

# Mitigation policy cost and Uncertainty

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## Uncertainty and climate change

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## But mitigation costs are also uncertain

- Uncertainty of mitigation costs is wide and is increasing over time (Lemoine & McJeon, 2013; Drouet *et al.*, 2015 ).
- This has an important implication when taking decision under uncertainty:
  - ▷ Stringent policy implies a risk of a very costly mitigation.

## IPCC AR5 scenario database

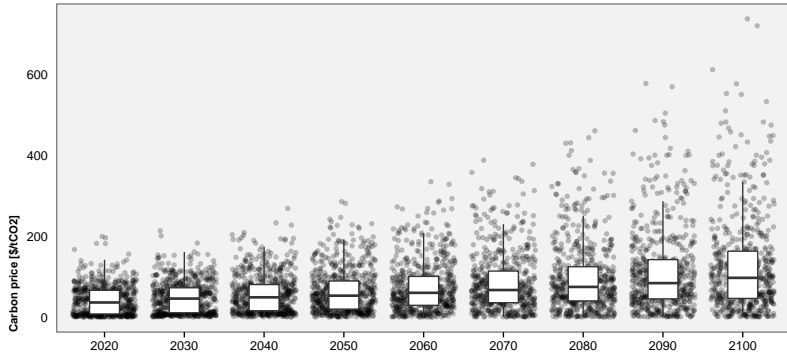
- created for the IAMC and is hosted by IIASA
- model outcomes reviewed by the AR5 WGIII of IPCC
- publicly available at  
<https://secure.iiasa.ac.at/web-apps/ene/AR5DB>

## Dataset description

- 25'000 mitigation costs
- 9 model intercomparison projects
- time range: 2020–2100 (every 10 year)
- model versions [19]
- scenarios [157]

# IPCC AR5 mitigation costs

Distribution of policy cost [all models, all scenarios]



What are the main drivers of uncertainty of our current knowledge of the climate change mitigation costs?

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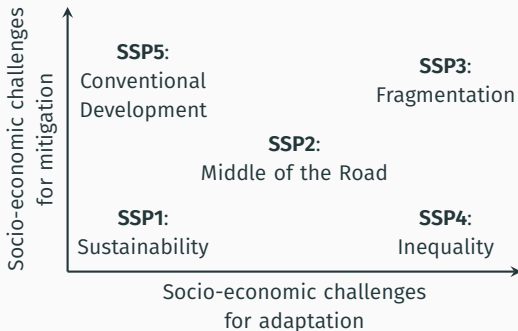
## Note

By construction, these components are not fully independent.

# Baseline

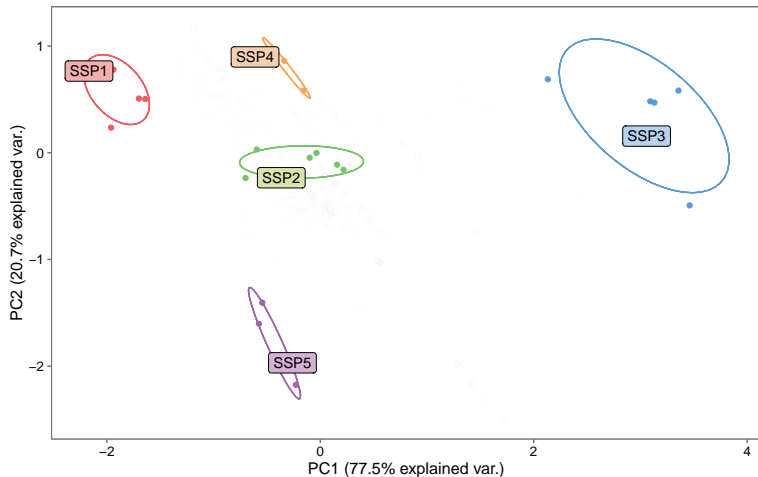
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## The Shared Socio-economic Pathways (SSP)



