



# Coping with Uncertainty

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with Yuri Ermoliev and Arkady Kryazhimskiy

*special thanks to:*

Tanja Ermolieva, Volker Krey,  
Keywan Riahi, Alexey Smirnov



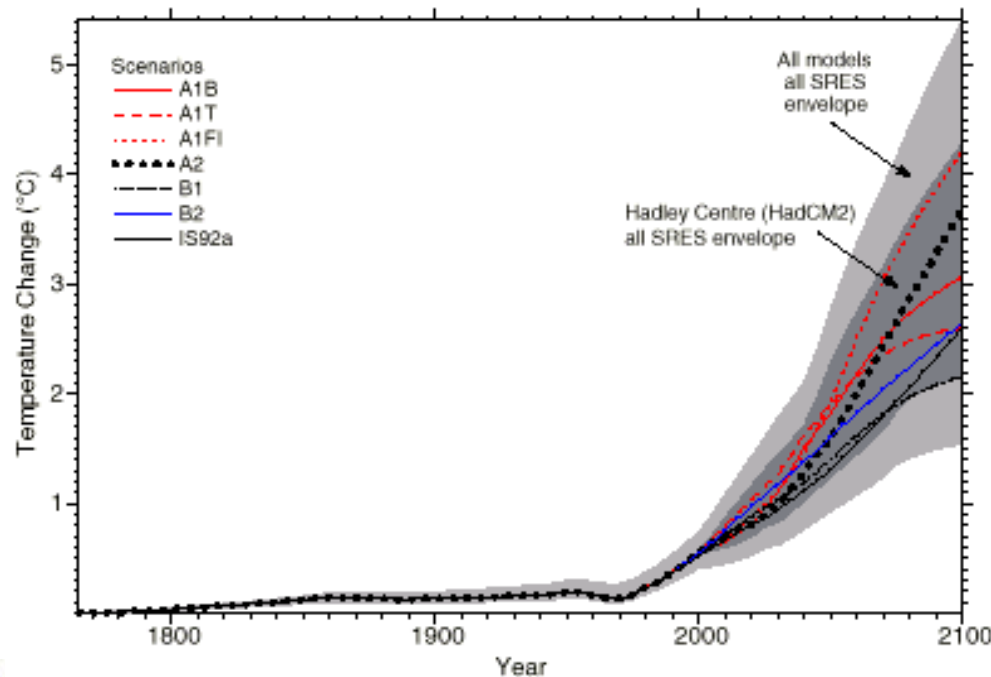
# Uncertainty and Systems Science

- Overview of uncertainty types
- Description of uncertainties (climate change & technology)
- Improved decision making (technology and insurance portfolios)
- Some IIASA highlights

# A Taxonomy of Uncertainties

- **What's the problem?**  
Context and problem framing  
(linguistic) uncertainty
- **How big is it?**  
Data and modeling (epistemic) uncertainty
- **What should be done about it?**  
Policy response and effectiveness  
(contingency/agency) uncertainty

# Example Climate Change: Projected Global Mean Temperature Change and Sources of Uncertainty



WMO

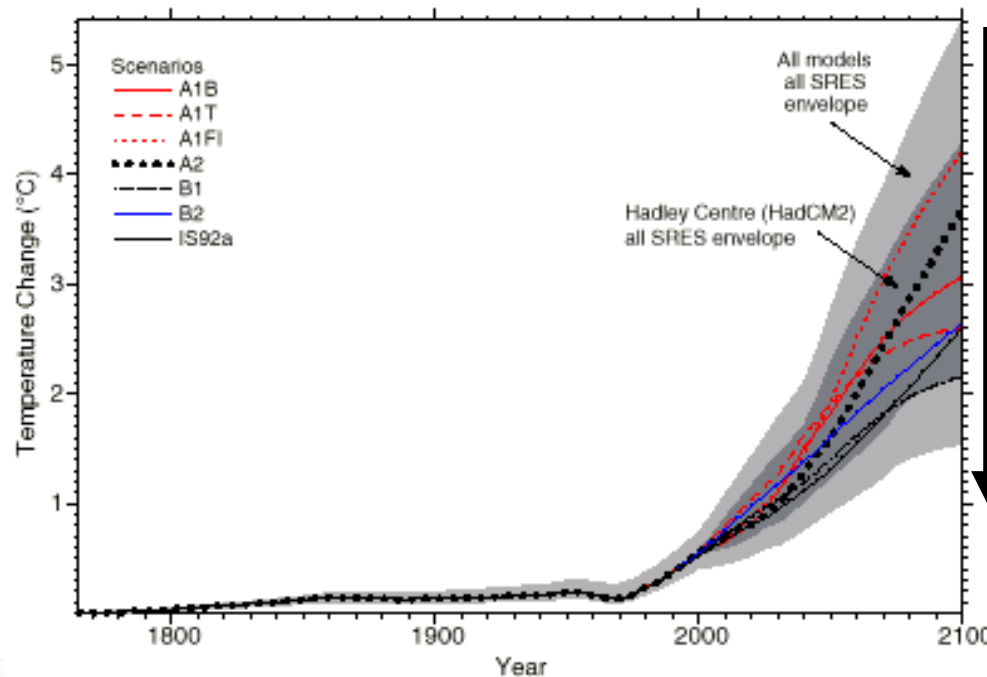
INTERGOVERNMENTAL PANEL ON CLIMATE CHANGE (IPCC)



UNEP

*IPCC WG1 TAR: "By 2100, the range in the surface temperature response across the group of climate models run with a given scenario is comparable to the range obtained from a single model run with the different SRES scenarios"*

# Example Climate Change: Projected Global Mean Temperature Change and Sources of Uncertainty



**Baseline Uncertainty:**  
50 % climate (sensitivity) modeling  
25% emissions (POP+GDP influence)  
25% emissions (TECH influence)

Uncertainty on extent and success of climate policies



WMO

INTERGOVERNMENTAL PANEL ON CLIMATE CHANGE (IPCC)



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# Ask the Experts?

- *“Heavier-than-air flying machines are impossible.”* Lord Kelvin, 1895.
- *“I think there is a world market for maybe five computers.”* Tom Watson, IBM chair, 1943.
- *“But what ... is it good for?”* IBM engineer commenting on the microchip in 1968.
- *“There is no need for any individual to have a computer in their home.”* Ken Olson, President, Digital Equipment, 1977.

