

Integrated MARKAL modeling of world cooperative and non-cooperative CO₂ mitigation strategies

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- Introduction
Non-cooperative climate scenarios
- Integrated MARKAL model
Coupling of climate damages and MARKAL
optimization model
- How to guarantee cooperation of all regions?
Gain of cooperation over non-cooperation
Allocation of the gain between the regions
- Conclusion

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Need for non-cooperative climate scenarios

- Optimization models: Global optimal solution assumes full cooperation => No guarantee of individual profitability and some countries or subcoalitions may be better-off under no-cooperation
- Risk that countries free-ride and then enjoy the pollution abatement undertaken by the others (unstability)
No-cooperation => No globally accepted CO₂ target
=> Endogenous emission level



Integrated MARKAL with endogenous climate damages

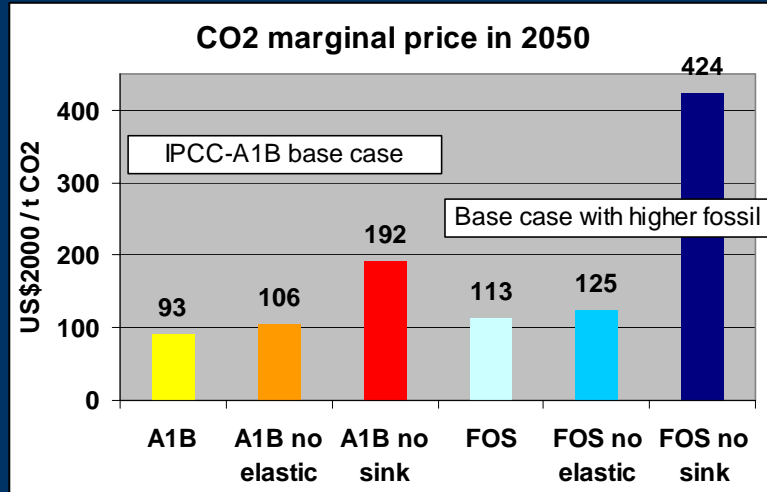
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World multi-regional MARKAL

- Linear programming & technology rich model of the production, conversion, trade and end-use of various forms of energy
 - Supply-demand partial equilibrium on energy markets
 - Perfect foresight & information : 2000-2050
 - 15 regions: AFR, AUS, CAN, CHI, CSA, EEU, FSU, IND, JPN, MEA, MEX, ODA, SKO, USA, WEU
-
- Inspired by the first two versions of the model developed in collaboration with US DOE-EIA (SAGE model) and IEA (ETP)
 - Calibration of the IPCC-A1B scenario for emissions, primary and final energy
 - Competitive energy international markets except oil: cartel pricing by OPEC

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Cooperative scenario 550 ppm



More details on the version of the MARKAL model used for this work :
Labriet et al., 2004 (in press)

Damages and MARKAL coupling

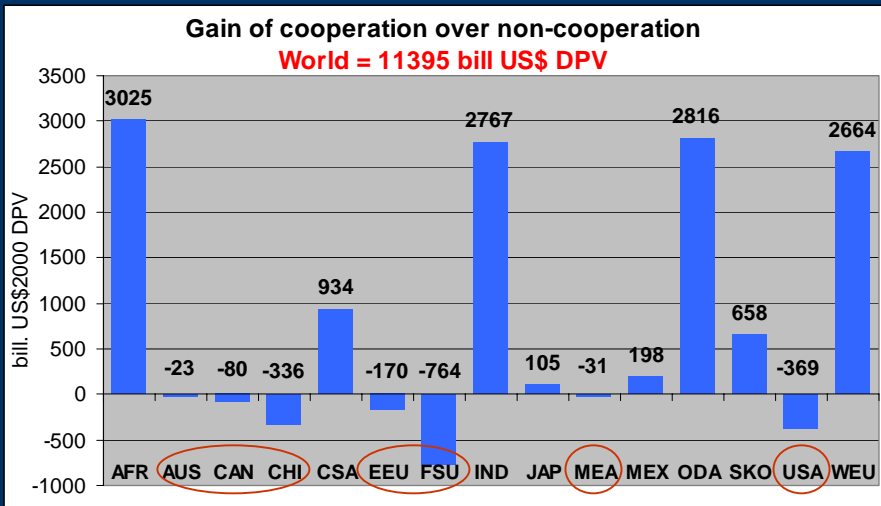
- Facilitated by the hypothese (empirical verified) that
 $Cum D_i = a_i * Cum Emi_{world} + b_i$
(climate model and damages from Nordhaus and Boyer, 1999)
- Under no-cooperation (Nash open-loop), energy decisions by country i depend only on the part of its own damages due to its own emissions
 \Rightarrow MARKAL: $\min C_i(X_i, E_i) + a_i * E_i$

