



# Climate Change and Game Theory

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# Working Paper

## Environmental Economics Research Hub Research Report 62, 'Climate Change and Game Theory: a Mathematical Survey', available from

[http://www.crawford.anu.edu.au/research\\_units/eerh/publications.php](http://www.crawford.anu.edu.au/research_units/eerh/publications.php).

### Climate Change and Game Theory: a Mathematical Survey

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#### Abstract

This survey paper examines the problem of achieving global cooperation to reduce greenhouse gas emissions. Contributions to this problem are reviewed from non-cooperative game theory, cooperative game theory, and implementation theory.

Solutions to games where players have a continuous choice about how much to pollute, games where players make decisions about treaty participation, and games where players make decisions about treaty ratification, are examined. The implications of linking cooperation on climate change with cooperation on other issues, such as trade, is examined. Cooperative and non-cooperative approaches to coalition formation are investigated in order to examine the behaviour of coalitions cooperating on climate change.

One way to achieve cooperation is to design a game, known as a mechanism, whose equilibrium corresponds to an optimal outcome. This paper examines some mechanisms that are based on conditional commitments, and could lead to substantial cooperation.



The screenshot shows the website for the Crawford School of Economics & Government at ANU. The header includes the ANU logo and the school's name. A navigation bar contains links for HOME, RESEARCH, FUTURE STUDENTS, CURRENT STUDENTS, ALUMNI, EXECUTIVES, and MEDIA. The main content area is titled 'Environmental Economics Research Hub' and features a banner image of a globe. Below the banner, there is a 'Research Reports' section with a link to 'EERH Research Reports Abstracts 1 - 47'. A list of reports is displayed, including 'Climate Change and Game Theory' by Peter J. Wood, 'Inducing Strategic Bias' by Burton M., 'The Value of Tropical Waterways and Wetlands' by McCartney, Cleland, and Burton, 'Initial Allocation Effects in Permit Markets with Bertrand Output Oligopoly' by Calford, Heinzel, and Betz, and 'Tradable Green Certificates as a Policy Instrument?' by Heinzel and Winkler.

# Outline

We will review how game theory can be applied to climate change mitigation, then discuss policy implications.

- Non-cooperative Game Theory
- Coalitions
- Implementation Theory
- Policy Implications

# The Problem

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- We need to find mechanisms that facilitate cooperation, such as international negotiations
- Game theory can help us understand strategic behaviour in this situation, and find mechanisms to address this problem

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  - A set of possible *strategy combinations*, each strategy combination assigns a strategy to each player
  - A set of *payoffs* received by each player for each possible strategy combination
- The key solution concept is the *Nash equilibrium*
- The Nash equilibrium is a strategy combination where no single player can improve their payoff by playing a different strategy when the other players are playing their Nash equilibrium strategy

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		Player 2	
		<i>Abate</i>	<i>Pollute</i>
Player 1	<i>Abate</i>	$(-1, -1)$	$(-10, 0)$
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- The Nash equilibrium has each player continuing to pollute

# Example: Normal Form Climate Change Game

- A continuous 'prisoner's dilemma'

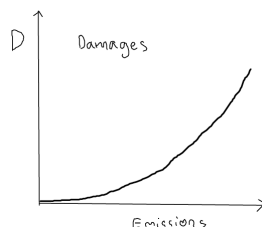
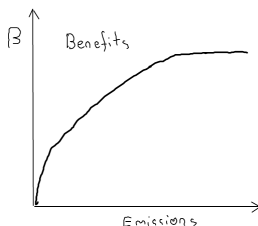
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- Each player  $i$  represents a country that is choosing its level of greenhouse gas emissions  $e_i$
- Each player has an emissions *benefit function*  $\beta_i$  satisfying  $\beta'_i > 0$  and  $\beta''_i \leq 0$ ; and an emissions *damage function*  $D_i$  satisfying  $D'_i > 0$  and  $D''_i \geq 0$ .



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- The utility of player  $i$  is given by

$$\pi_i = \beta_i(e_i) - D_i\left(\sum_{j \in N} e_j\right)$$

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- The Nash equilibrium involves significantly less emission reductions and less net benefits than the socially optimal outcome – but does involve some emission reductions

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- The subgame perfect equilibrium can be calculated by *backwards induction*



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  - **Stage 2** each country decides whether to ratify the treaty
- In order to ratify a treaty, the United States requires 67 out of 100 Senate votes, making ratification difficult
- Backwards induction suggests that negotiators will take into account that a treaty will have to be sufficiently aligned with the domestic interests of the United States, in order for it to be ratified by the United States.

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- Subgame perfect equilibrium can be found with backwards induction
- For 2 players, the game will lead to a socially optimal outcome, but for more players it will not

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- They found that a grand coalition would be stable

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- It is easier to form a grand coalition for a negative coalition externality game (Maskin, 2003)
- It is possible to link issues by adding the associated payoffs together
- Possible issues include trade, and technology cooperation

# Non-cooperative Approaches to Coalition Formation

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- For Stage 1, there are a large variety of coalition formation processes

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- The sequential move unanimity game (based on an exogenous ordering of players)

# Implementation Theory

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- We are dealing with an international problem, and there is no world government. So we are particularly interested in games which do not require strong institutions.

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- The social optimum is *implemented by a mechanism* via a *solution concept* if the solution concept corresponds to the same outcome as the socially optimal outcome



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- Each player voluntarily commits an amount of their choice to the provision of a public good
- If the total amount of contributions add up to a pre-determined amount (the cost), then the players pay and the good is provided
- If not, then nobody has to pay, and the good is not provided

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**Stage 1** Countries choose matching rates  $m_{ij}$ , the rate at which country  $i$  increases their abatement based on country  $j$ 's direct abatement

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- The total abatement of each country is given by

$$A_i = a_i + \sum_{j \neq i} m_{ij} a_j$$

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- The subgame perfect equilibrium of this game achieves the efficient level of pollution abatement
- If a third stage is added where countries trade permits, marginal abatement costs are equalised
- This game requires that countries can *commit* to their matching rates
- Helps explain the significance of conditional targets.

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  - Cooperation could be more likely if the international legal architecture can include conditional commitments
  - It could be possible to make backtracking less likely by repeating games
  - Another way that countries can make a commitment is by putting it in their domestic legislation

# Thankyou