More fun: <http://my.athenet.net/~jlindsay/SkepticQuotes.html>

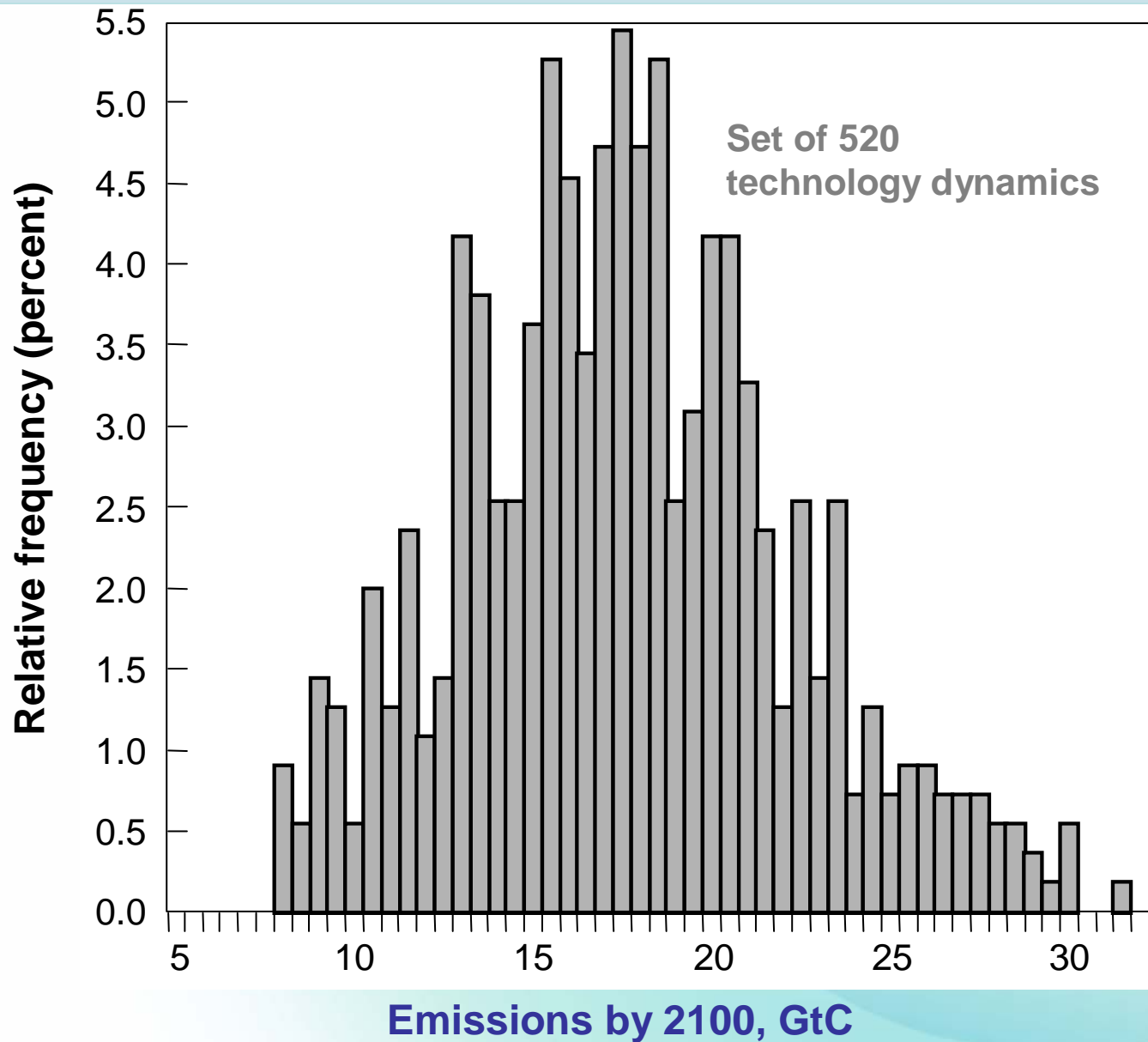


# Describing Technological Uncertainty

- Andrii Gritsevskiy and Nebojsa Nakicenovic
- Full technology uncertainty and impacts on emissions (climate change)
- All major TC mechanisms: innovation uncertainty, increasing returns, spillovers
- Builds on of increasing returns work of Brian Arthur
- Use of massive parallel computing
- Uncertainty distribution bi-modal, illustrating lock-in into alternate states
- Environmental characteristics and costs not correlated (clean can be as cheap as dirty)

# Emissions from 130,000 Scenarios of Technological Uncertainty

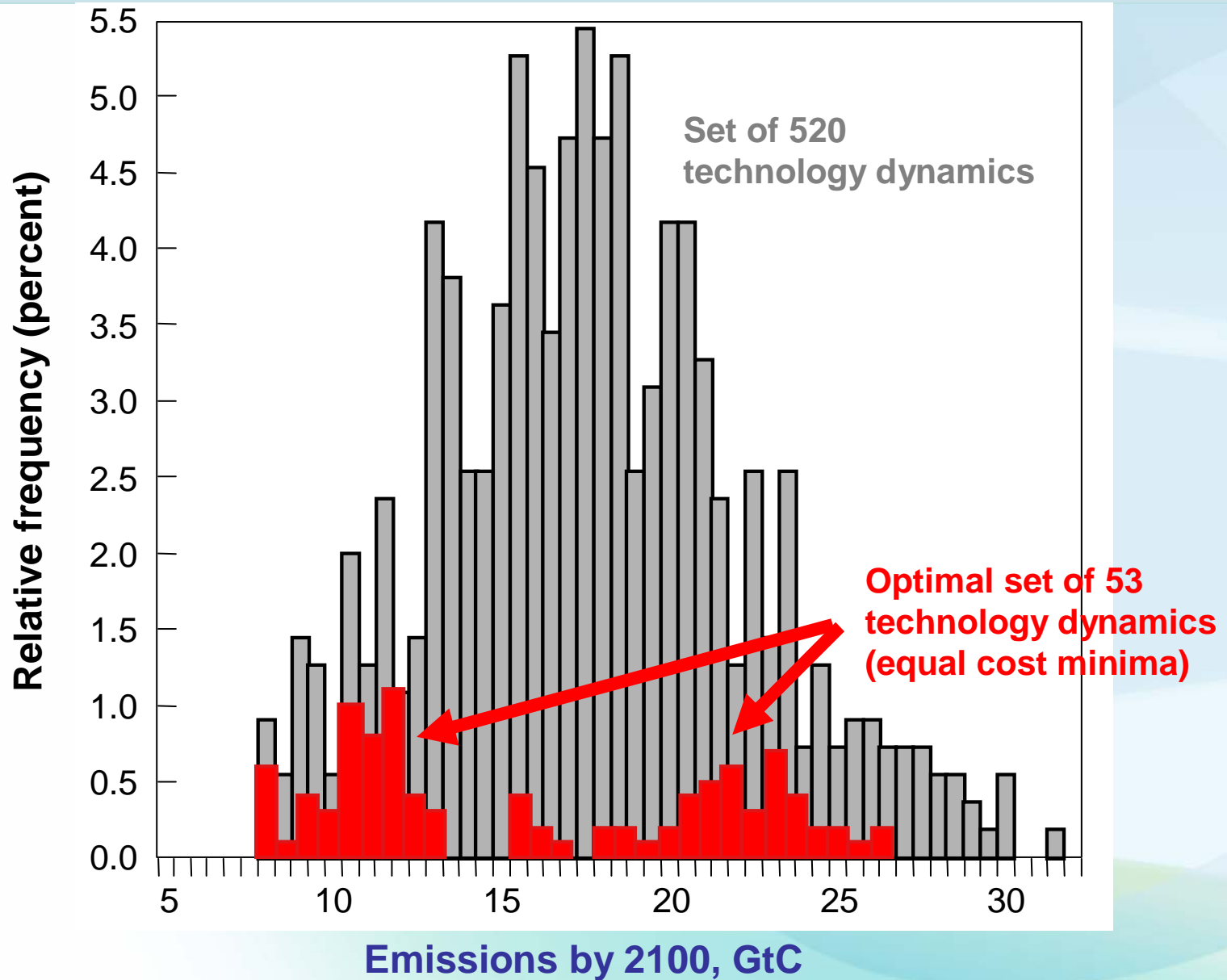
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# Emissions from 130,000 Scenarios of Technological Uncertainty

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## Linguistic/Context Uncertainty:

What does this  
plant do?



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What does this  
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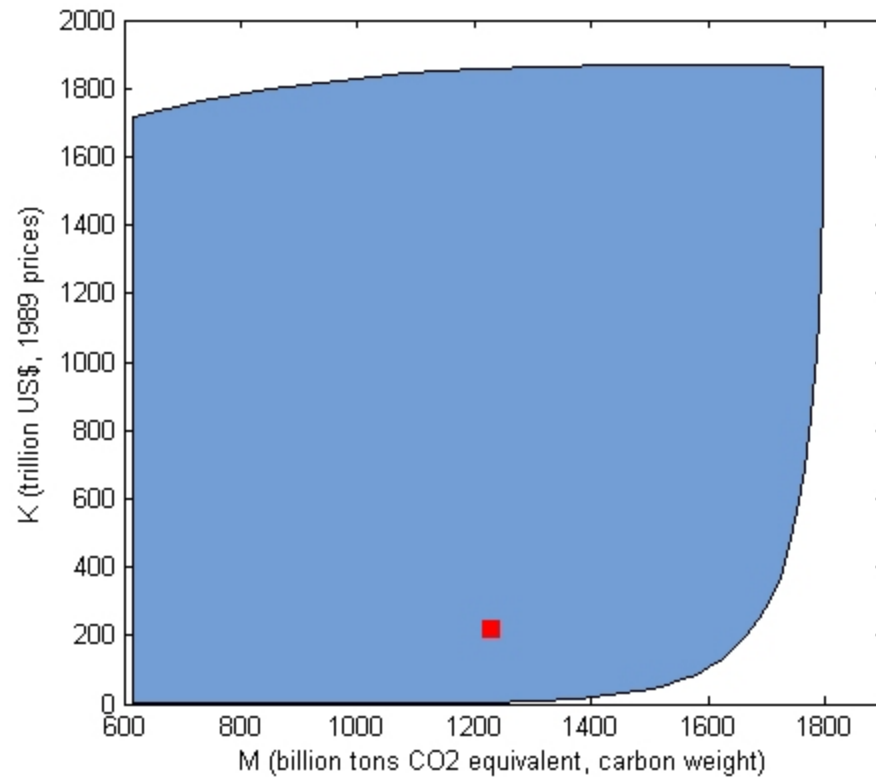
Vienna waste  
incinerator bowing  
to “green” public  
perception