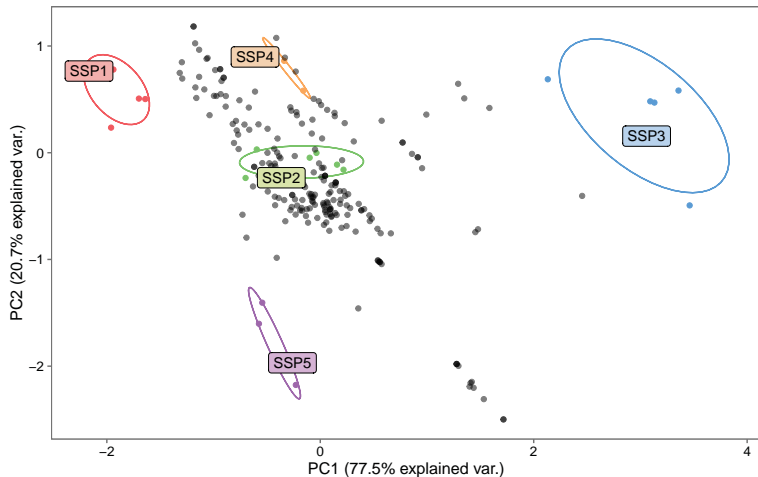
- The 5 narratives have been recently quantified by 6 models (Riahi *et al.*, 2016 ) and collected into the SSP database.
- We characterize the AR5 baseline scenarios with this new dataset.

# SSP attribution



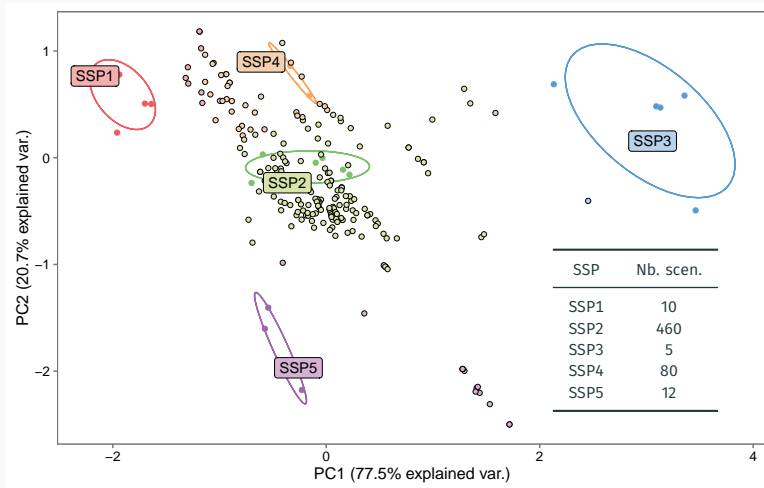
PCA on SSP reference scenarios using cumulative emissions, carbon intensity, energy intensity at world and region levels.

# SSP attribution



Projection of the AR5 baseline scenarios: most of them are close to the SSP2 and SSP4 clusters.

# SSP attribution



Association of the AR5 scenarios to the SSPs.



## Correlation ratio

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How much of the variations in  $Y$  (mitigation cost) can be explained by the variations in a driver  $X_i$ , where

$$Y = Y(X_1, X_2, \dots, X_n)?$$

**Correlation ratio  $\eta^2$  (Pearson, 1926)**

$$\eta^2(Y|X_i) = \frac{\text{Var}(E[Y|X_i])}{\text{Var}(Y)}$$

Based on the law of total variance, the correlation ratio does not require that the variables are independent or identically distributed.

