

# **Combining quantitative techniques for selecting qualitative elements of socioeconomic scenarios adapted to a specific problem**

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## HOW TO CONSTRUCT STORYLINES (scenarios)

- Variables
- States
- scenarios

# THE SRES Storylines

## Driving forces

Population growth	Economic development	Energy use	Land-use change	Resources availability	Tech-nological change	Future energy system
Low (0)	Medium (0)	Low (0)	Low (0)	Low (0)	Slow (0)	Coal, oil, gas
Medium (1)	High (1)	Medium (1)	Low-medium (1)	Medium (1)	Medium (1)	Balanced
High (2)	Very high (2)	High (2)	Medium (2)	High (2)	Rapid (2)	Non-fossils
		Very high (3)	Medium/high (3)			Regional
			High (4)			Efficiency
						"Dynamics as usual"

States



9720 possible scenarios and  
 $10^{21}$  possible sets with six scenarios

# **The problem:**

**How to identify a small number of scenarios  
from the (often very large) set of possible  
scenarios?**

# CRITERIA FOR SCENARIOS

Property of...

Individual  
scenario

Set of  
scenarios

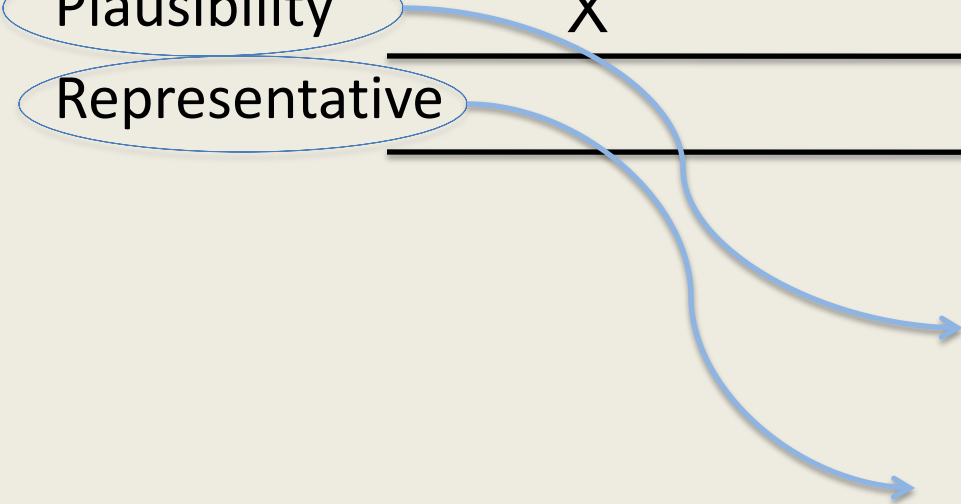
Relevance	X	
Plausibility	X	
Representative		X