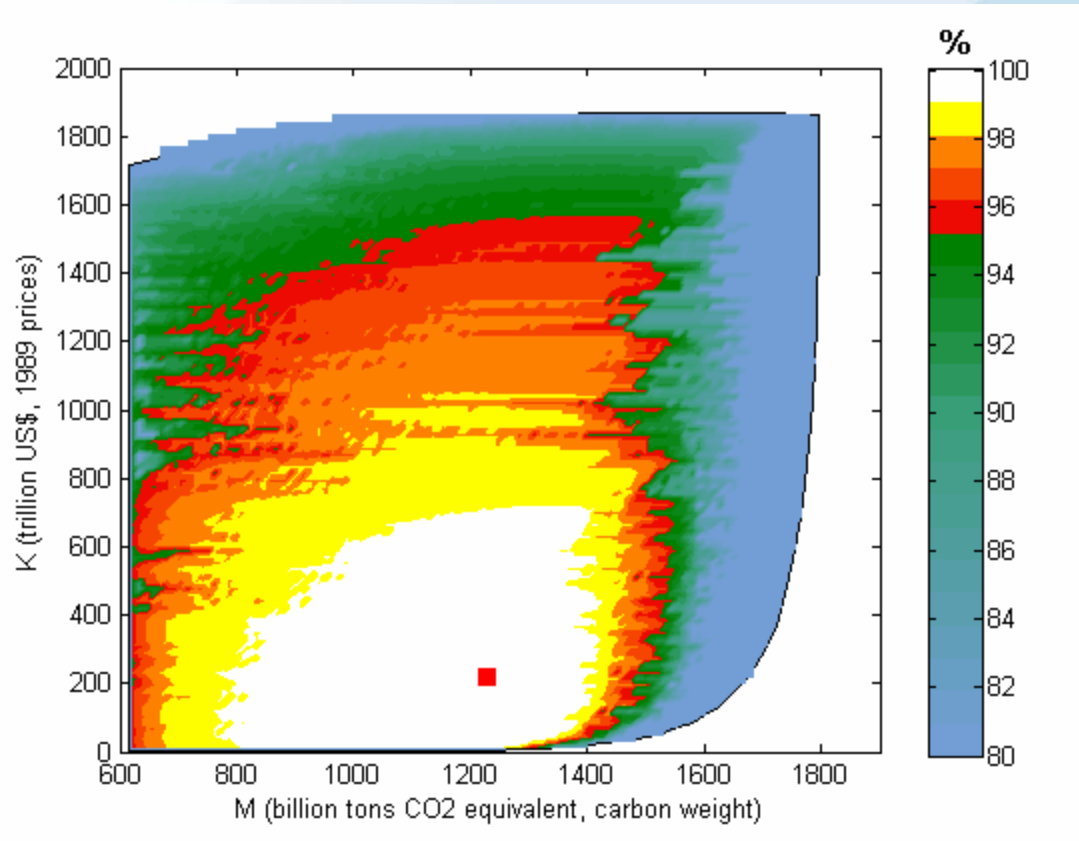
# Attainability Domain Analysis of Climate Change Policy

- Analytical analysis of all possible states of Nordhaus' DICE model
- Two policy variables:  
investment & emissions (abatement)
- First performed by YSSP Alexey Smirnov
- Successive overlays of
  - objective function, revealing “indifference” space (linguistic ambiguity of “optimality”)
  - risk surfaces of catastrophic event (thermohaline shut-down with different climate sensitivities based on Keller *et al.*)