Law of total variance:  $\text{Var}(Y) = E(\text{Var}[Y|X_i]) + \text{Var}(E[Y|X_i])$

# Uncertainty decomposition — Main components

Main components

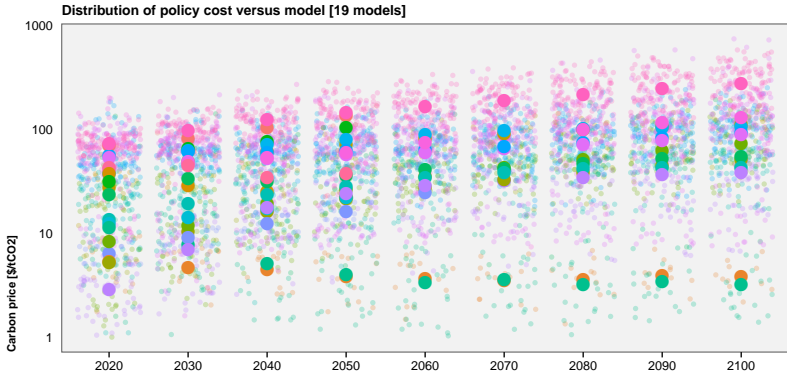


Correlation ratio for mitigation costs expressed in  $\$/\text{tCO}_2$

# Uncertainty decomposition – Model



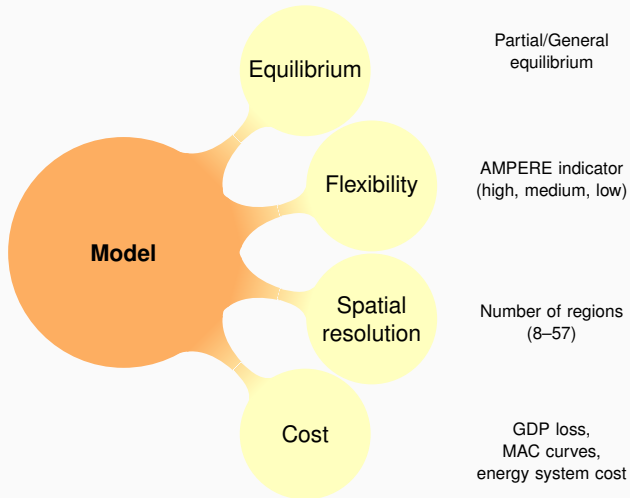
# Uncertainty decomposition – Model



# Model

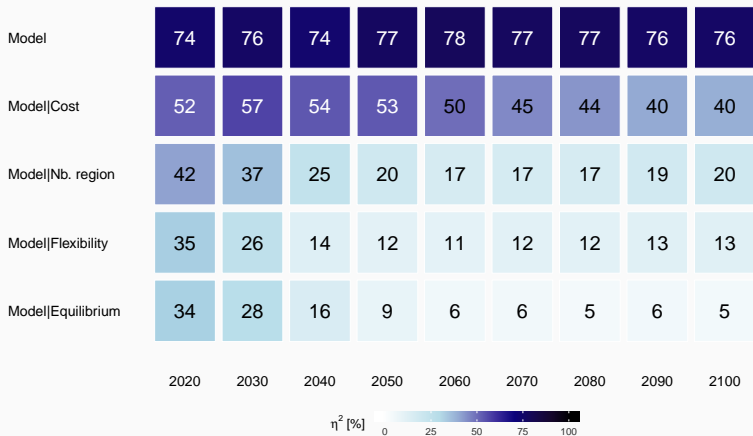
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# Model characteristics