| | a_i (US\$/tCO2) |
|-------|----------------------|
| AFR | 4.15 |
| AUS | 0.01 |
| CAN | 0.02 |
| CHI | 0.68 |
| CSA | 1.84 |
| EEU | 0.04 |
| FSU | -0.03 |
| IND | 3.66 |
| JAP | 0.31 |
| MEA | 1.33 |
| MEX | 0.65 |
| ODA | 4.15 |
| SKO | 1.06 |
| USA | 0.79 |
| WEU | 4.10 |
| World | 22.75 |

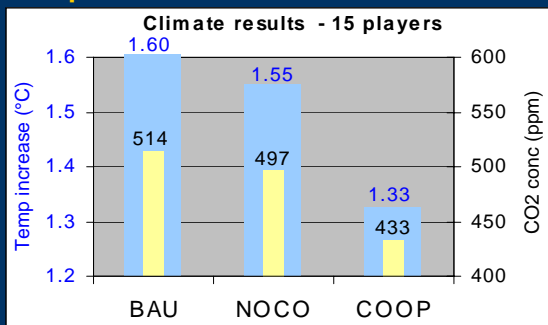
Equivalent to a carbon tax
(23\$/tCO2 in 2000 up to 261\$/tCO2 in 2050)

Total gain

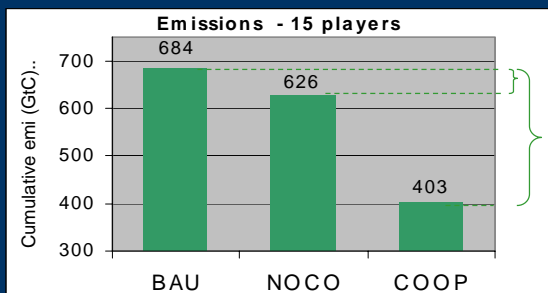
- Gain = Cost NOCO (15 singletons) - Cost COOP (global coop)
=> Available for side-payments
- Threat = The whole agreement collapses if one region defects



Gap between COOP and NO-COOP (2050)



NOCO "does less" than the 550 ppm scenario:
 $\Delta T = 1.39^\circ\text{C}$
 CO2 = 457 ppm
 Cum emi = 482 GtC



NOCO is closer to BAU than to COOP:
 cum emission reduction under NOCO = 21% of reduction under COOP

Distribution issues

- How to allocate the gain of cooperation among the regions to deter any free-riding behavior?
- 4 players => 15 coalition structures = 15 runs ~ 30h

| | |
|---------|---|
| 1 = USA | 3 = DC (Developing countries) |
| 2 = WEU | 4 = OCD+ (Economy in transition + other OECD) |
- Player = pre-existing coalition
=> No-cooperation with 4 players is more than with 15 players: $\Delta T_{4 \text{ players}} = 1.43 \text{ }^\circ\text{C} < \Delta T_{15 \text{ players}} = 1.55 \text{ }^\circ\text{C}$ (2050)
- Left-out-players : play individually (no multi-coalition, no punishing behavior)

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Allocation of the gain of Coop over No-coop