# Attainability Domain of DICE with original Optimality Point 2100

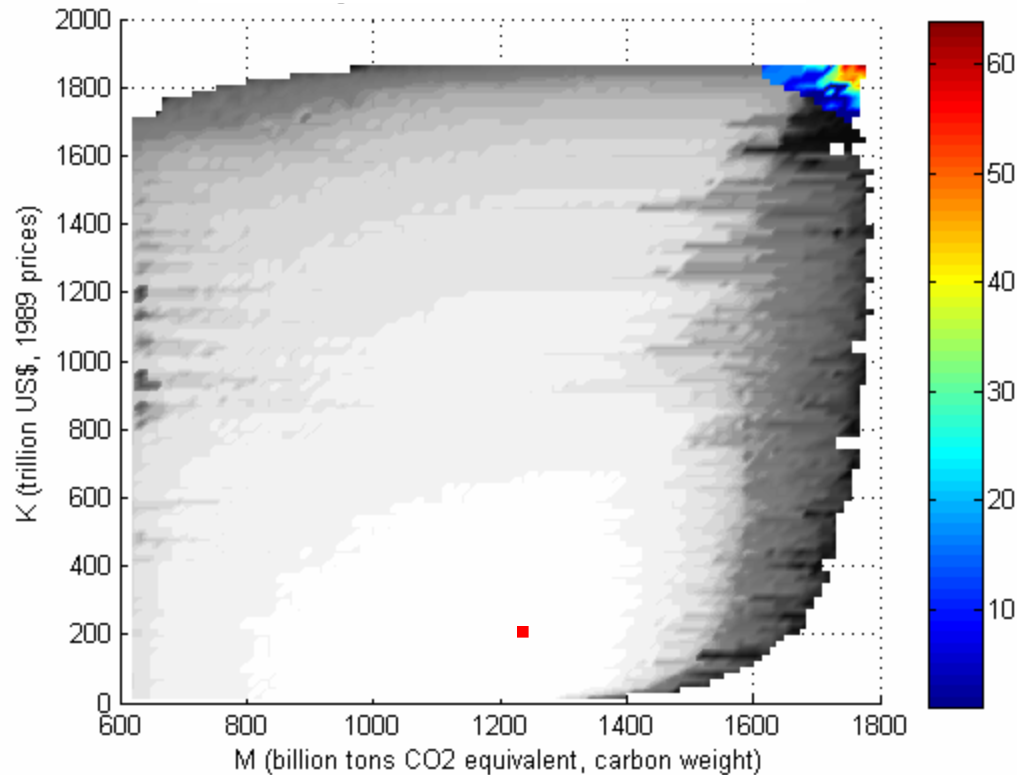


# DICE Attainability Domain and Isolines of Objective Function Surface



Percent of max. of objective function.  
Note the large “indifference” area

# Attainability Domain, Objective Function, and Thermohaline Collapse Risk Surfaces

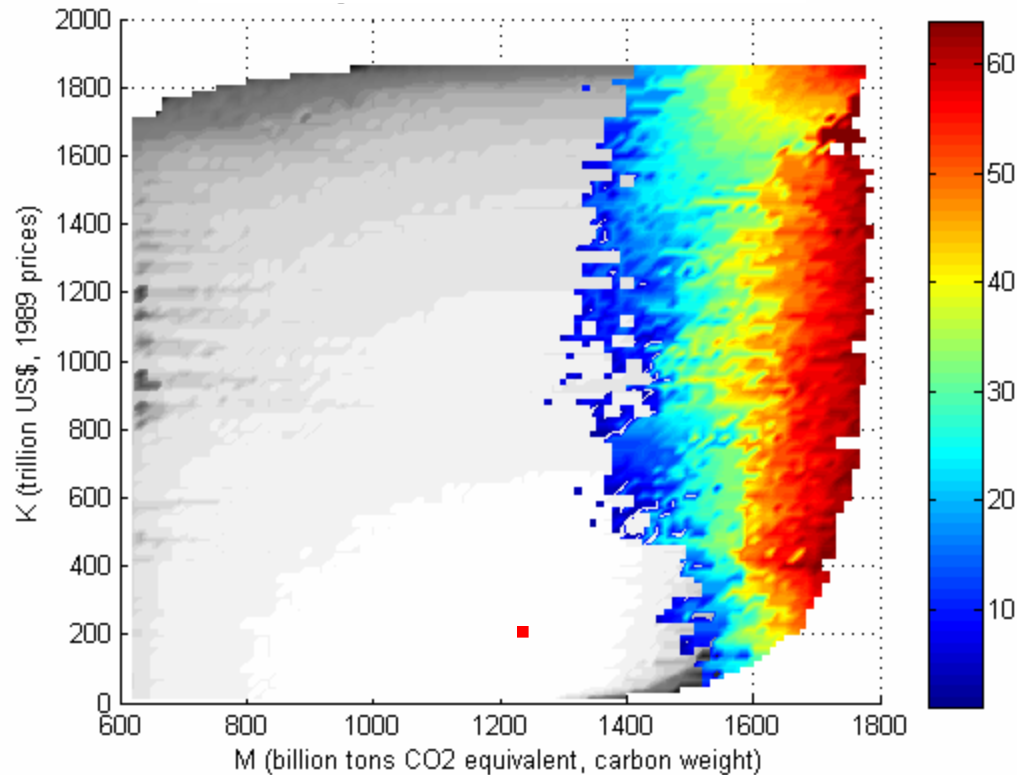


Risk Surface of Thermohaline collapse  
 (years of exposure 1990-2100)  
 climate sensitivity = 3 °C



# Attainability Domain, Objective Function, and Thermohaline Collapse Risk Surfaces

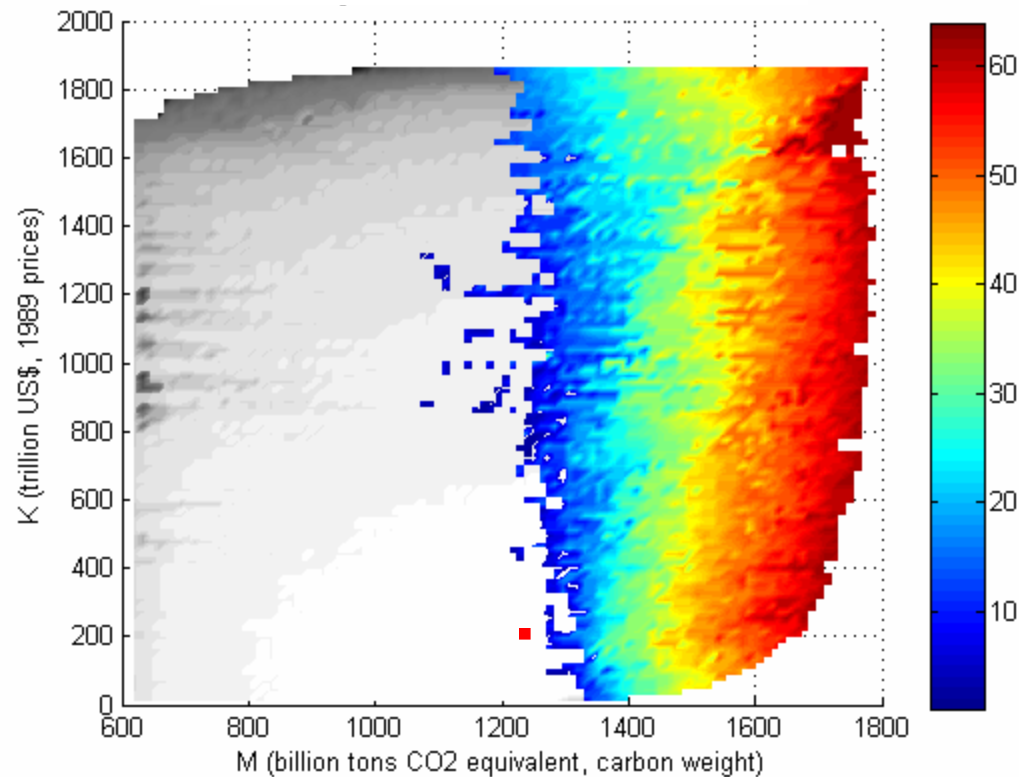
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Risk Surface of Thermohaline collapse  
(years of exposure 1990-2100)  
climate sensitivity = 3.5 °C



# Attainability Domain, Objective Function, and Thermohaline Collapse Risk Surfaces



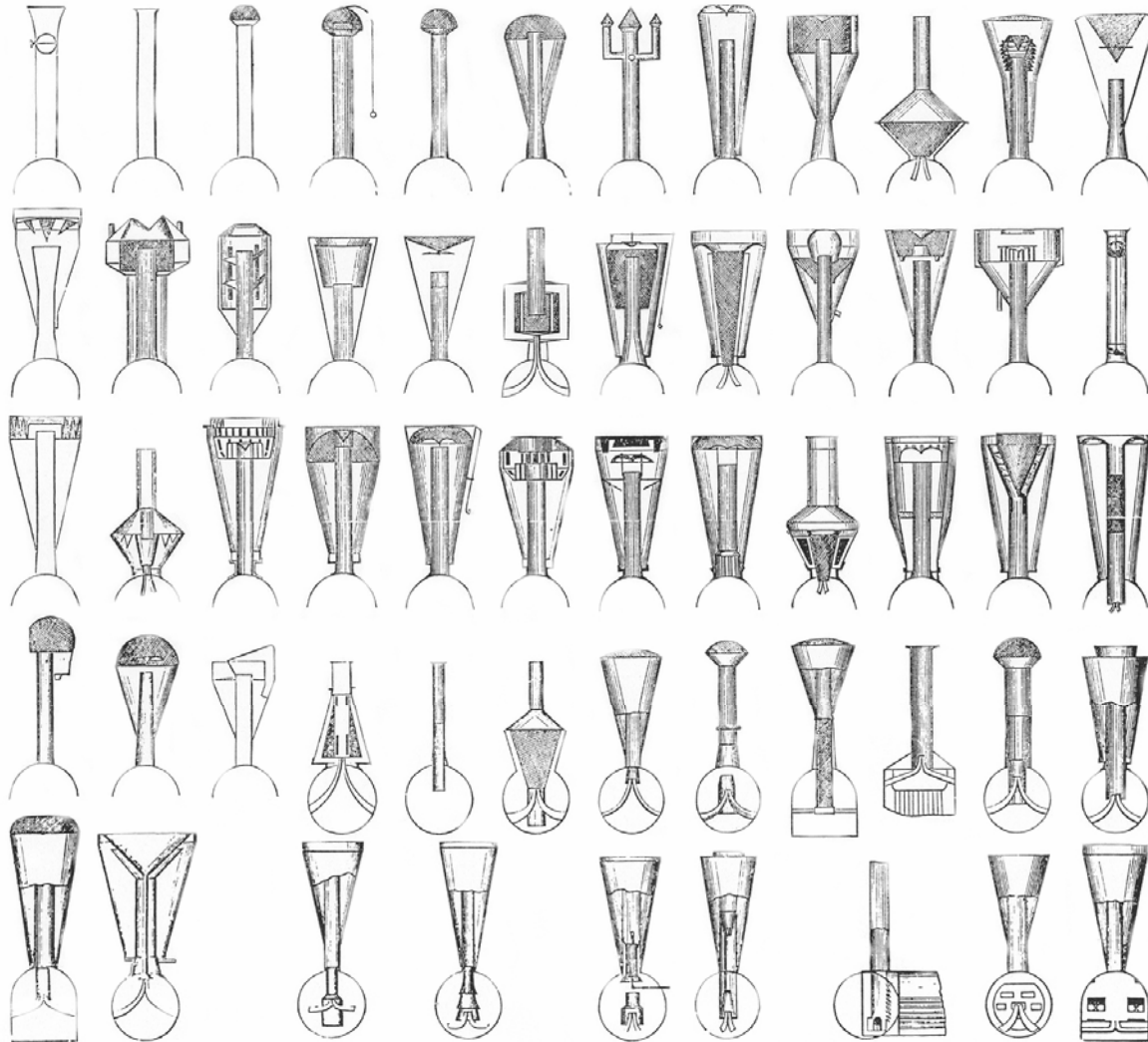
Risk Surface of Thermohaline collapse  
(years of exposure 1990-2100)  
climate sensitivity = 4 °C