# Uncertainty decomposition – Model characteristics

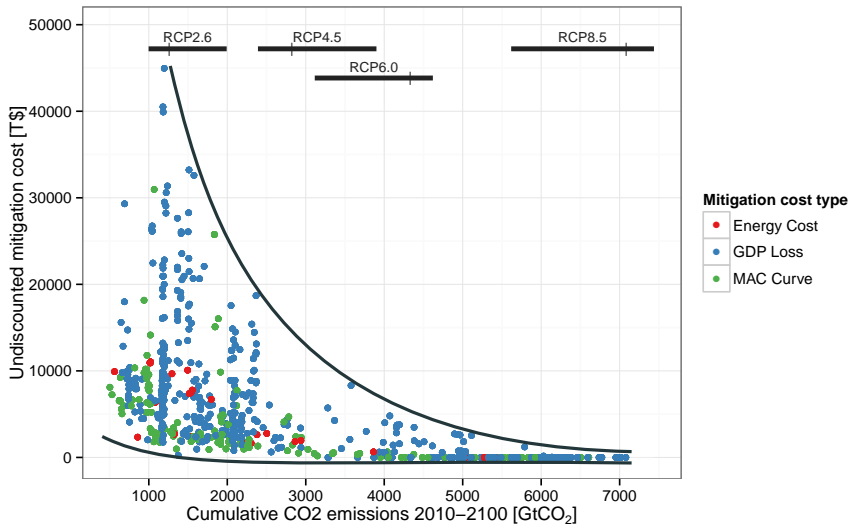
Model characteristics – Carbon price



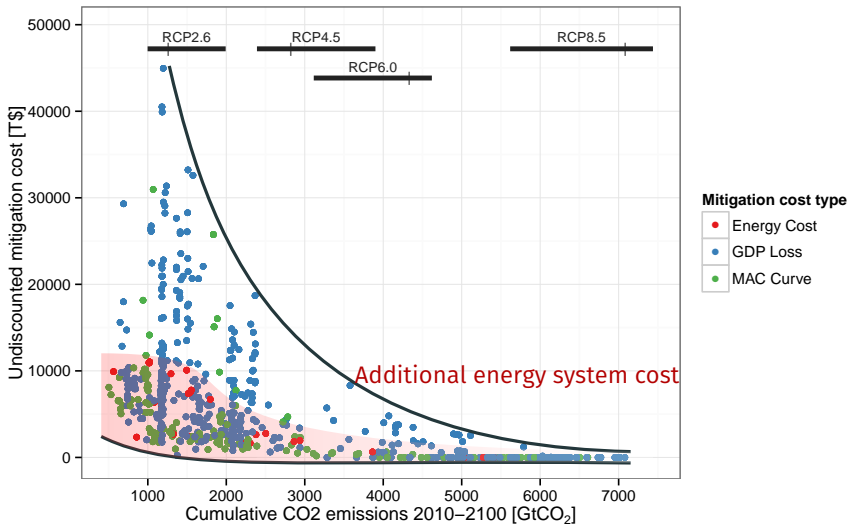
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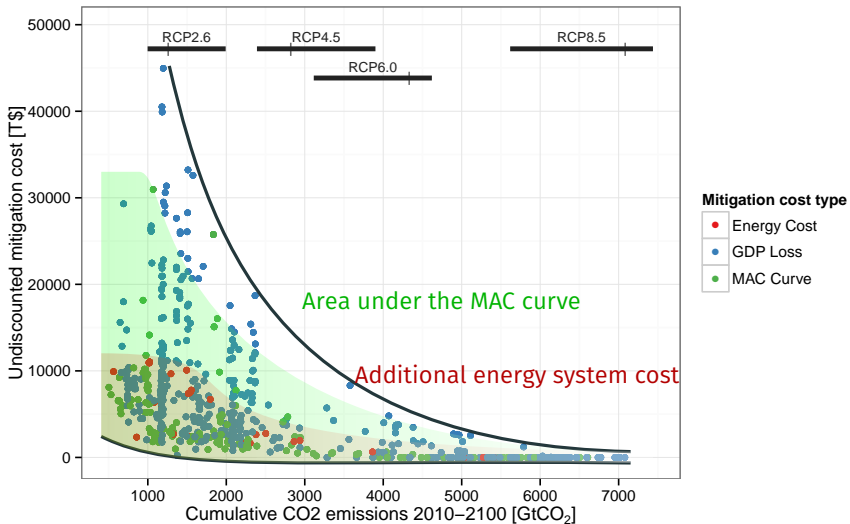
# Mitigation cost estimates — Cost