Plausibility

Representative

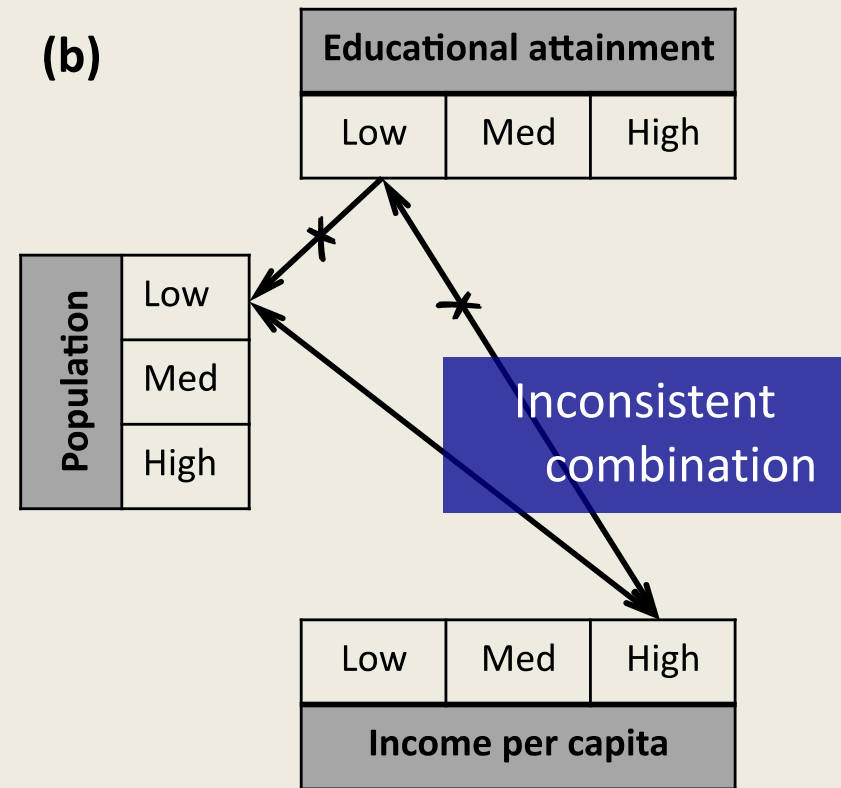
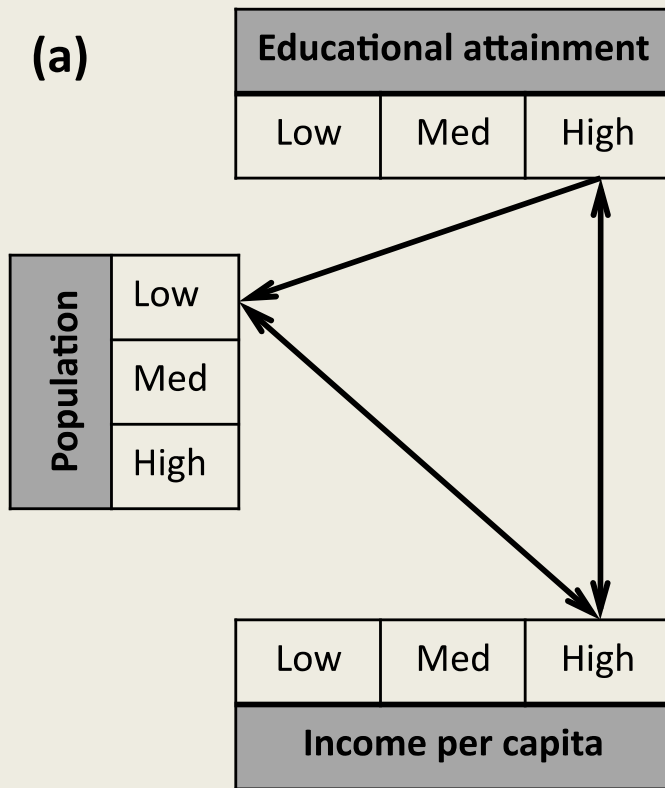
*Self-consistency*

*Spanning the space of possibilities*



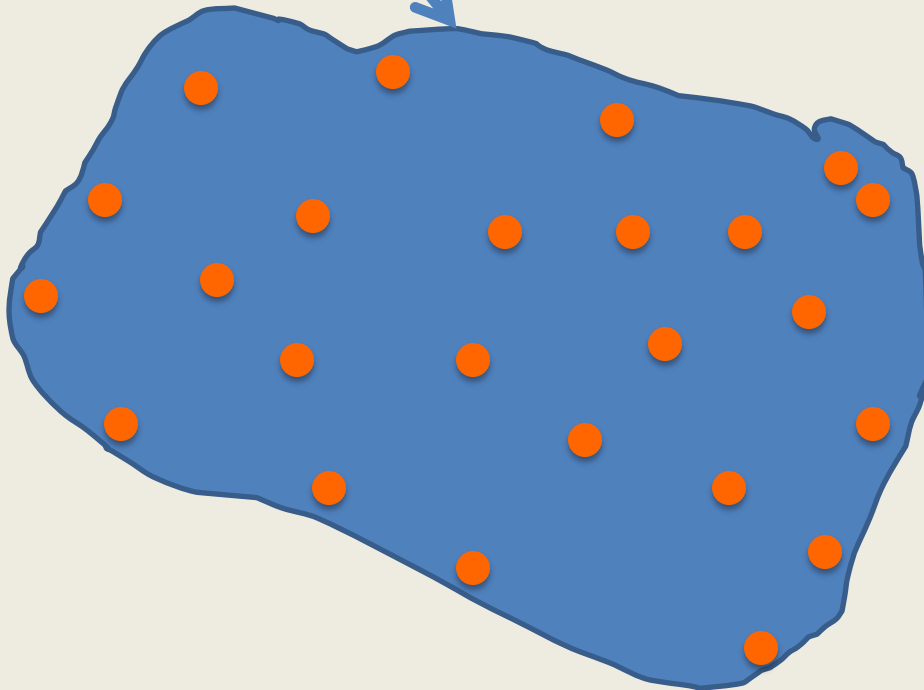
# SELF-CONSISTENCY: Cross-Impact Balance (CIB)

