

# Modeling damages, extremes and impacts: Design your own climate adaptation strategy – a practical application of open-source probabilistic damage modeling

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Inspired by/based on (explains the slide layout, too ;-)  
“Climate Change Uncertainty and Risk: from Probabilistic Forecasts to Economics of Climate Adaptation”, spring term lecture at ETH,  
by Reto Knutti, IAC ETH and David Bresch, Swiss Re.

All material available at <https://github.com/davidnbresch/climada>  
Manual: [https://github.com/davidnbresch/climada/blob/master/docs/climada\\_manual.pdf](https://github.com/davidnbresch/climada/blob/master/docs/climada_manual.pdf)

# About the workshop

Climate adaptation is an urgent priority for the custodians of national and local economies, such as finance ministers and mayors. Such decision makers ask: 1) What is the potential climate related damage to our economies and societies over the coming decades? 2) How much of that damage can we avert, with what measures? 3) What investment will be required to fund those measures - and will the benefits of that investment outweigh the costs?

Put yourself in the shoes of a local decision maker and gain hands-on experience with the economics of climate adaptation (ECA) methodology as implemented in the open-source climada tool (<https://github.com/davidnbresch/climada>). Working in small teams, this will enable you to understand the effect of weather and climate on an economy - and to identify actions to minimize that impact at lowest cost. It demonstrates how to integrate adaptation with economic development and sustainable growth.

Using state-of-the-art probabilistic modeling, we will estimate the expected economic damage as a measure of risk today, the incremental increase from economic growth and the further incremental increase due to climate change. We will then build a portfolio of adaptation measures, assessing the damage aversion potential and cost-benefit ratio for each measure. The resulting adaptation cost curve will help us compare results at the end of the workshop - which will conclude with a critique of the methodology.



# Recommended reading

- The climate resilience story:  
[http://media.swissre.com/documents/sigma1\\_2014\\_en.pdf#page=17](http://media.swissre.com/documents/sigma1_2014_en.pdf#page=17)
- Short introduction to the Economics of Climate Adaptation (ECA) methodology and global overview of case studies done so far:  
[http://media.swissre.com/documents/  
Economics\\_of\\_Climate\\_Adaptation\\_focus\\_infrastructure.pdf](http://media.swissre.com/documents/Economics_of_Climate_Adaptation_focus_infrastructure.pdf)
- Reference: the climada manual (and access to the full tool, ready to use with MATLAB or Octave): [https://github.com/davidnbresch/climada/blob/master/docs/climada\\_manual.pdf](https://github.com/davidnbresch/climada/blob/master/docs/climada_manual.pdf)

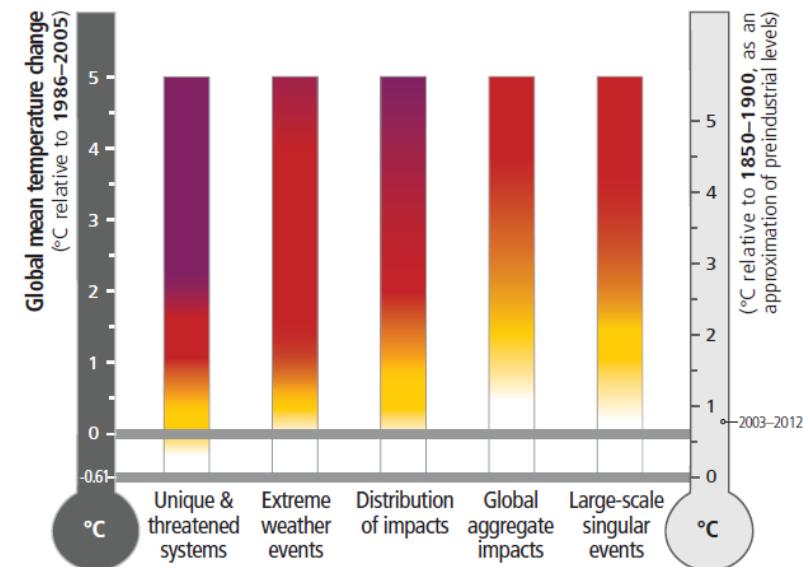
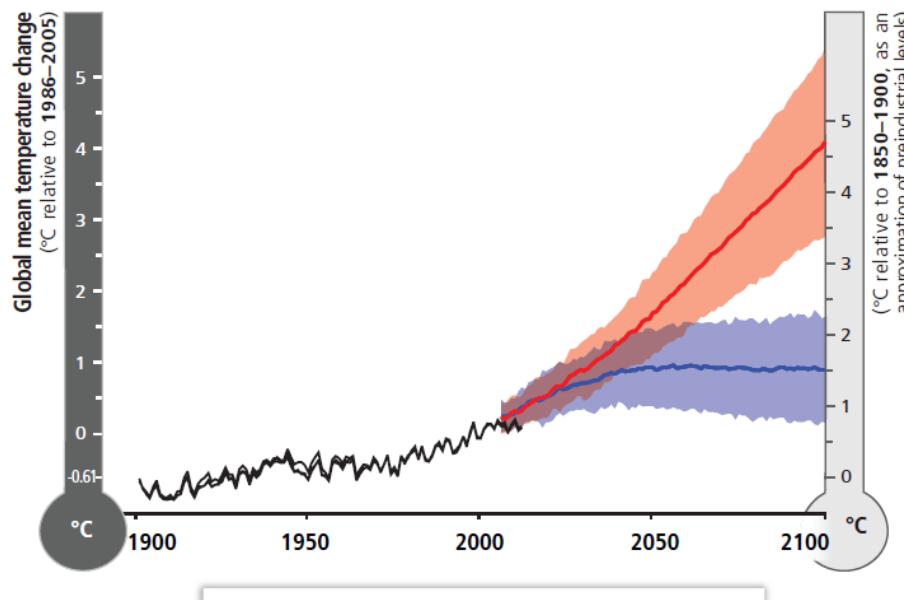