USA & OCD+ are better off in no-cooperation
=> won't cooperate without transfer

Gain of cooperation

| A1B-REF | | USA | WEU | DC | OCD+ | Total |
|---|----------------------|------|------|-------|------|-------|
| Gain of COOP over Nash w/o transfers (bill. US\$ ₂₀₀₀ -DPV) | NASH - COOP | -632 | 953 | 4767 | -453 | 4635 |
| Allocation of the gain (bill. US\$ ₂₀₀₀ -DPV) | Nucleolus | 862 | 924 | 1690 | 1160 | 4635 |
| | Shapley | 774 | 833 | 1930 | 1099 | 4635 |
| | GTT | 161 | 836 | 3353 | 286 | 4635 |
| | Abatement cost / GDP | 889 | 1052 | 1799 | 895 | 4635 |
| Transfers (payments if negative) (bill. US\$ ₂₀₀₀ -DPV) | Nucleolus | 1493 | -28 | -3078 | 1613 | 0 |
| | Shapley | 1405 | -120 | -2838 | 1552 | 0 |
| | GTT | 792 | -117 | -1415 | 740 | 0 |
| | Abatement cost / GDP | 1521 | 99 | -2968 | 1348 | 0 |

Different normative rules => Different axiomatic properties
=> Different allocations and transfers

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Stability of coalitions without transfers

- **Internal stability:** No region has an incentive to leave the coalition (coalition formation approach by Barrett, Carraro & Siniscalco)
- **Farsighted players:** Takes into account the possibility of subsequent deviations (more realistic)
- **No multi-coalitions:** When a region deviates, it can not merge with another deviating region
- **Starting from [USA WEU DC OCD+]**
=> no intermediate coalition is internally stable
- **Starting from proposed Kyoto coalition [USA WEU OCD+]**
=> coalition [WEU, OCD+] is internally stable

[WEU OCD+] internally stable
(starting from Kyoto coalition)

| A1B-REF | | Total cost (bill. US\$-DPV) | | | | GtC |
|-----------|----------|-----------------------------|-------|--------|-------|-----------|
| Coalition | Defector | USA | WEU | DC | OCD+ | Total emi |
| 1111 | (COOP) | 59342 | 53657 | 147902 | 52353 | 403 |
| 1101 | DC | 58772 | 54094 | 150308 | 51782 | 467 |
| 1100 | OCD+ | 58799 | 54425 | 151769 | 51852 | 493 |
| 1001 | WEU | 58712 | 54479 | 152121 | 51866 | 498 |
| 0101 | USA | 58659 | 54328 | 151326 | 51830 | 484 |
| 0000 | (NASH) | 58711 | 54610 | 152669 | 51900 | 507 |

Conclusion

- **First step towards an Integrated MARKAL (energy+climate+damages)**
 - Climate is represented by specific damage factors
 - Facilitated by linear damage functions. Non-linear damage functions could also be accommodated (if convex)
 - Two uses of the model for climate change studies
 - COOP: Cost-efficient attainment of a globally agreed CO₂ target (exogenously defined)
 - NO-COOP: Cost-benefit analysis of mitigation strategies where the model balances cost of abatement and climate damages and computes the resulting emissions
 - Few applications related to the use of game theory principles in such a large empirical model
- **Future work / limitations**
 - More complex climate model could be used with same approach
 - Longer time horizon desirable (TIMES model) => review Dam = f(Cum Emi)
 - Other GHG to be modeled
 - Regular update of MARKAL technologies

Conclusion

■ Future work / limitations

- Open-loop Nash => perfect foresight and binding commitments
=> unrealistic? + only lump sum transfers (no allocation over time)
- Limited number of players => they consist of a large number of different countries assumed to cooperate => lack of realism
- Uncertainties on: climate parameters, damages, discount rate