Internal consistency determined by **self-consistency**



# REPRESENTATIVENESS: Scenario diversity analysis (SDA)

**'Space of possibilities'**

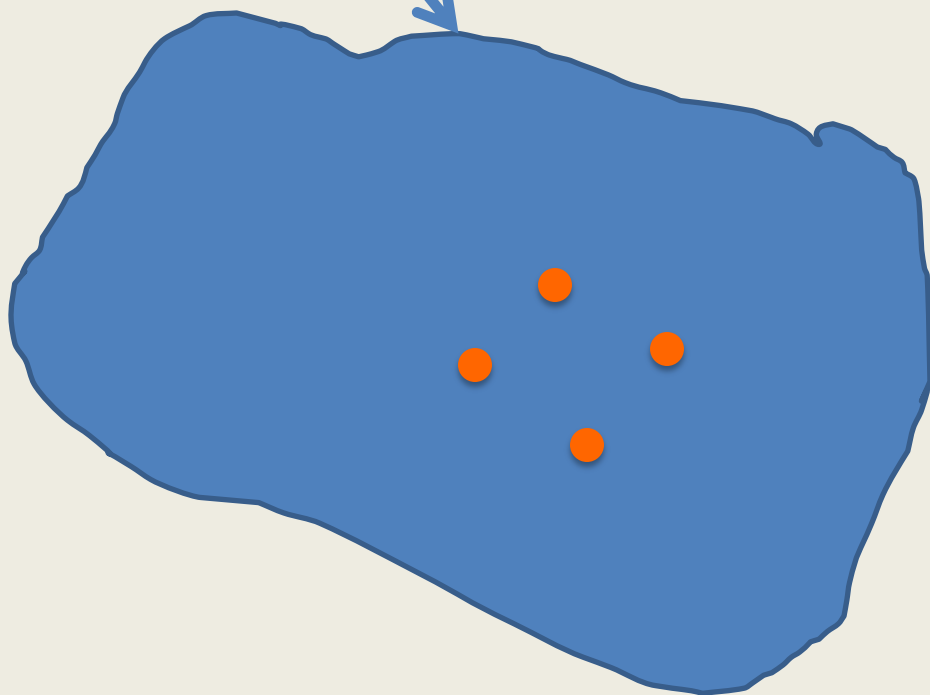


**Would like to populate the whole space**

**However, for analytical tractability a selection is often made.**

**How to make the selection?**

**'Space of possibilities'**

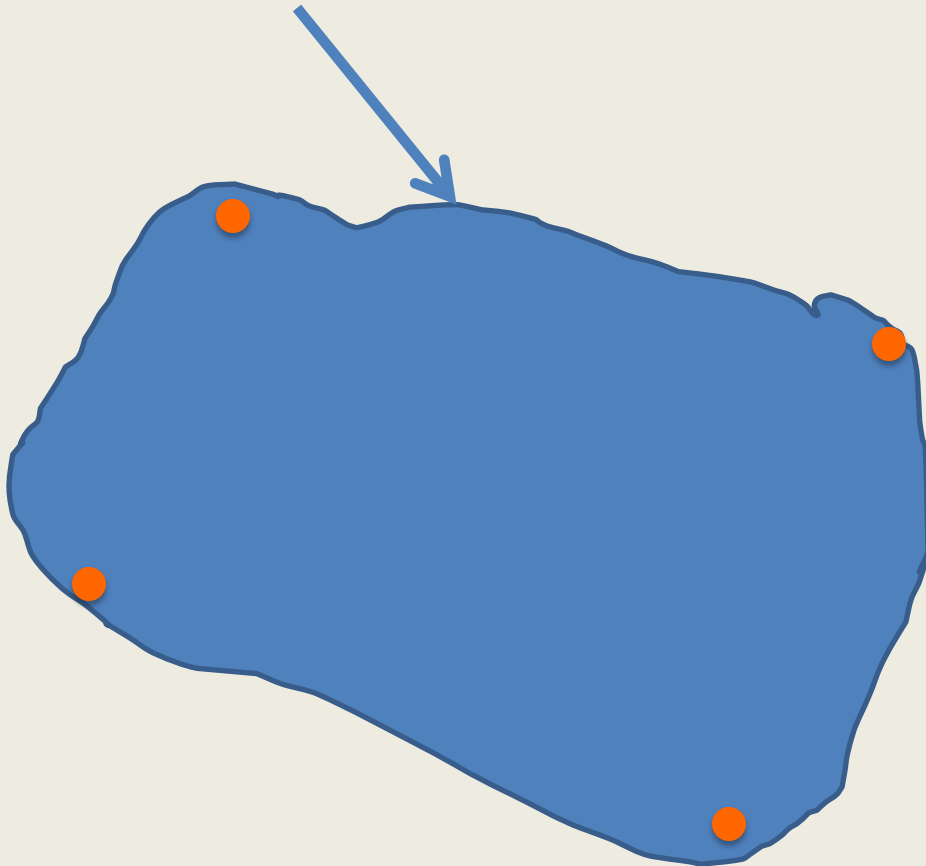