## What this workshop aims to provide

- Climate adaptation: Different perspectives on the problem of understanding, quantifying and communicating probability, uncertainty and risk, and how to make decisions in their presence
- Opportunities to think about a problem, rather than providing a recipe for a solution
- Hands on experience with an operationally used open-source tool
- Opportunities for discussion

*No worries, hands-on is less than 30 slides away*

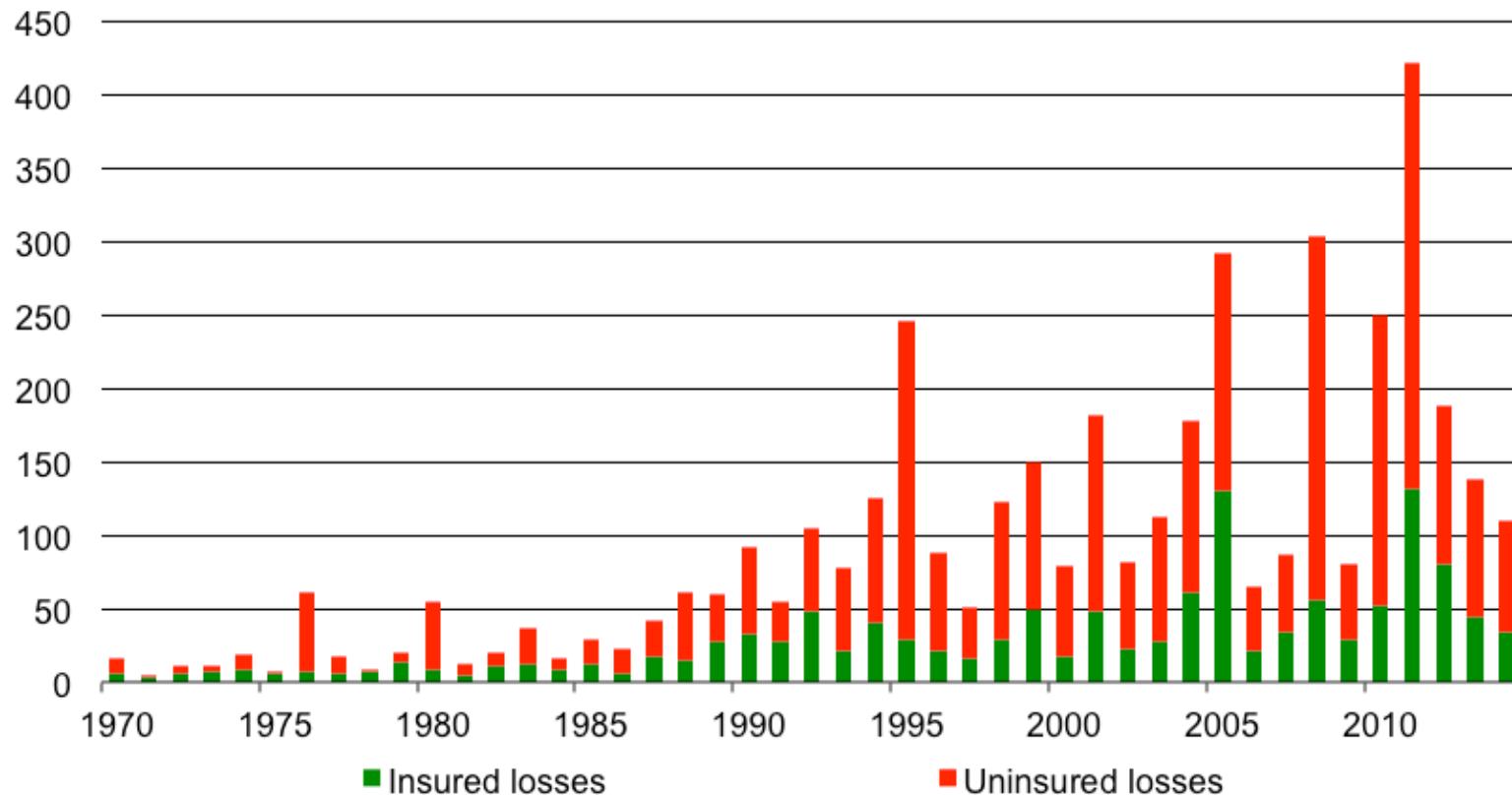
# Global reasons for concerns



(Figure: IPCC AR5 WG2, 2014, Assessment Box SPM.1 Figure 1)