■ Distribution issues

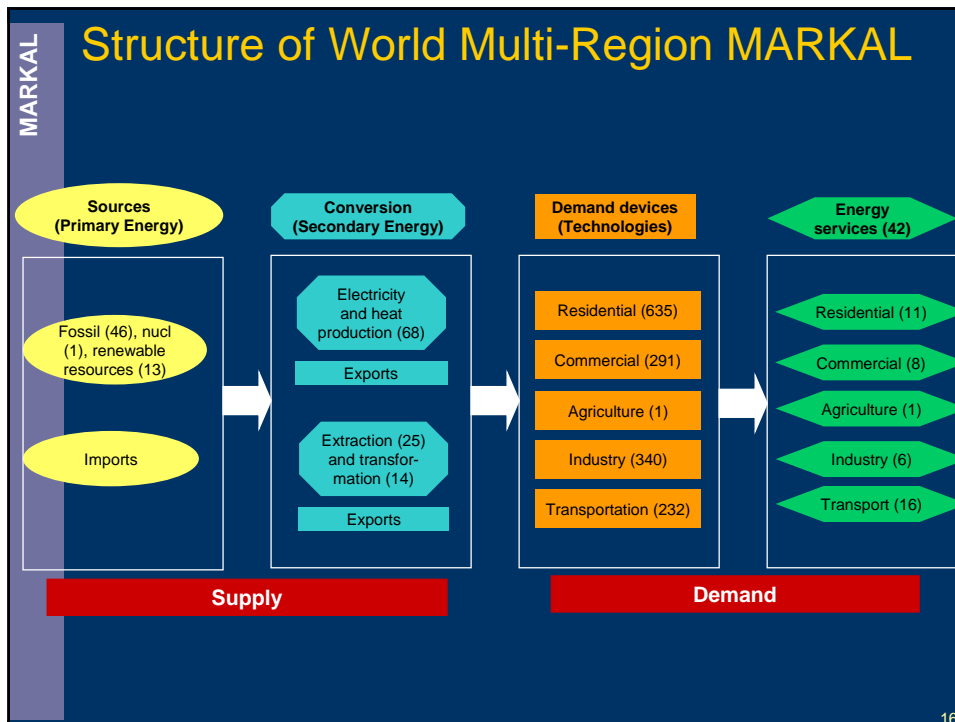
- Different allocation rules => different allocation
=> to be chosen by decision-makers
- Institutional implementation?
- Sensitivity analyses on base case, damages and sinks (not shown here)
=> level and regional distribution of damages are crucial for transfers and stability
=> base case and sinks are crucial for mitigation cost and technology choices

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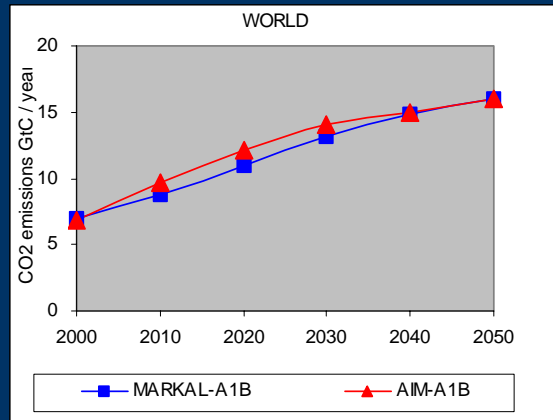
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Thank you

Appendix



Calibration of the base case



Cost analysis

Decrease in 2040 :
penetration of more advanced wind technologies available in 2040

| US\$2000 / t CO2 | 2000 | 2010 | 2020 | 2030 | 2040 | 2050 |
|---------------------|------|------|-------|-------|-------|-------|
| 550-A1B | 0 | 32.4 | 60.4 | 62.6 | 54.1 | 92.8 |
| 550-A1B not elastic | 0 | 45.3 | 68.5 | 71.6 | 54.0 | 105.7 |
| 550-A1B no sink | 0 | 42.6 | 119.0 | 148.9 | 139.8 | 191.8 |
| 550-FOS | 0 | 36.9 | 60.9 | 63.6 | 55.0 | 113.2 |
| 550-FOS not elastic | 0 | 51 | 68.8 | 81.2 | 67.9 | 124.5 |
| 550-FOS no sink | 0 | 47.8 | 139.3 | 194.1 | 209.6 | 423.5 |

Comparison of carbon price between scenarios (more interesting than absolute values) :

- > No elastic demands
=> price +14% and +10% in A1B and FOS in 2050
- > No CO₂ sequestration
=> price multiplied by more than 2

Comparison with other studies related to the Kyoto Protocol with a global trading of carbon permits (4-44 US\$₂₀₀₀ / tCO₂) :

- > 2010 prices = high range of carbon prices

Damages and MARKAL coupling

Hypothesis : Damages depend only on total cumulative emissions, irrespective of the shape of the trajectory

?? $D_i = f_i(\text{CumEmi})$?? → $\text{Cum } D_i = a_i * \text{Cum Emi}_{\text{world}} + b_i$

