

# Mindset of policymakers matters: cases of climate coalition formation

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# Introduction

- Signatories of climate coalitions promise to reduce emissions jointly.
- Different climate coalitions have different levels of ambition in emission reduction.
- We model the formation of climate coalitions, and try to predict the number of coalitions and the number of signatories.
- Signatories commit to maximising payoffs of all coalition members in choosing their emission reduction levels.

- Our policymakers are **strategic** (or farsighted):
  - they predict the entire coalition structure
  - they take into account the consequences of their membership decisions on others
- Existing methodology of coalition formation by such strategic agents:
  - algorithms to find the number of coalitions and their signatories iteratively
  - in public-good games: small efficiency loss (Ray and Vohra, 2001, JPE)
  - for **univariate** payoff functions

# Contribution

- We generalise coalition formation with public goods to have **multivariate** payoff functions.
- An example is relaxing the fixed parameters that can capture the '**mindset of policymakers**' in climate negotiations.
- Two applications:
  - **Dynamic games**: climate coalition formation + Integrated Assessment Model (IAM)  
→ we characterise equilibrium at each value of discount factor
  - **Stochastic games**: climate coalition formation + unknown decay rate of GHG  
→ we characterise equilibrium at each value of uncertain decay rate of GHG

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- We offer an algorithm to **fully characterise** the equilibrium number of climate coalitions and their number of signatories for **multivariate** payoff functions.
- Our algorithm captures a larger set of equilibria, even for **univariate** payoff functions.
- **Policy** message from the applications:
  - ◇ discount factor (or time horizon) of policymakers affect their membership decisions!
  - ◇ beliefs of policymakers about uncertain parameters affect their membership decisions!

Thus, they should be taken into account in the design of climate treaties.

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## Introduction

### Climate coalition formation + unknown decay rate of GHG

- Climate coalition formation
- The economy and climate
- Analysis of Action stage

### Membership decisions

- Farsightedness Methodology
- Brute-force observations
- Algorithm

## Conclusion

# Setup

- Country  $i \in I$ , and set of countries is  $I \equiv \{1, 2, \dots, N\}$
- Time is discrete,  $t = 0, 1, 2, \dots$
- Each country has a planner, who represents it in climate negotiations and can implement desired outcomes in a decentralised economy
- Open membership + binding + irreversible agreements
- Let  $n$  be the number of active players in the negotiation room ( $n \leq N$ ).
- Symmetric countries

# Timeline

## Two-stage climate coalition formation

- ◇ Beginning of period  $t$ : **membership stage**
- ◇ From end of period  $t$  onward: **action stage**
  - coalitional decisions within coalitions (e.g., emission reduction)
  - country-level decisions (if any)
- ◇ At the end of each period actions are observed and payoffs are realised.

### Membership stage

- **Coalition structure** is a partition of set  $I$  into coalitions,  $\mathbb{M} \equiv \{M_1, M_2, \dots, M_k\}$ .
- $m_j$  is number of signatories of  $M_j$ .
- **Numerical coalition structure (substructure)**,  $\mathcal{M} \equiv \{m_1, m_2, \dots, m_k\}$ .

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# The economy and climate

$q_{it}$ : abatement level

$Q_t$ : stock of GHG

$\beta$ : discount factor

$\eta$ : mSCC

$1 - \phi$ : (belief about )  
decay rate of GHG

$\Psi$ : unabated emission

Country  $i$  minimises

$$\sum_{\tau=0}^{\infty} \beta^{\tau} \Pi(q_{it+\tau})$$

where  $\Pi_{it} = \frac{q_{it}^2}{2} + \eta Q_t$

$$Q_{t+1} = \phi Q_t + \Psi - \sum_i q_{it}$$

Dutta and Radner (2006, 2009, 2012)

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## Solution concept

- Pure strategy Markov Perfect equilibrium  
**current state:** the formed coalitions (if any); number of those negotiating (if any); proposal (if ongoing or signed);  $Q_t$ .
- Strategies of country  $i$ : as P and as R (in period zero); and action stage strategies:  $\{q_{1it+\tau}(m, \mathcal{M})\}_{\tau=0}^{\infty}$



## Action stage

The  $m$  member of coalition  $M$  minimise,

$$\sum_{i \in M} \sum_{\tau=0}^{\infty} \beta^{\tau} \{\Pi(q_{it+\tau})\}$$

subject to: climate dynamic constraint

### Proposition

- ◇ Optimal abatement level of  $i \in M$  is:

$$q_i(m) = \frac{\beta \eta m}{1 - \beta \phi}$$

- ◇ Abatement strategies are **dominant** against what other coalitions choose.

