,1 | 1.1 | 2,0 | 1,1 | 2,0 | 2,0 | 1,1 | 1,1 | 2,0 | 1,1 | 2,0 | 2,0 | 1,1 | 1,1 | 2,0 | 1,1 | 2,0 | 2,0 |
| r | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1.1 | 1,1 | 1,1 | 1.1 | 1,1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1,1 | 1,1 | 1.1 | 1,1 |
| 5 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1,1 | 1.1 | 1,1 |
| t | 1.1 | 1.1 | 1,1 | 1,1 | 1.1 | 1.1 | 1.1 | 1.1 | 1.1 | 1.1 | 1.1 | 1.1 | 1,1 | 1,1 | 1.1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1.1 | 1.1 | 1.1 | 1,1 |
| U | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1.1 | 1,1 | 1.1 | 1.1 | 1,1 | 1,1 | 1,1 |
| V | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 |
| w | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1,1 | 1.1 | 1,1 | 1,1 | 1,1 | 1,1 |

- Example: $(\mathrm{q}, \mathrm{I})=(\mathrm{I}, \mathrm{I}) \Rightarrow$ challenger payoff $=\mathrm{I}$, defender payoff $=$ I


## The Bigger Problem

- In the actual deterrence game, the decision horizon is bounded by an arbitrary number $n$
- There could be many attacks and counter-attack
- This implies
- n decision points
- n strategies
- n possibilities
- n X n payoff look-up table entries
- This changes our dominance graph
b $n$ vertices
- m edges


## Formal Problem Statement

Theorem: Evolution of dual preference orderings in games of International Conflict is NP-Complete.
, Given:

- Dominance graph DG(V,E) of evolution of dual preference orderings
p an integer $\mathrm{k}, \mathrm{k} \leq|\mathrm{V}|$
- a look-up table L
- Question: Is there a dominating set of ordered pairs in DG of size k or less?


## Step 1: Proof of NP

Witness: Dominating set $S$ of ordered pairs

- Use the look-up table
* First element of ordered pair - Row, Second element - Column
- Check if the values of the ordered pair in the look-up table are both greater than 0
- Repeat this for all ordered pairs in the dominating set
- If all ordered pairs in the dominating set map to non-zero values, then that set is the set of dual preferences.
- Time complexity
b Look-up: O(I)
, Check for greater than 0, twice: $\mathrm{O}(2)$
- Repeat: $\mathrm{O}(|\mathrm{S}|)$, size of the dominating set
- Polynomial


## Step 2: Proof of NP-Complete

- Dominating Set $\longrightarrow_{p}$ Evolution of Dual Preference Orderings
- Dominating Set
- Given: Graph $\mathrm{G}=(\mathrm{V}, \mathrm{E})$, positive integer $\mathrm{K} \leq|\mathrm{V}|$.
- Question: Is there a dominating set of size $K$ or less in G, i.e., a subset $\mathrm{V}^{`} \subseteq \mathrm{~V}$ with $\left|\mathrm{V}^{`}\right| \leq \mathrm{K}$ such that for all $u \in \mathrm{~V}^{-} \mathrm{V}^{`}$ there is a $v$ $\in \mathrm{V}^{`}$ for which $\{u, v\} \in \mathrm{E}$ ?
- Dominating Set is known to be in NP-Complete


## Proof of Polynomial Transformation

- Step I: Create an instance of Dominating Set
- Graph G = (V`, E')
- $\mathrm{K} \leq|\mathrm{V}|$
- Step 2:Transform this instance to instance of Evolution of dual preference orderings problem
- Assign G to G" ${ }^{\prime \prime}\left(V^{\prime \prime}, E^{\prime \prime}\right), G^{\prime \prime} \longleftarrow G$
- Add a vertex from $V$ ' to $V^{\text {' }}$, if that vertex is in $D G(V, E)$
$\square$ If a vertex in V is missing in V , add also that vertex to $\mathrm{V}^{\prime \prime}$
- Add an edge from $E^{\prime}$ to $E^{\prime \prime}$ if that edge is in $E$ of $D G(V, E)$
$\square$ If an edge in $E$ is missing in $E^{\prime}$, add also that edge to $E^{\prime \prime}$
- Assign K to $\mathrm{k}, \mathrm{k} \longleftarrow \mathrm{K}$
- Time complexity: $\mathrm{O}(\mathrm{V}+\mathrm{E})+\mathrm{O}(\mathrm{I}) \in \mathrm{O}(\mathrm{V}+\mathrm{E})$, polynomial


## Validation

- Step 3:
- 'Yes' instance of evolution of dual preference orderings implies 'Yes' instance of Dominating Set


## Evolution of Dual Preference Orderings

Dominating Set


- Step 4: Create an instance of evolution of dual preference orderings problem, i.e., $\mathrm{DG}(\mathrm{V}, \mathrm{E})$ and k


## Validation

- Step 5:Transform it to an instance of Dominating Set G(V`, $\left.\mathrm{E}^{\prime}\right)$ and K
- Assign DG to G, G(V', $\left.{ }^{\prime}\right) \longleftarrow \mathrm{DG}(\mathrm{V}, \mathrm{E})$ and $\mathrm{K} \longleftarrow \mathrm{k}$
- 'Yes' of Dominating Set implies 'Yes' of evolution of dual preference orderings



## Validation

DG(V,E) consists of a dominating set iff $G(V, E)$ consists of a dominating set.

Thus, Evolution of Dual Preference Orderings in Games of International Conflict is NP-Complete.

## Implications

- Survivors in current results
- Strong challengers paired with strong defenders
- A few uncommon survivors



## Implications



-Will dominance analysis help us understand

- the approximate 50:25:20 ratio among survivor groups?
- the presence of uncommon survivors?
- If there is no efficient algorithm to find the solution to this problem, what other methods do we have to use, or how differently should we model this problem?


## References

[I] Heckendorn, R. B, Dacey, R., Carlson, L. J,Wu, A. S (2008).'The Evolution of Preference Orderings in Games of International Conflict', presented at the International Studies Association meeting, San Francisco.
[2] Garey, M. R and Johnson, D.S. (1979). Computers and Intractability - A Guide to the Theory of NP-Completeness. W.H. Freeman and Company, NY.
[3] Dutton, R. (20I0). Class Notes: COT64 I 0 Computational Complexity. University of Central Florida, FL.
[4] Pradhan, R. and Wu, A.S. The Evolution of Dual-preference orderings in Games of International Conflict, Manuscript in preparation

## Questions?

Thank you!