Empirical testing (Labriet *et al.*, 2003) with 30 contrasted emission trajectories (Nakicenovic, 2000), climate model and regional quadratic damage functions of ΔT (Nordhaus and Boyer, 1999)

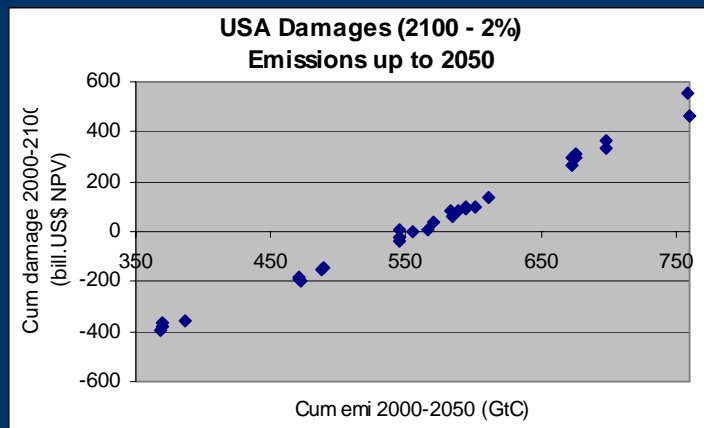
$$\text{Cost}_i = C_i(X_i, E_i) + D_i(\sum_k E_k) = C_i(X_i, E_i) + a_i * \sum_k E_k + b_i$$

=> Cooperation: $\min \{ \sum_i C_i(X_i, E_i) + (\sum_i a_i) * (\sum_k E_k) \}$ *Sum of damages*

=> No-coop (Nash) : $\min C_i(X_i, E_i) + a_i * E_i$ *Regional damages only*

- No-Coop = Local optimization problem
- Damages supported by each region i due to emissions of other countries are added *ex-post*
- Assumption of only one interdependency between regions : International trade of energy commodities is not affected by climate policies

Damages and MARKAL coupling



Similar curve available for each region and for the world

Damages scenarios

| Damage factors (US\$2000 / tCO2) | Mid damages (^2) | High damages (^3) | Mid damages (^2) | High damages (^3) |
|----------------------------------|--------------------------|--------------------------|--------------------------|--------------------------|
| Share of damages | High share dev countries | High share dev countries | High share ind countries | High share ind countries |
| Name of scenario | Reference | High | Reverse | High & reverse |
| AFR | 4.15 | 6.36 | 1.14 | 2.45 |
| AUS | 0.01 | 0.17 | 0.23 | 0.49 |
| CAN | 0.02 | 0.37 | 0.23 | 0.49 |
| CHI | 0.68 | 3.28 | 1.37 | 2.95 |
| CSA | 1.84 | 3.30 | 0.91 | 1.96 |
| EEU | 0.04 | 0.41 | 0.23 | 0.49 |
| FSU | -0.03 | 1.89 | 1.59 | 3.44 |
| IND | 3.66 | 6.98 | 1.14 | 2.45 |
| JPN | 0.31 | 1.21 | 3.41 | 7.36 |
| MEA | 1.33 | 2.27 | 0.34 | 0.74 |
| MEX | 0.65 | 1.32 | 0.34 | 0.74 |
| ODA | 4.15 | 7.27 | 1.14 | 2.45 |
| SKO | 1.06 | 1.82 | 0.46 | 0.98 |
| USA | 0.79 | 2.78 | 5.01 | 10.80 |
| WEU | 4.10 | 9.69 | 5.23 | 11.29 |
| Total | 22.75 | 49.10 | 22.75 | 49.10 |
| % GDP for 2.5°C | 1.94% | 4.16% | - | - |
| % GDP for 2xCO2 (2066) | 1.34% | 1.94% | - | - |

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Losers and winners (without transfers)