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# Backward induction to the membership stage

- **Optimum-value function** of  $i \in M$  is  $V_i(\phi, m, \mathcal{M})$

Value Function

Membership decision of **strategic** countries in the *equilibrium binding agreement* of Ray and Vohra (1999)

$\mathcal{M}^*$  is immune to unilateral and multilateral deviations by

- ◇ the deviating group, before signing any agreement,
- ◇ the active players in the negotiation room.

## Farsightedness methodology

- **Ray and Vohra (1999)** The equilibrium  $\mathcal{M}^*$  needs to be found **iteratively**: checking iteratively for which group of countries, a grand coalition forms in equilibrium.

i.e. at stage  $n$  of the iteration process, there are  $n$  countries negotiating, if  $n = 2$ , then  $\mathcal{M}^* = ?$  Then if  $n = 3$ ,  $\mathcal{M}^* = ?$  Then, if ... .

- for example, if at  $n = 2$ ,  $\mathcal{M}^* = \{2\}$ , then at  $n = 3$ , compare payoff of  $\{3\}$  v.s  $\{2, 1\}$  (and  $\{1, 1, 1\}$ ).

- **Public-good games: Ray and Vohra (2001)**

1. In any stage of recursion, to check whether  $\{m_1, m_2, \dots, m_k\}$  forms versus the grand:

$$V_i(m_1, \mathcal{M}) - V_i(n)$$

2. The idea of **decomposition** of  $n$  using only  $\mathcal{M}^*$  of the previous stages

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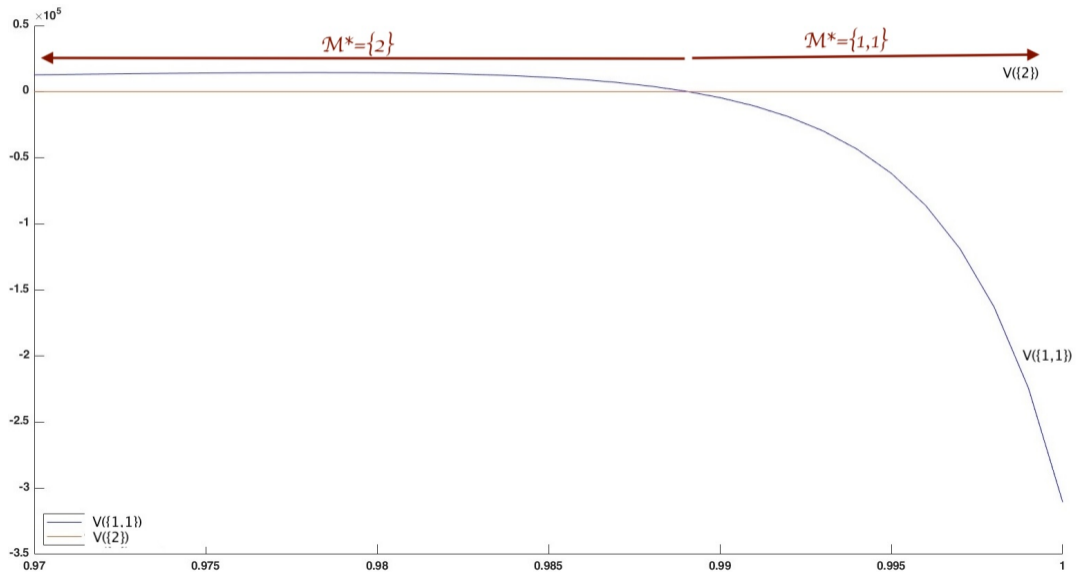
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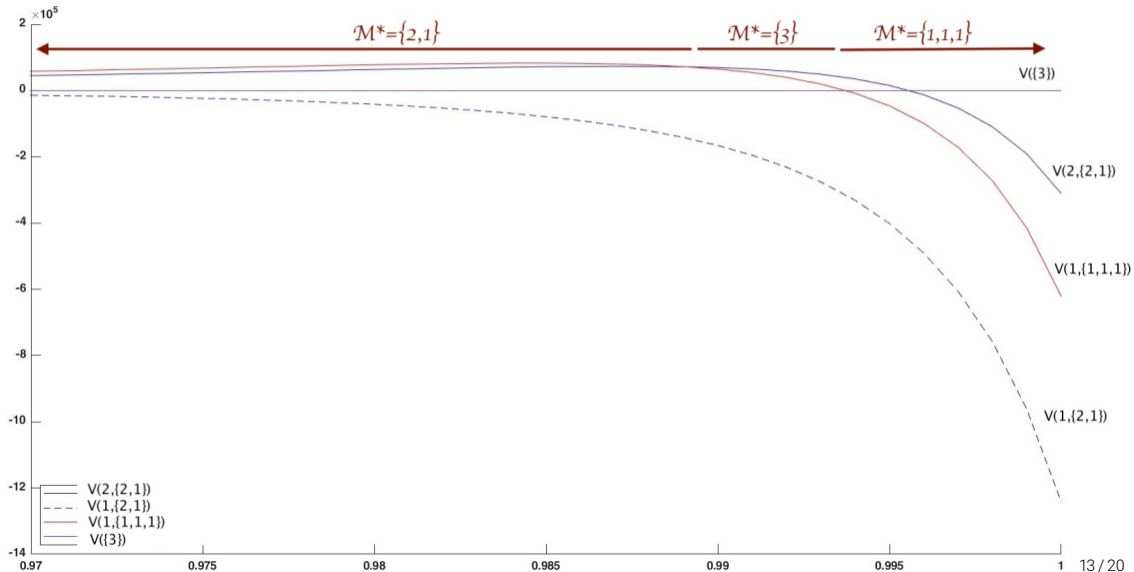
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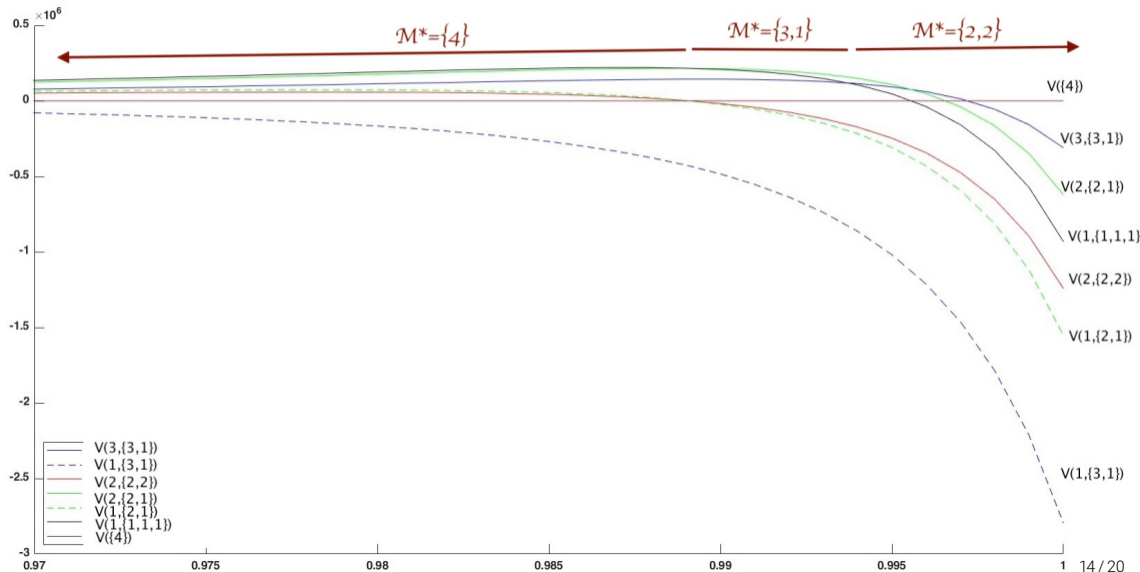
# Brute-force observations: $n = 2$