# Improved Decisions under Uncertainty

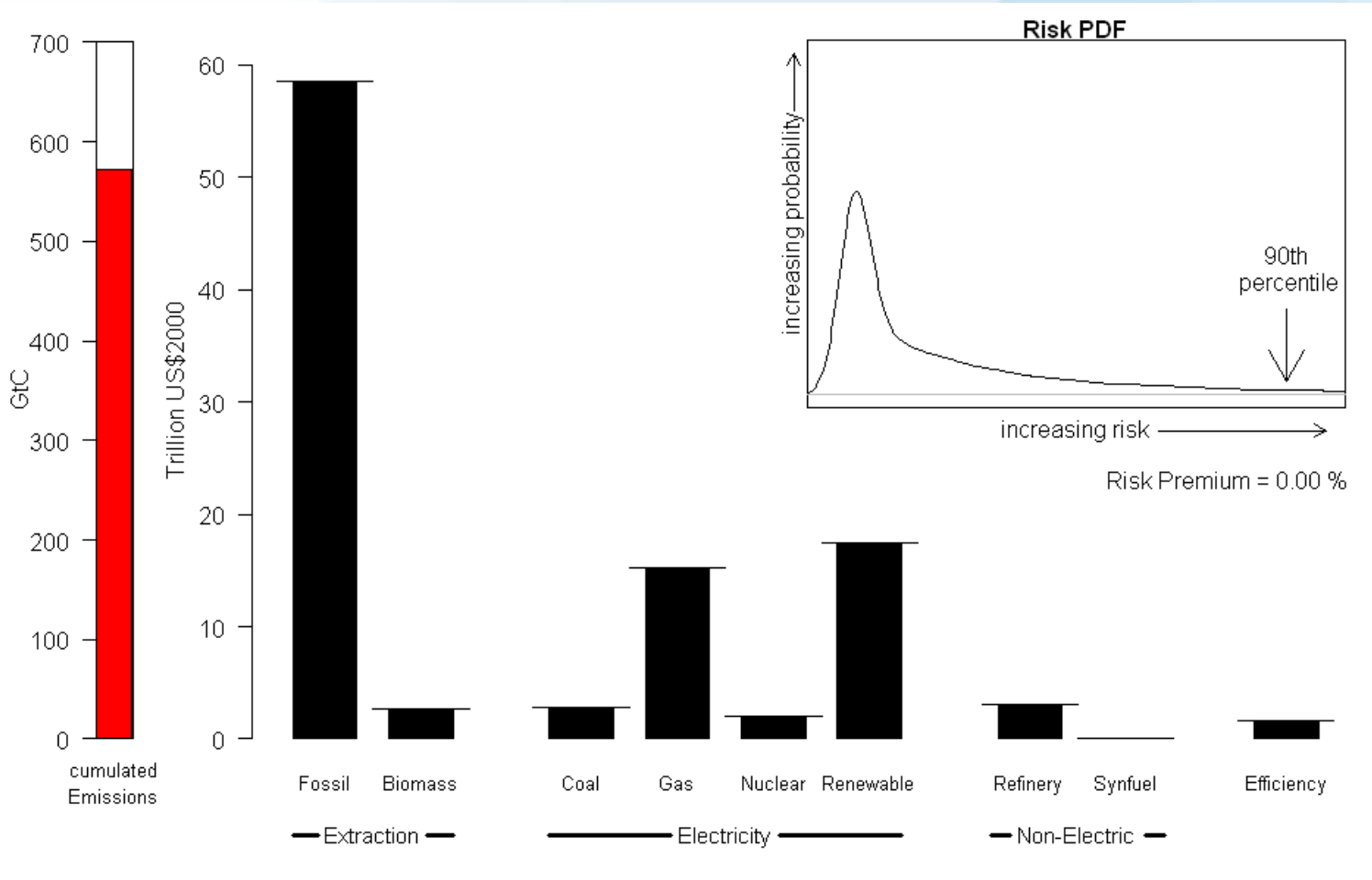
- Exploration of full uncertainty space
- Explicit treatment of risk
- Risk hedging via portfolio approach
- Today (*pars pro toto*):  
stochastic programming as applied to:
  - technology portfolios (Riahi/Krey)
  - insurance portfolio diversification  
for catastrophic risks (Ermolieva et al.)

# Technological Uncertainty : Patented but non-functional smoke-spark arrestors



Source: J. White, *American Locomotives*, 1968.

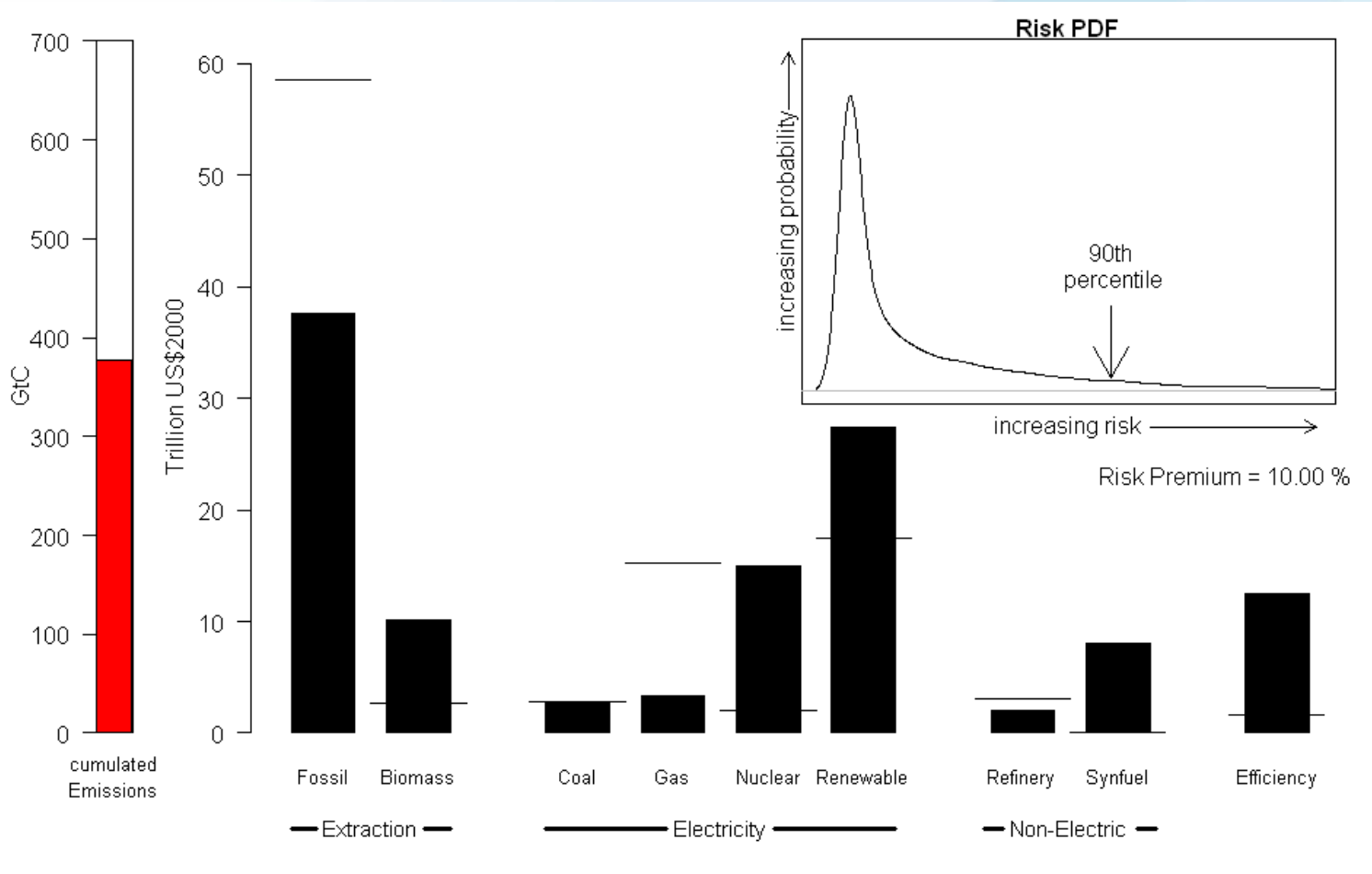
# Energy Technology Portfolio Investments and Resulting Cumulative Carbon Emissions without uncertainty