- Regions with low & intermediate damages: generally not interested in COOP
 - FSU (neg dam but small absolute value) prefers BAU (highest emi). In NOCO, local increase of emi by FSU (+1%) is not high enough to compensate emi. reduction by other regions => FSU prefers BAU

| PREFERRED STRATEGY | Mid damages (^2) | Mid damages (^2) |
|-------------------------------------|--------------------------|--------------------------|
| | High share dev countries | High share ind countries |
| | A1B-Reference | A1B-Reverse |
| AFR | COOP | COOP |
| AUS | NOCO | COOP |
| CAN | NOCO | COOP |
| CHI | NOCO | COOP |
| CSA | COOP | COOP |
| EEU | NOCO | NOCO |
| FSU | BAU | COOP |
| IND | COOP | COOP |
| JPN | COOP | COOP |
| MEA | NOCO | NOCO |
| MEX | COOP | NOCO |
| ODA | COOP | COOP |
| SKO | COOP | COOP |
| USA | NOCO | COOP |
| WEU | COOP | COOP |
| Total | COOP | COOP |
| Gain from full coop (bill.US\$ DPV) | 11274.82 | 11879.62 |

- AUS, CAN, CHI, FSU, USA: switch to COOP
 - MEA : still prefers NOCO because of exports reduction under COOP
 - EEU : damage factor still too low
 - MEX: switch to NOCO

Remarks

- > Preferred strategies depend on damage factors and available local options
- > Limit of the analysis : Underlying assumption of COOP = all regions are engaged to respect their preferred strategies

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Results

| A1B | Cum emi in base case | Marginal dam (US\$ ₂₀₀₀ /tCO ₂) and regional share (%) | | % reduction wrt itself | | | % reduction wrt world reduction | | | Free rider index | |
|-------|----------------------|---|--------------|------------------------|----------|----------|---------------------------------|----------|----------|------------------|------|
| | A1B-BAU | REF | REV | COOP | NASH-REF | NASH-REV | COOP | NASH-REF | NASH-REV | REF | REV |
| USA | 14.5% | 0.78 (3.4%) | 5.00 (22.0%) | -33.8% | -1.7% | -14.1% | 11.9% | 1.0% | 11.9% | 3.12 | 0.48 |
| WEU | 10.0% | 4.10 (18.0%) | 5.23 (23.0%) | -40.0% | -17.1% | -20.2% | 9.7% | 6.6% | 9.7% | 0.49 | 0.38 |
| DC | 57.8% | 16.45 (72.3%) | 6.37 (28.0%) | -43.6% | -39.7% | -26.5% | 61.3% | 88.7% | 61.3% | 0.77 | 1.90 |
| OCD+ | 17.7% | 1.40 (6.1%) | 6.14 (27.0%) | -39.6% | -5.5% | -23.7% | 17.1% | 3.7% | 17.1% | 2.50 | 0.55 |
| World | 100.0% | 22.75 (100%) | 22.75 (100%) | -41.1% | -25.9% | -23.6% | 100.0% | 100.0% | 100.0% | - | - |

| FOS | Cum emi in base case | Marginal dam (US\$ ₂₀₀₀ /tCO ₂) and regional share (%) | | % reduction wrt itself | | | % reduction wrt world reduction | | | Free rider index | |
|-------|----------------------|---|--------------|------------------------|----------|----------|---------------------------------|----------|----------|------------------|------|
| | FOS-BAU | REF | REV | COOP | NASH-REF | NASH-REV | COOP | NASH-REF | NASH-REV | REF | REV |
| USA | 14.7% | 0.78 (3.4%) | 5.00 (22.0%) | -44.2% | -1.1% | -23.4% | 13.3% | 0.5% | 13.3% | 4.88 | 0.77 |
| WEU | 9.7% | 4.10 (18.0%) | 5.23 (23.0%) | -46.8% | -21.3% | -26.1% | 9.3% | 6.7% | 9.3% | 0.65 | 0.51 |
| DC | 58.0% | 16.45 (72.3%) | 6.37 (28.0%) | -50.9% | -47.2% | -33.7% | 60.4% | 89.4% | 60.4% | 1.06 | 2.75 |
| OCD+ | 17.7% | 1.40 (6.1%) | 6.14 (27.0%) | -47.2% | -5.8% | -29.1% | 17.1% | 3.4% | 17.1% | 3.52 | 0.81 |
| World | 100.0% | 22.75 (100%) | 22.75 (100%) | -48.9% | -30.6% | -30.7% | 100.0% | 100.0% | 100.0% | - | - |

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Computation of side-payments