# Brute-force observations: $n = 3$



# Brute-force observations: $n = 4$





# Observations from the brute-force approach

- ◇ **Observation 1:** for each  $n > 1$ , the equilibrium coalition structure depends on decay rate,  $\phi$ .
- ◇ **Observation 2:** coalitions of equal size can emerge in equilibrium, e.g.,  $\mathcal{M}^* = \{2, 2\}$  for  $n = 4$  (even by collapsing  $\phi$ ).

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- ◇ As  $N$  increases, applying a brute-force approach (e.g. farsighted algorithms of Ray and Vohra, 1999) to check all possible payoffs across  $\phi$ , can be tedious and computationally demanding.
- ◇ We need an approach to **reduce the number of possibilities**.
- ◇ The algorithm should rely on an iteration process too, but each step in the iteration process **depends on**  $\phi$ .
- ◇ In a public-good game, the smallest coalitions have the highest payoffs. But we can't compare only the *decomposition* of  $n$  (from previous stages) with the grand's payoff, as coalition structures with **repeated elements** should be checked too.
- ◇ By dependence of payoffs on  $\phi$ , multiplicity of equilibria can happen only at thresholds, where we break the ties in favour of the largest coalition. Otherwise,  $\mathcal{M}^*$  is **unique**.

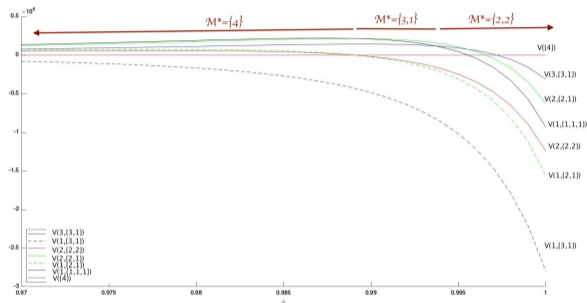
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- (I) For  $n = 1$ ,  $\mathcal{M}^* = \{1\}$  at any  $\phi$ .
- (II) at each stage  $n > 1$  of the recursion,
  - write down the family of all possible  $\mathcal{M}$ ,
  - partition  $\phi$  based on its thresholds at stage  $n - 1$ , and at each partition, eliminate all known unstable  $\mathcal{M}$  based on all previous rounds of recursion,
  - among the remaining  $\mathcal{M}$ , compare payoff of one country in the smallest (if any) coalition of each  $\mathcal{M}$ , and find  $\mathcal{M}$  with the maximum payoff.
- (III) stop at  $n = N$ .

The application example ( $n = 4$ ):

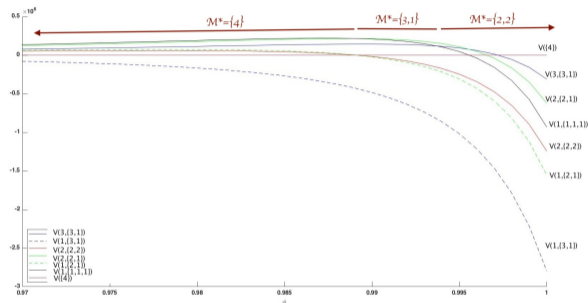


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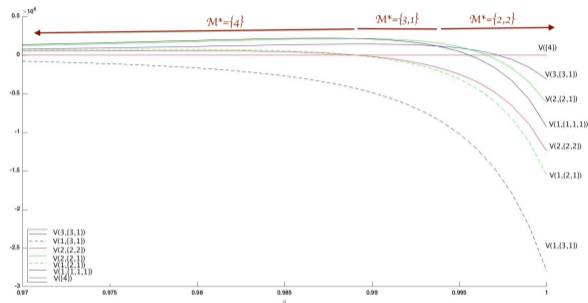