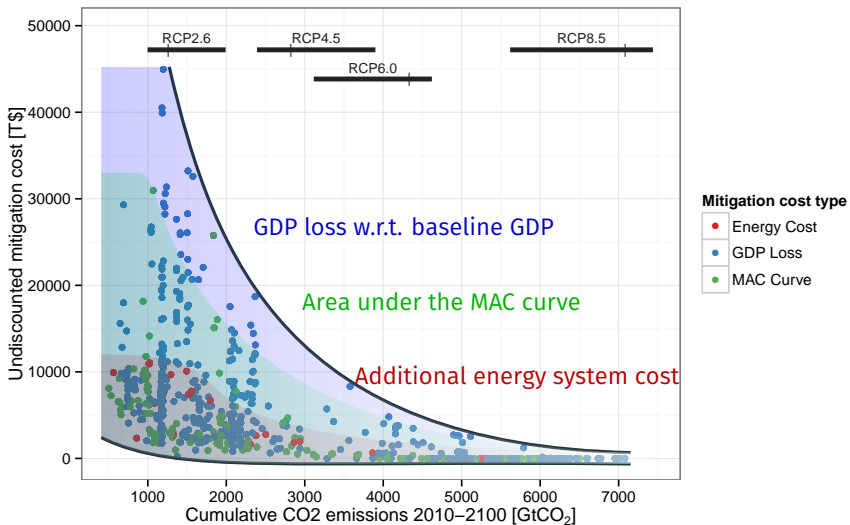
# Mitigation cost estimates — Cost



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## Summary

- Mitigation costs are also uncertain.
- “Model” is the most important component to explain the variation of the mitigation costs reviewed by the IPCC AR5.
- “Baseline” component is not important.

## Recommendations for future assessments

- The use of models of different nature is primordial.
- More baseline (SSP), but mitigation costs are harder to compare (Drouet and Emmerling, 2016).
- 1.5°C ?


# Thanks

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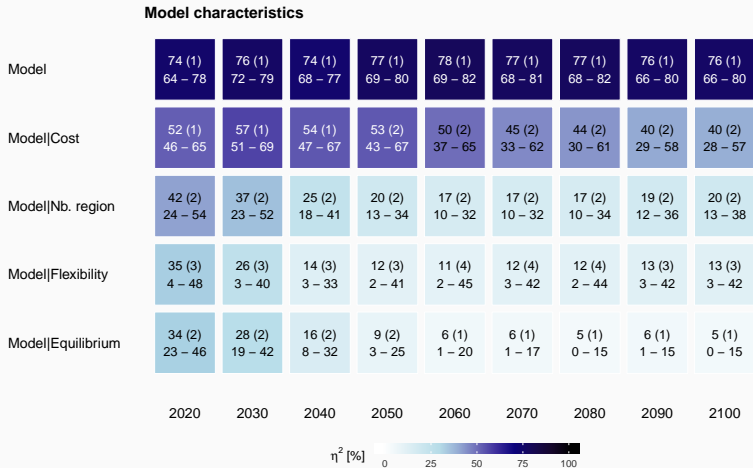
## Main components

Model	2020	2030	2040	2050	2060	2070	2080	2090	2100
	74 (1) 64 – 78	76 (1) 72 – 79	74 (1) 68 – 77	77 (1) 69 – 80	78 (1) 69 – 82	77 (1) 68 – 81	77 (1) 68 – 82	76 (1) 66 – 80	76 (1) 66 – 80
Policy implementation	5 (0) 4 – 7	4 (0) 3 – 6	5 (0) 5 – 7	6 (0) 6 – 9	7 (0) 6 – 10	7 (0) 6 – 11	8 (0) 7 – 12	9 (0) 7 – 13	9 (0) 8 – 13
Climate category	1 (0) 0 – 2	1 (0) 0 – 2	3 (0) 2 – 5	4 (0) 3 – 6	5 (0) 3 – 8	6 (0) 4 – 10	7 (0) 5 – 11	10 (0) 8 – 12	10 (0) 9 – 13
Baseline	3 (0) 2 – 4	3 (0) 2 – 5	5 (0) 3 – 7	5 (0) 3 – 9	5 (1) 3 – 11	6 (1) 3 – 14	6 (1) 3 – 14	5 (1) 3 – 14	5 (1) 3 – 13

$\eta^2$  [%] 

Correlation ratio for mitigation costs expressed in \$/tCO<sub>2</sub>, standard deviation and min-max range in a jackknife resampling.

# Uncertainty decomposition — Model characteristics



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