- **Shapley value**
 - Each player obtains a share of the gain that reflects its average contribution to each sub-coalition => merit equity rule, always exists
- **CORE**
 - Set of imputations that insure that any sub-coalition gains more in the grand coalition than it could secure on its own => certain form of stability, but may be empty
- **Nucleolus**
 - Minimizes the maximum excess of the coalitions (minimizes the highest dissatisfaction) => unique
- **GTT transfers** (Germain, Toint and Tulkens, 1997)
 - Takes away, for every region, the diff between costs under Nash and coop + divides the surplus in proportion to marginal damages
- **Equalisation of abatement cost / GDP**
 - Horizontal equity principle of comparable burdens: all regions should be affected "similarly"

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Results

| bill. US\$-NPV2000 | | Player 1 | Player 2 | Player 3 | Player 4 | World |
|------------------------|----------------|----------|----------|----------|----------|-------|
| A1B-Reference | | | | | | |
| Allocation of the gain | Nucleolus | 862 | 924 | 1690 | 1160 | 4635 |
| | Shapley | 774 | 833 | 1930 | 1099 | 4635 |
| | GTT | 161 | 836 | 3353 | 286 | 4635 |
| | Mitigation cos | 889 | 1052 | 1799 | 895 | 4635 |
| A1B-Reverse | | | | | | |
| Allocation of the gain | Nucleolus | 972 | 934 | 1111 | 1111 | 4127 |
| | Shapley | 874 | 857 | 1305 | 1091 | 4127 |
| | GTT | 908 | 949 | 1156 | 1114 | 4127 |
| | Mitigation cos | 792 | 936 | 1602 | 797 | 4127 |
| FOS-Reference | | | | | | |
| Allocation of the gain | Nucleolus | 1559 | 1342 | 2639 | 1847 | 7386 |
| | Shapley | 1412 | 1177 | 3058 | 1739 | 7386 |
| | GTT | 256 | 1332 | 5342 | 456 | 7386 |
| | Mitigation cos | 1417 | 1676 | 2867 | 1427 | 7386 |
| FOS-Reverse | | | | | | |
| Allocation of the gain | Nucleolus | 1335 | 1335 | 1335 | 1335 | 5338 |
| | Shapley | 1193 | 1188 | 1687 | 1270 | 5338 |
| | GTT | 1174 | 1228 | 1495 | 1441 | 5338 |
| | Mitigation cos | 1024 | 1211 | 2072 | 1031 | 5338 |

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Results

| bill. US\$-NPV2000 | | Player 1 | Player 2 | Player 3 | Player 4 | World |
|-----------------------------------|----------------|----------|----------|----------|----------|-------|
| A1B-Reference | | | | | | |
| Transfer to receive/give wrt COOP | Nucleolus | 1493 | -28 | -3078 | 1613 | 3106 |
| | Shapley | 1405 | -120 | -2838 | 1552 | 2957 |
| | GTT | 792 | -117 | -1415 | 740 | 1532 |
| | Mitigation cos | 1521 | 99 | -2968 | 1348 | 2968 |
| A1B-Reverse | | | | | | |
| Transfer to receive/give wrt COOP | Nucleolus | -424 | -770 | 1591 | -397 | 1591 |
| | Shapley | -523 | -846 | 1786 | -416 | 1786 |
| | GTT | -489 | -755 | 1637 | -393 | 1637 |
| | Mitigation cos | -605 | -767 | 2083 | -711 | 2083 |
| FOS-Reference | | | | | | |
| Transfer to receive/give wrt COOP | Nucleolus | 2379 | -102 | -4630 | 2353 | 4732 |
| | Shapley | 2232 | -266 | -4211 | 2245 | 4477 |
| | GTT | 1076 | -112 | -1926 | 963 | 2038 |
| | Mitigation cos | 2236 | 232 | -4401 | 1933 | 4401 |
| FOS-Reverse | | | | | | |
| Transfer to receive/give wrt COOP | Nucleolus | -372 | -859 | 1822 | -591 | 1822 |
| | Shapley | -513 | -1006 | 2174 | -655 | 2174 |
| | GTT | -532 | -966 | 1982 | -484 | 1982 |
| | Mitigation cos | -683 | -982 | 2559 | -894 | 2559 |

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