**The same 'world logic' applied to all feasible scenarios risk getting a set with lack of balance.**



**'Space of possibilities'**

**Span the space!**



In higher dimension, i.e. more drivers, this is a tricky problem.

We have therefore developed an algorithm for finding maximally spanning sets.

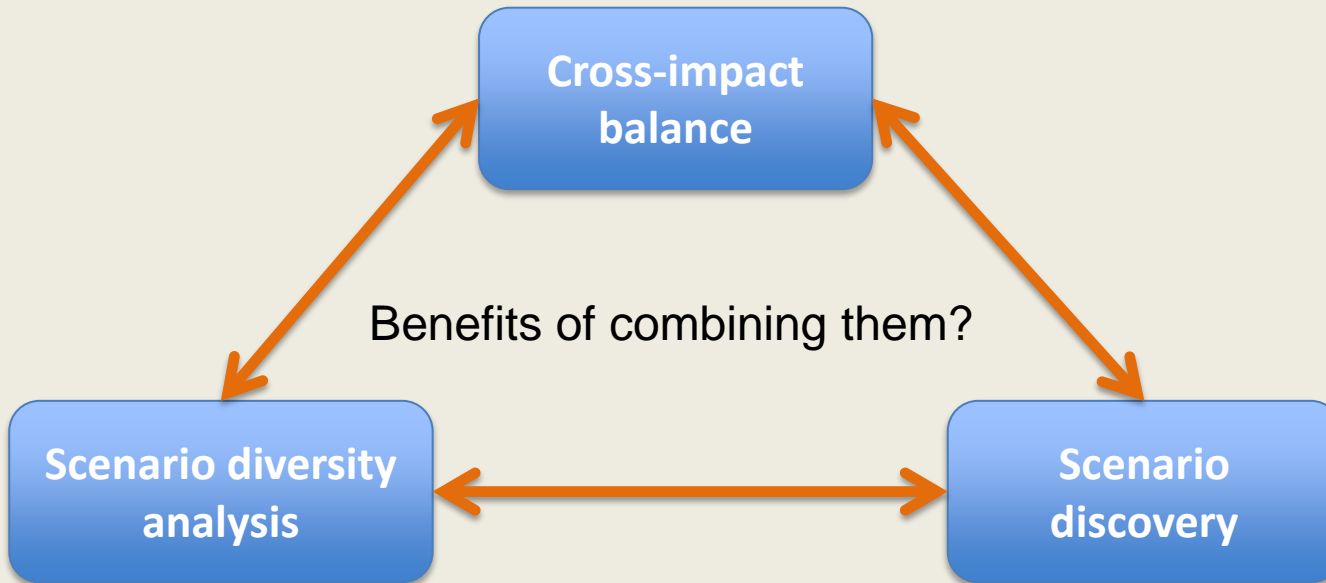
# Analysis of different SRES scenario sets relative to calculated optima.