# Natural catastrophe damages on the rise and: Massive gap between economic and insured damage

Natural catastrophe damages 1970-2014, in USD billion



Note: Amounts indexed to 2014. Source: Swiss Re sigma catastrophe database, <http://www.swissre.com/sigma/>



## Note on drivers

The upward trend in natural catastrophe damage is driven by:

- Higher insurance penetration
- Growing property values
- Coastal value concentration
- Higher vulnerabilities
- Climate change

Ocean Drive, FL, 1926



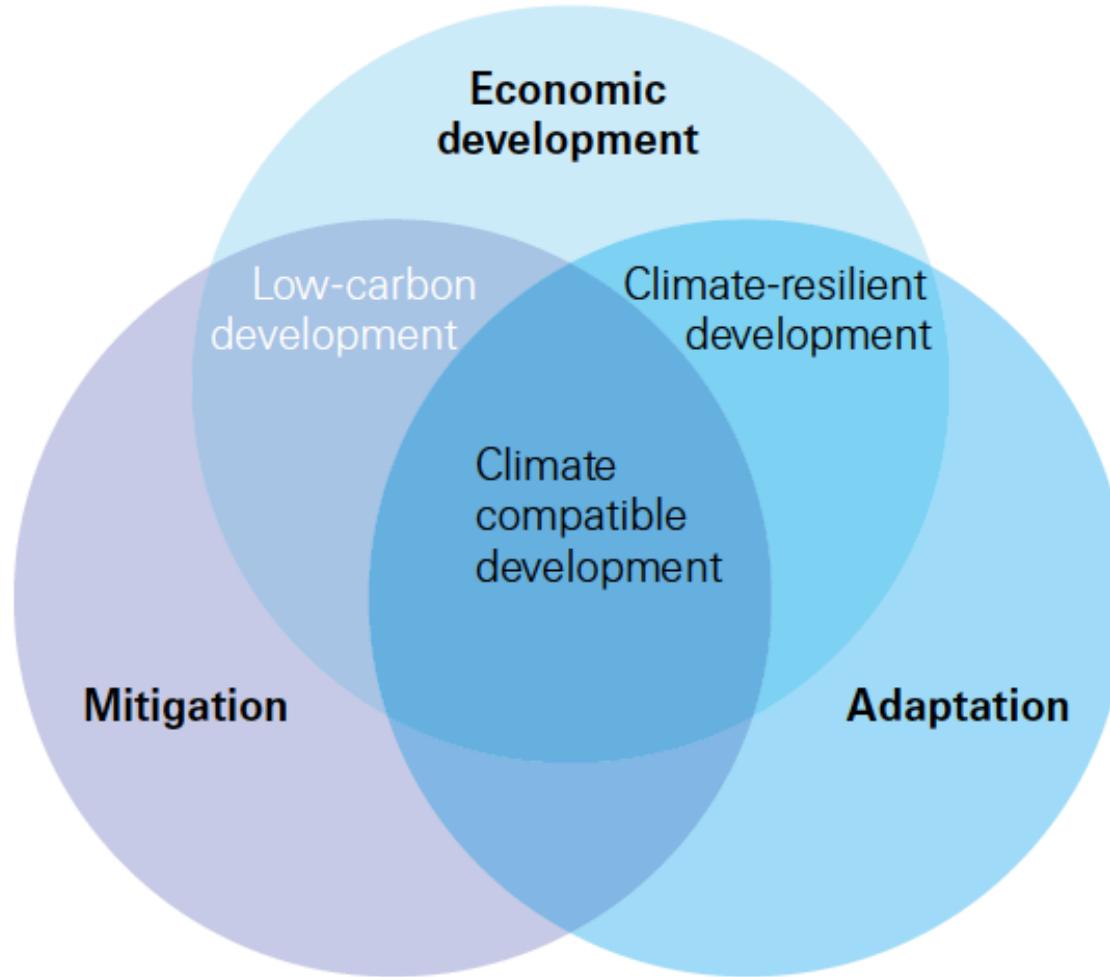
Ocean Drive, FL, 2000



Trend decomposition going forward ?