Stochastic MESSAGE model (Keywan Riahi & Volker Krey)

# Energy Technology Portfolio Investments and Resulting Cumulative Carbon Emissions under Uncertain Costs and Uncertain Carbon Taxes

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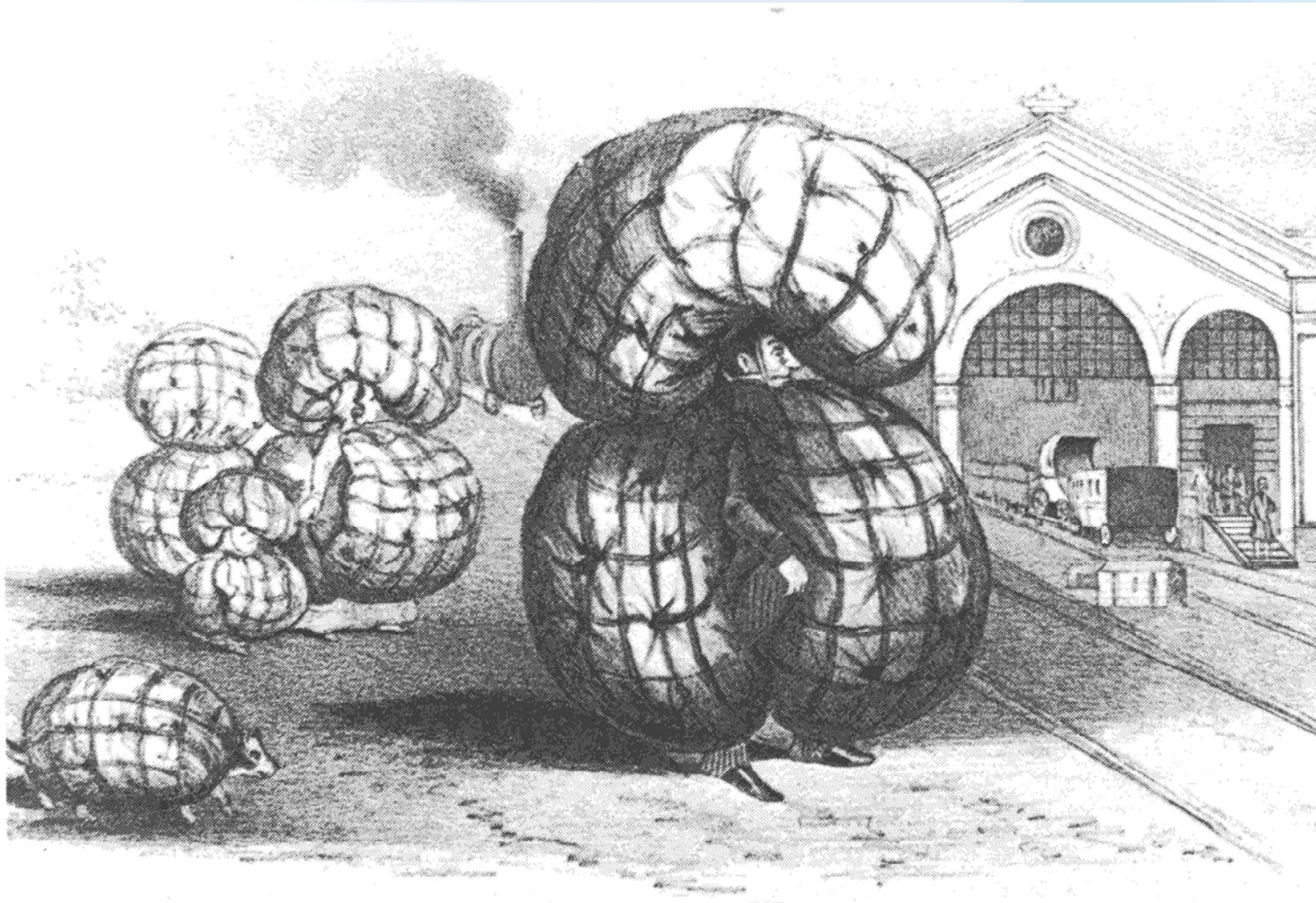


Stochastic MESSAGE model (Keywan Riahi & Volker Krey)



# Risk Management: The Precautionary Principle?

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**Protective clothing for railway passengers (1847)**

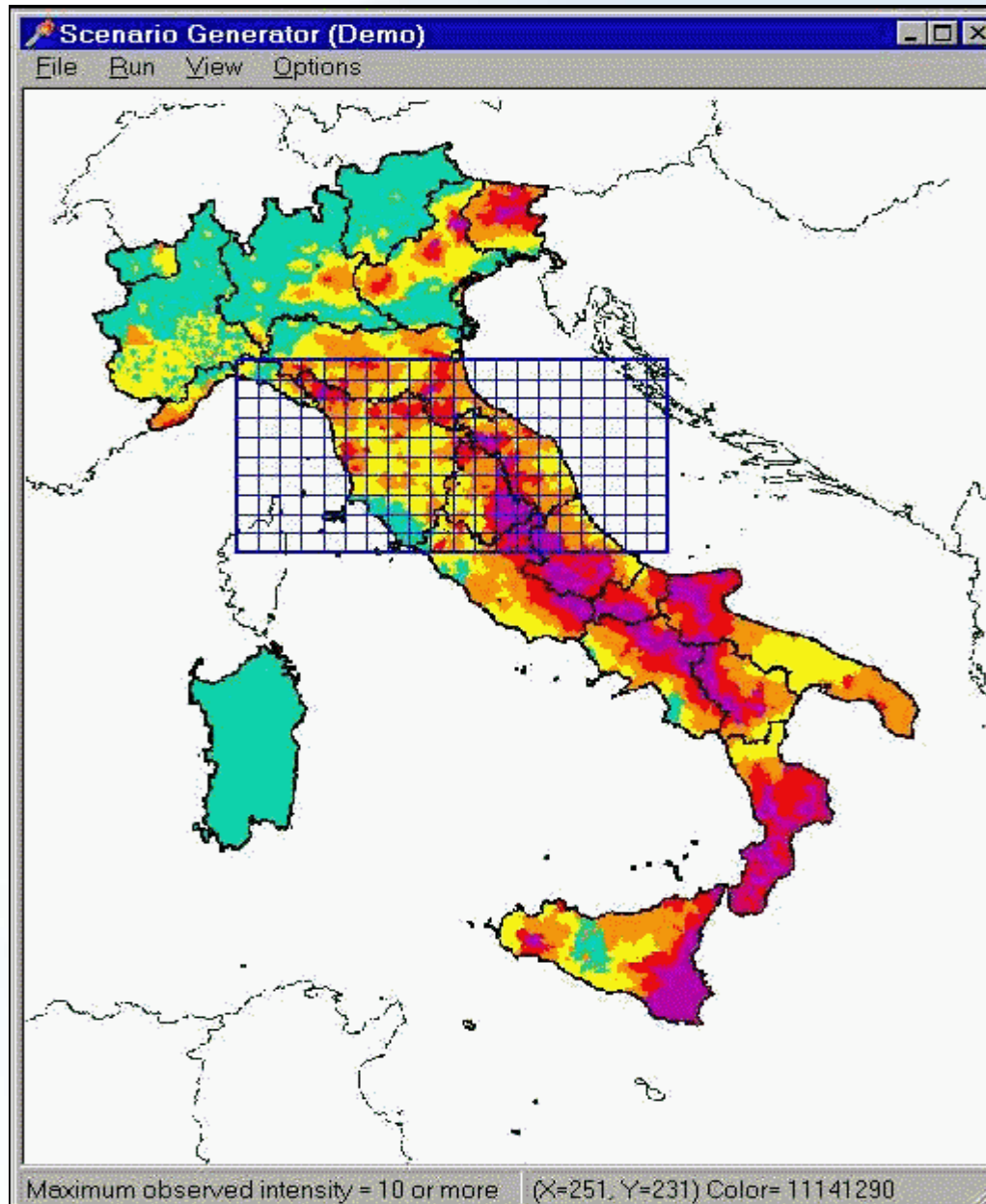


## Improved Decisions under Uncertainty

- Catastrophic risk management (e.g. floods, disease, earthquakes)
- Multi-agent and spatially explicit analysis
- Probabilistic “catastrophe generators” coupled with risk management (stochastic optimization)
- Example: Earthquake insurance risk management in Italy
- IIASA colleagues: T. Ermolieva, Y. Ermoliev, F. Fischer, G. MacDonald, et al.