Scenario set	Number of possible scenario sets	Minimum distance	Mean distance
A1B, A2, B1, B2	$\sim 10^{14}$	58%	82%
A1T, A2, B1, B2	$\sim 10^{14}$	58%	80%
A1FI, A2, B1, B2	$\sim 10^{14}$	58%	84%
A1B, A1T, A1FI, A2, B1, B2	$\sim 10^{21}$	24%	88%
A1B, A2, B1	$\sim 10^{10}$	79%	95%

# Adding policy to the picture: Scenario discovery (cf. Key note)

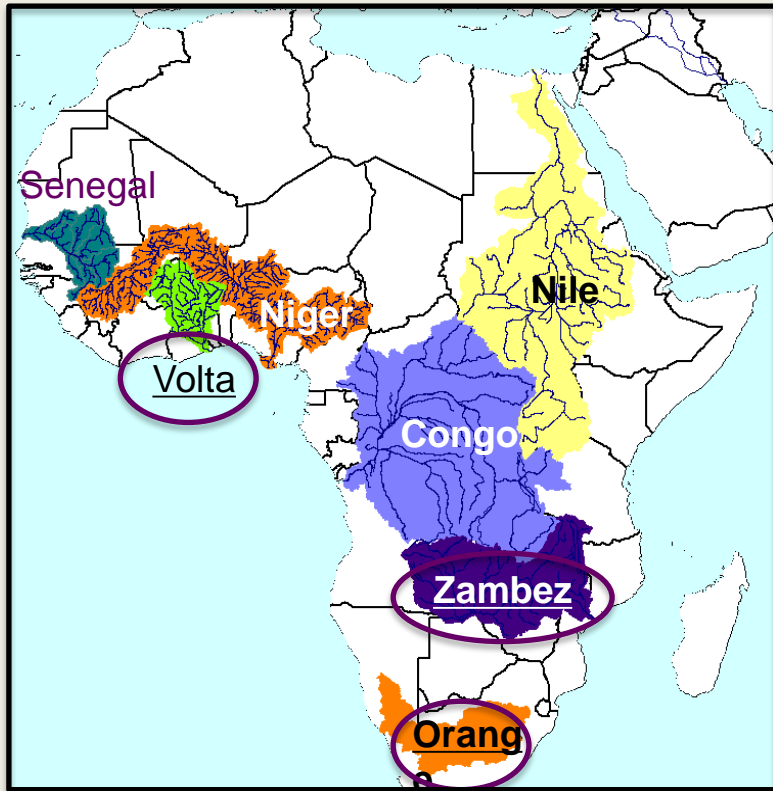
- Policies are *external* to CIB and SDA: Develop scenario and policies independently
- Scenario Discovery, on the other hand, *internalise* policies for developing scenarios that illuminates vulnerabilities of the policies.

# Three quantitative techniques



# World Bank Project Provides Example Testbed

Project examines **climate resilience** of long-term water and energy infrastructure **investment plans** in river basins across Africa



- Analysis considered here considers a wide range of climate futures
  - (22 in this test case; 121 in overall project)
- **Scenario discovery** identifies clusters of futures where these proposed investment plans do not meet their economic goals
- Project then seeks to calculate “perfect foresight” and “robust” adaptations for these scenarios
  - **How might a diversity analysis identify a small number of representative futures from each cluster to use in further analysis?**
  - How might a CIB analysis identify self-consistent combinations of other uncertainties (e.g. crop prices) used by the optimizers that inform the choice of adaptations?

# The model set-up

- Using a model (WEAP - Water Evaluation and Planning System) to generate data on irrigation (I) and hydropower (H) for the three river basins.
- The model's output were mapped onto one of three possibilities:

***Dry***            if     $I < t_I^{\text{Dry}}$  and  $H < t_H^{\text{Dry}}$

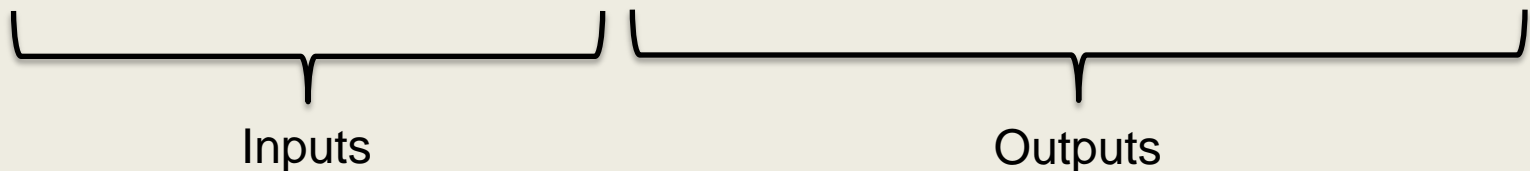
***Wet***            if     $I > t_I^{\text{Wet}}$  and  $H > t_H^{\text{Wet}}$