$$\mathcal{F} = \{ \{4\}, \{3, 1\}, \{2, 1, 1\}, \{1, 1, 1, 1\} \}$$

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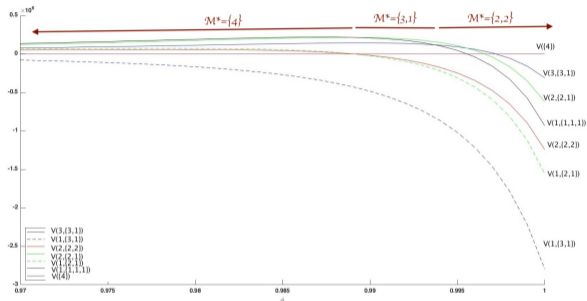




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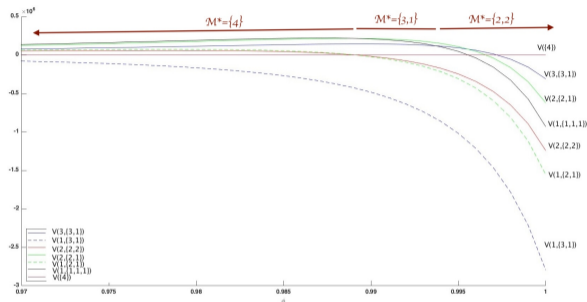
$$\begin{cases} \{1, 1, 1, 1\} \text{ or } \{4\} \text{ or } \{2, 2\} & \text{if } 0.994 < \phi \\ \{3, 1\} \text{ or } \{4\} \text{ or } \{2, 2\} & \text{if } 0.989 < \phi \leq 0.994 \\ \{4\} \text{ or } \{2, 2\} & \text{if } \phi \leq 0.989 \end{cases}$$

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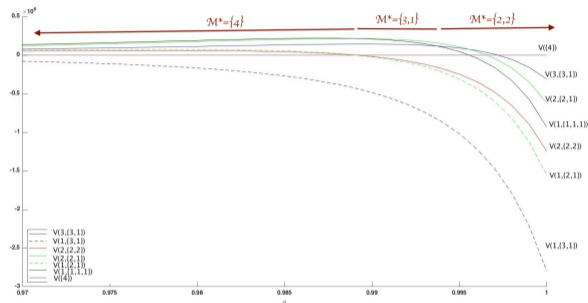


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## More on the elimination step

At stage  $n$  and at each partition,

**(a)** among all possible coalition structures, **eliminate** all unstable  $\mathcal{M}$  based on **all** previous rounds of recursion:

- from the previous stages, only  $\{\mathcal{M}_{n-j}^*, j\}$  for  $j < \frac{n}{2}, \dots$ , can be potentially self-enforceable.
- This reduces the number of checks.

For example, in the application: at  $n = 4$  and  $0.994 < \phi$ , eliminate  $\{3, 2\}$  and  $\{3, 1, 1\}$ , since at  $n = 3$  and at that partition of  $\phi$ ,  $\{3\}$  was not self-enforceable.

**(b)** In addition, we include coalition (sub)structures with **repeated elements**, in addition to the grand  $\{n\}$ .

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$N = 40$  and the application example:

If  $\phi = 0.985$  then  $\mathcal{M}^* = \{29, 8, 2, 1\}$

If  $\phi = 0.995$  then  $\mathcal{M}^* = \{20, 20\}$

- At higher natural decay rate of GHG (smaller  $\phi$ ), the countries form larger coalitions in equilibrium.



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- ◇ The design of an architecture for climate treaties should depend on parameters of underlying models, e.g. those related to the policymakers mindset: their discount factor or their belief about decay rate of GHG, etc.
- ◇ We generalise coalition formation game with public goods to multivariate payoff functions.
- ◇ We offer an algorithm to fully characterise  $\mathcal{M}^*$  in coalition formation of climate games by *strategic* agents.
  - ◇ Unique prediction of equilibrium climate coalitions
  - ◇ Characterising broader set of equilibrium outcomes