# Study Region and Earthquake Scenario Generator

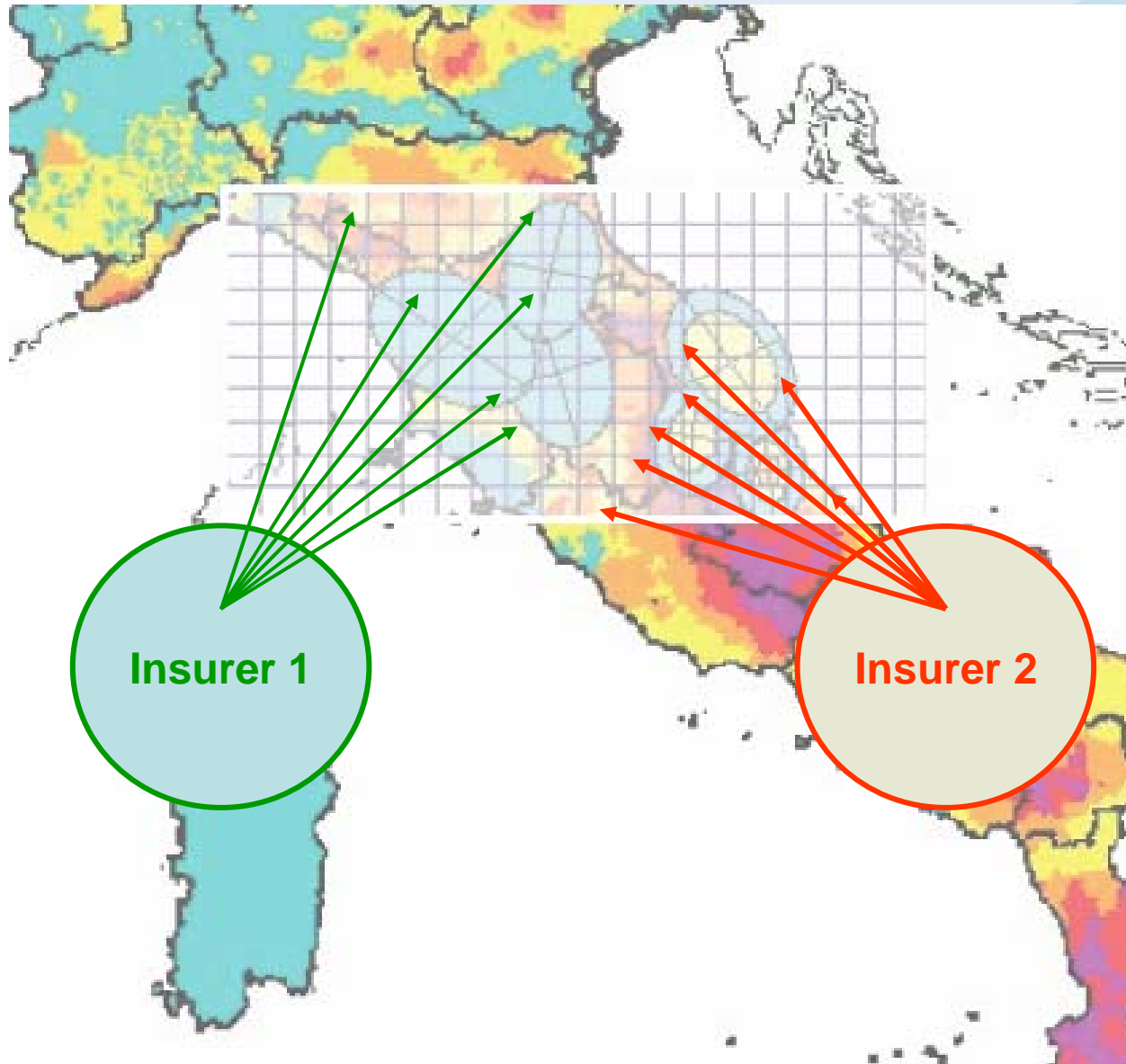
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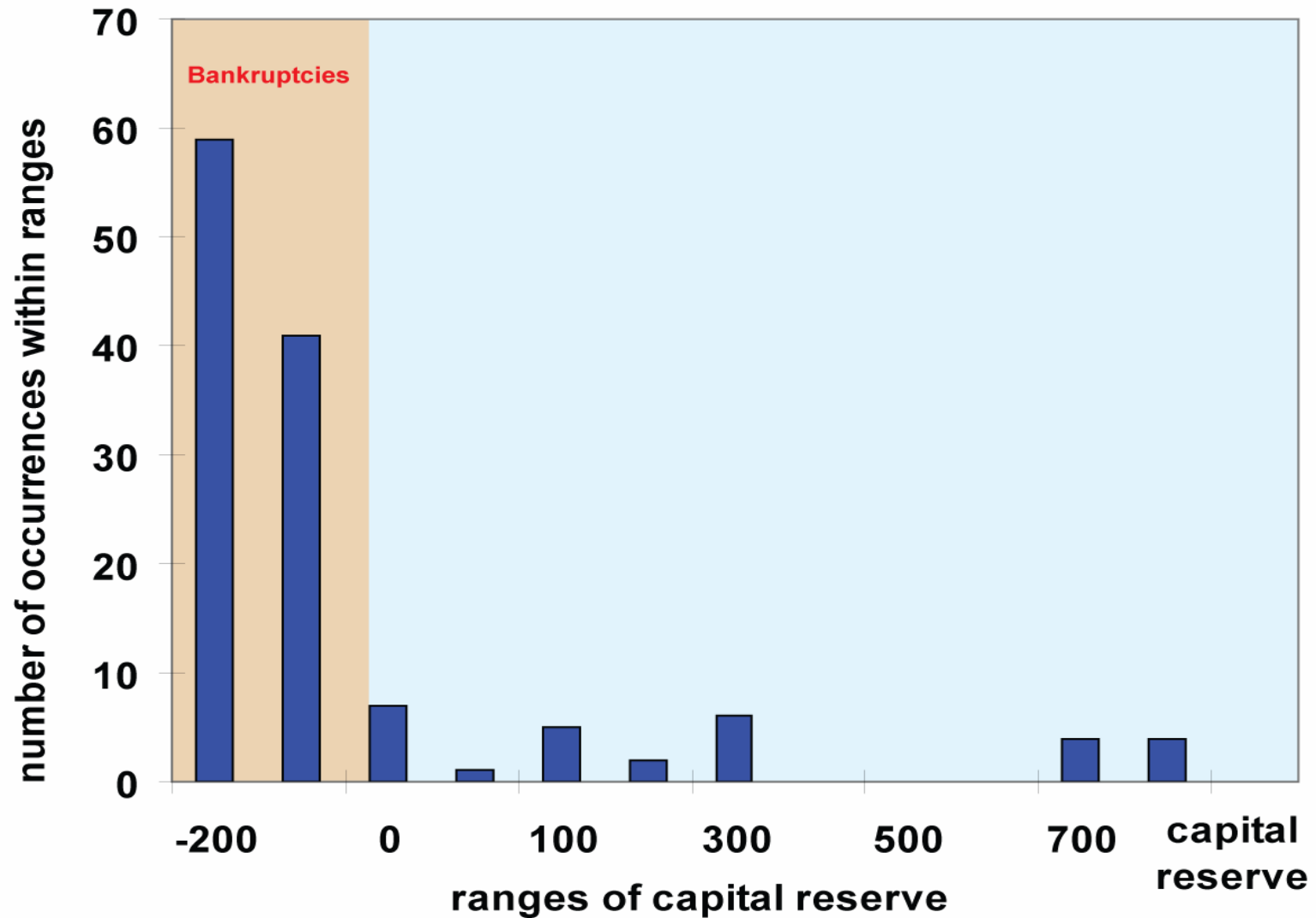