***Historical***    if    neither of these conditions hold.

The thresholds were based on an analysis of Min and Max of I and H

# The "input/output" morphological field

Model	Emission	Volta	Orange	Zambezi
bccr_bcm2_0	A2	Dry	Dry	Dry
cccma_cgcm_3_1	A1B	Hist	Hist	Hist
...	B1	Wet	Wet	Wet
...				
ukmo_hadgem1				



The task is identify a set with 6 scenarios that diversely represent this structure.

We consider two types of diversity:

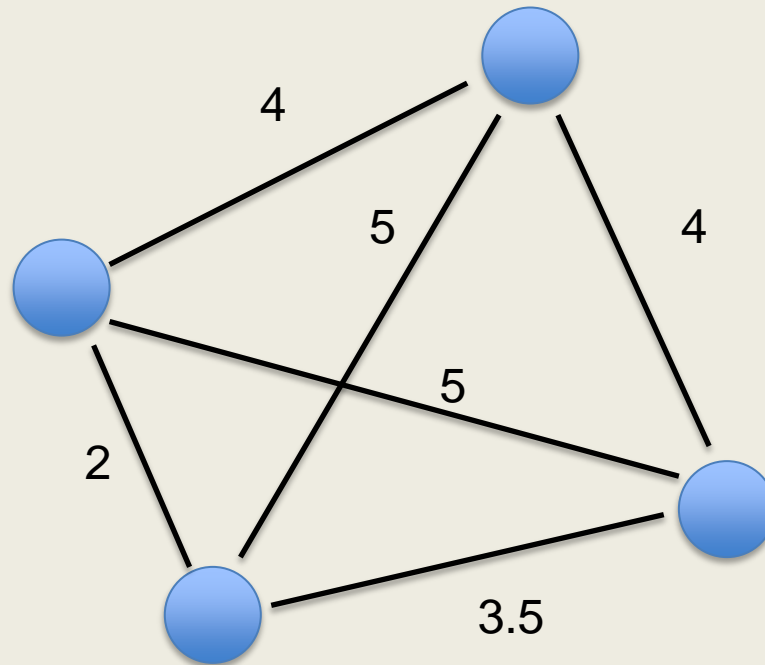
- i) within a scenario
- ii) between scenarios

- Within ( $D_w$ )
  - (A2, Dry, Dry, Dry) has low  $D_w$
  - (A2, Dry, Wet, Hist) has high  $D_w$
- Between ( $D_b$ )
  - (A2,Dry, Dry,Dry) and (A1B,Dry, Dry,Dry) are close
  - (A2,Dry, Dry,Dry) and (B1,Wet, Wet,Wet) are diverse

		$D_w$	
		Small	Large
$D_b$	Small		(A2, D, W, H) (A2, W, D, H)
	Large	(A2, D, D, D) (B1, W, W, W)	?



## Two possible measures of diversity between scenarios ( $D_b$ )



Would like to have large values both for the minimum distance ( $D_b^{\min}$ ) and mean distance ( $D_b^{\text{mean}}$ ), need to strike a balance:

$$\alpha * D_b^{\min} + (1 - \alpha) * D_b^{\text{mean}}$$

# Strike a balance also between $D_w$ and $D_b$

$$\beta * D_w + (1 - \beta) * D_b =$$

$$\beta * D_w + (1 - \beta) * [\alpha * D_b^{\min} + (1 - \alpha) * D_b^{\text{mean}}]$$

So, find the set with six scenarios (of the 163 350 possible sets) that maximises this function and subject to the boundary conditions:

(A2, ?, ?, ?)

(A2, ?, ?, ?)

(A1B, ?, ?, ?)

(A1B, ?, ?, ?)

(B1, ?, ?, ?)

(B1, ?, ?, ?)

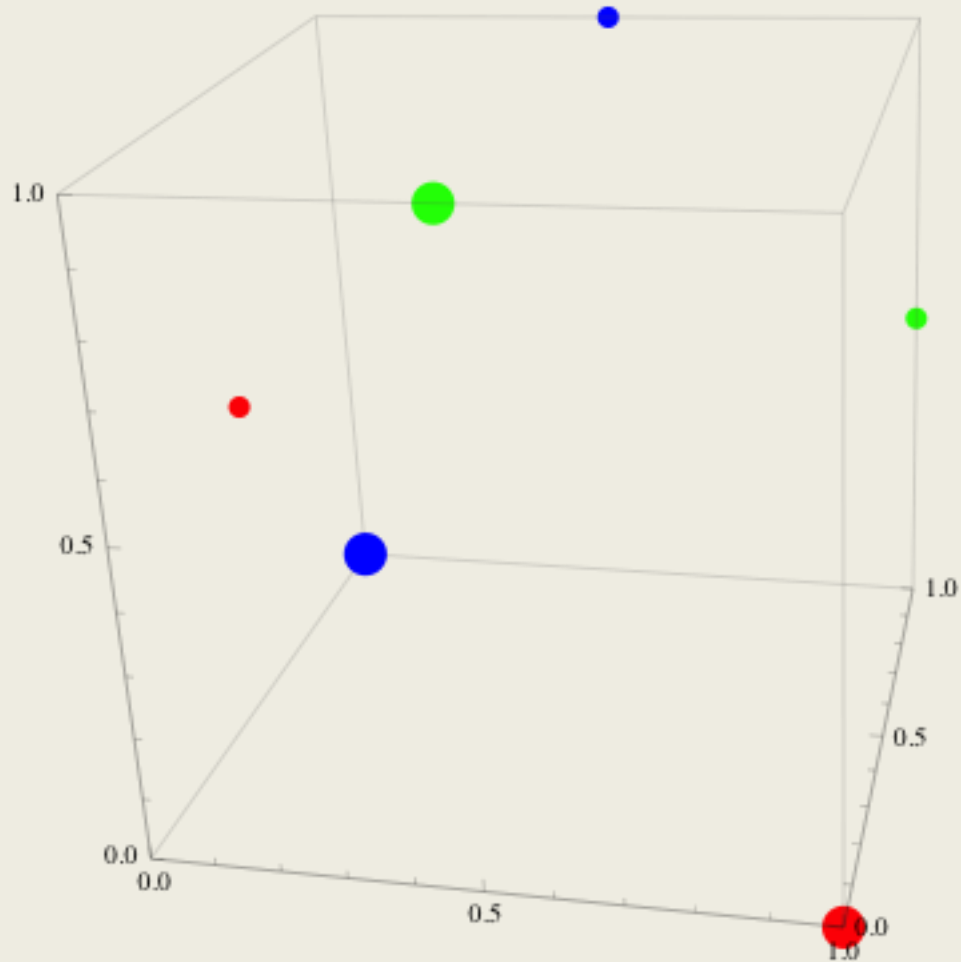
# Results

Beta (alpha=0.5)	#of sets	D_b mean	D_b min	D_w mean	Obj
0	1	2.233	1.5	1.33	1.861
0.25	3	2.1667	1.5	1.5	1.75
0.5	1	2.1667	1.5	1.5	1.667
0.75	1	2	0.5	2	1.813
0.99	3	2	0.5	2	1.993
1	3	2	0.5	2	2