# Initial Spread of Insurers' Coverage

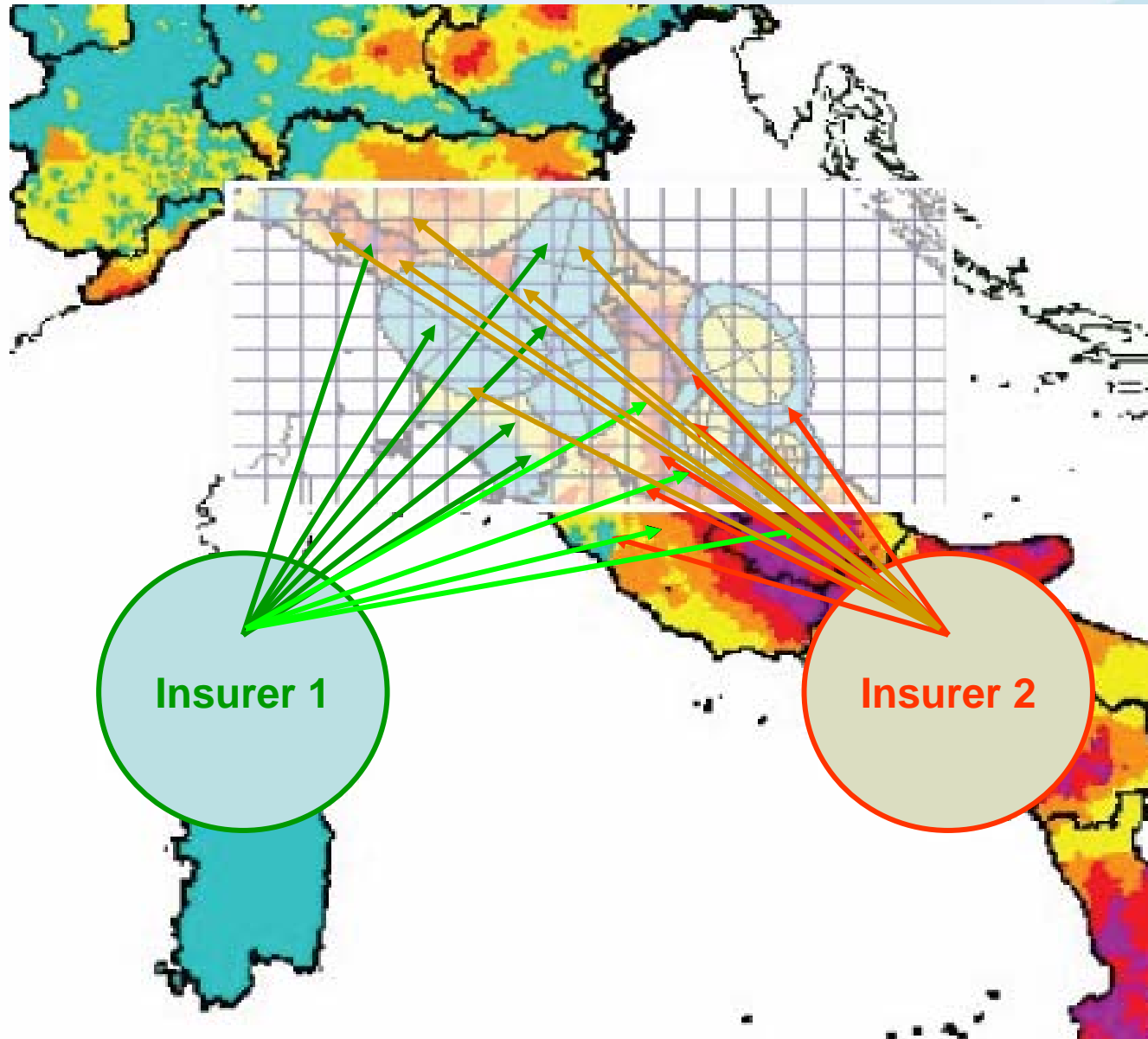
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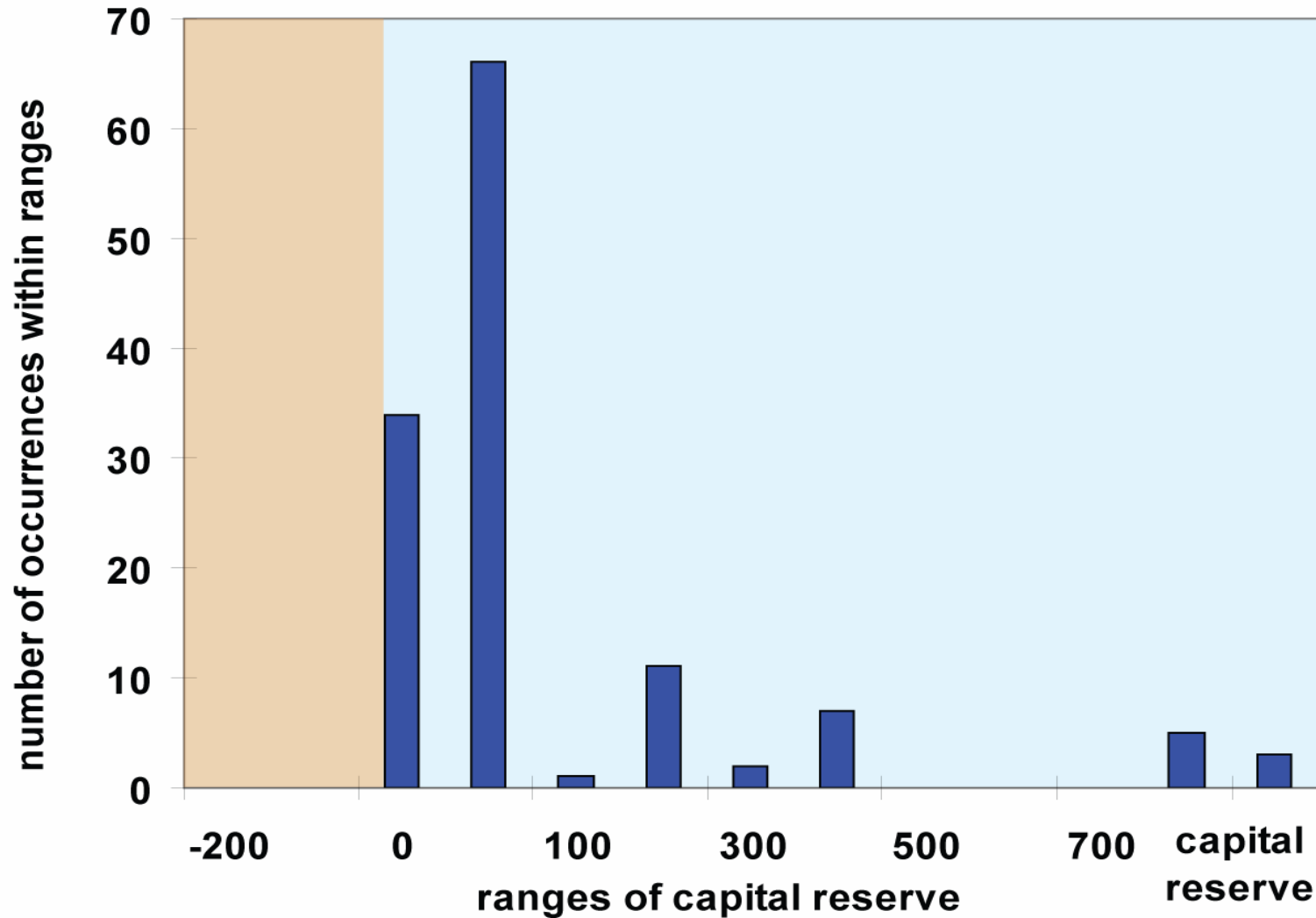
# Initial Spread with Insufficient Diversification



# Optimized Spread



# Optimized Spread: No Risk of Bankruptcies





# Summary and Conclusion

- Important IIASA achievements
- Recurrent threads:
  - multi-models, multi-disciplines
  - treatment of risk as decision variable
  - risk hedging
  - address public goods problem  
(environment, knowledge, spillovers)
- Importance of patient, long-term basic research strategy, recognizing long diffusion time