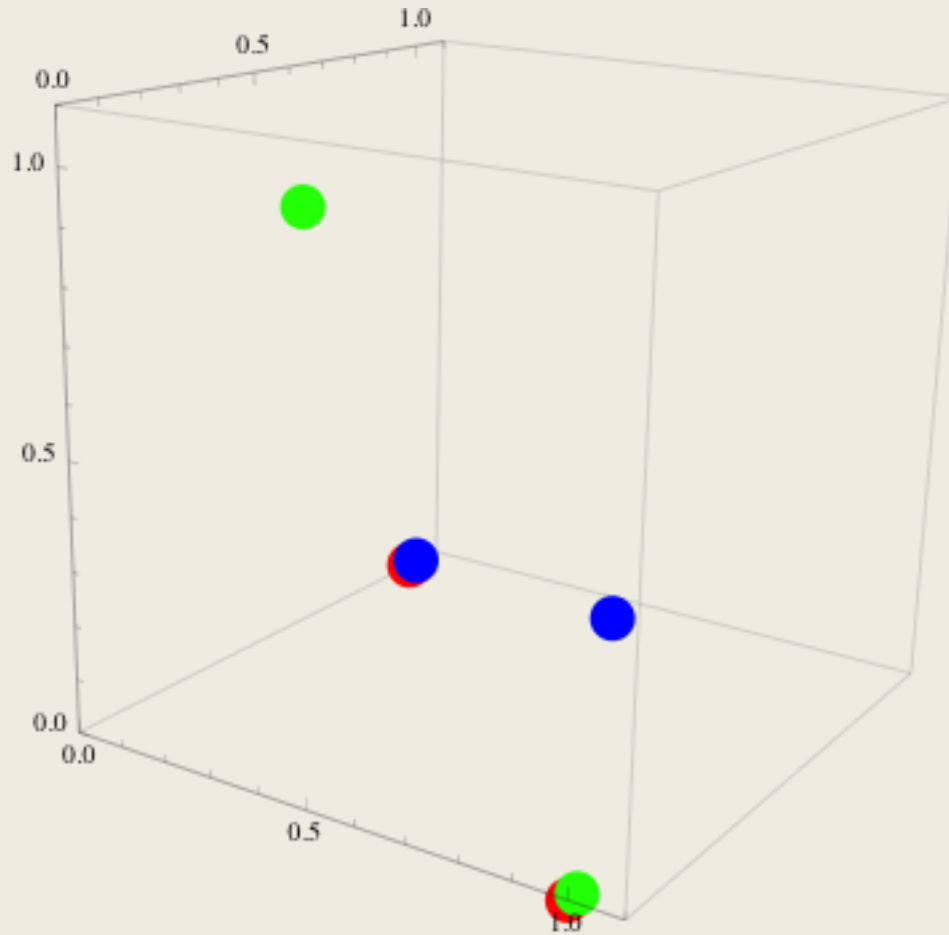
alpha (beta=0.5)	#of sets	D_b mean	D_b min	D_w mean	Obj
0	1	2.2	0.5	1.833	2.01667
0.25	1	2	0.5	0.5	1.8125
0.5	1	2.1667	1.5	1.5	1.667
0.75	3	2.1667	1.5	1.5	1.5833
1	64	2.033; 2.1	1.5	1.5	1.5

$$\alpha = \beta = 0.5$$

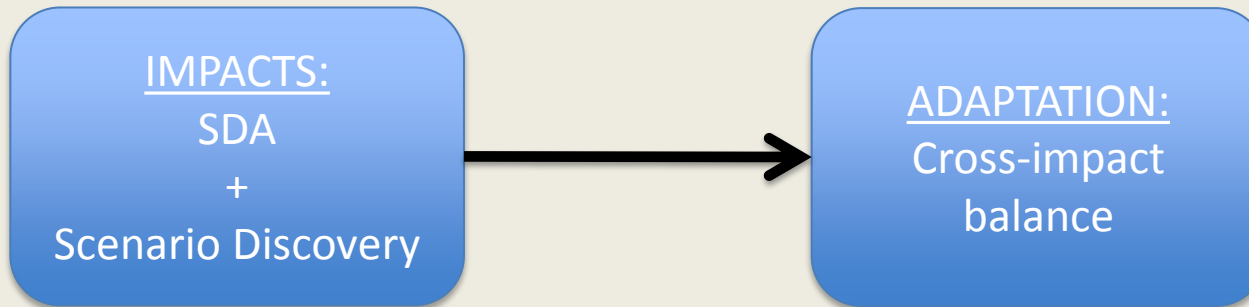
One color for each emission scenario. The size is proportional to  $D_w$ .



$\alpha = 0.25$  and  $\beta = 0.5$ , i.e. less focus on maximising  $D_b^{\min}$ .



# Bringing in cross-impact balance (Sketchy...)



Identified six representative scenarios

Several socioeconomic factors influence what are robust or optimal adaptation strategies.

Using CIB we'll identify a few consistent scenarios for analysing adaptation strategies.

# Integrating SDA and Cross-impact balance

- CIB rank scenarios according to internal consistency.
- However, this method assumes the same consistency measure for all feasible future worlds.
- But, this could stand in contrast to spanning the space of possibilities
- Different scenarios should describe different world logics
- Not to strike a balance also here!

***Thank you!***