→ Need for climate resilient development

# The need for climate-resilient development



→ How would you tackle this? Adaptation first, development second? Or vice versa?



# Climate-resilient development or: Economics of climate adaptation (ECA)

## Objectives

- Provide decision makers with the facts and methods necessary to design and execute a climate adaptation strategy
- Supply financial institutions, potential funders and insurers with the information required to unlock and deepen global adaptation finance and risk transfer markets

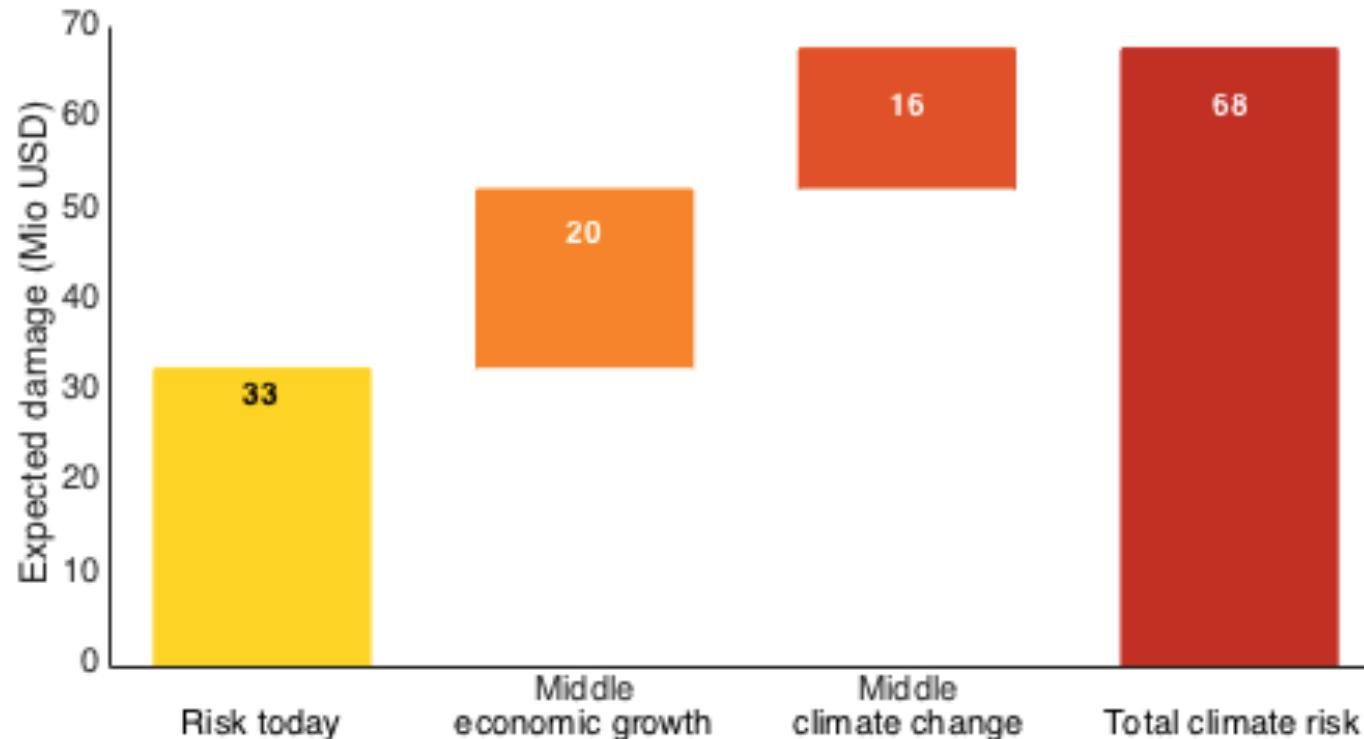
## Key features of the methodology:

- Follow a rigorous risk management approach to assess local total climate risk, the sum of
  - today's climate risk,
  - the economic development paths that might put greater population and value at risk (→ projection)
  - the additional risks presented by climate change (→ scenarios)
- Propose and prioritize a basket of adaptation measures to address total climate risk on an economic basis

# Economics of climate adaptation (ECA)

## Key outputs of the methodology (1/2)

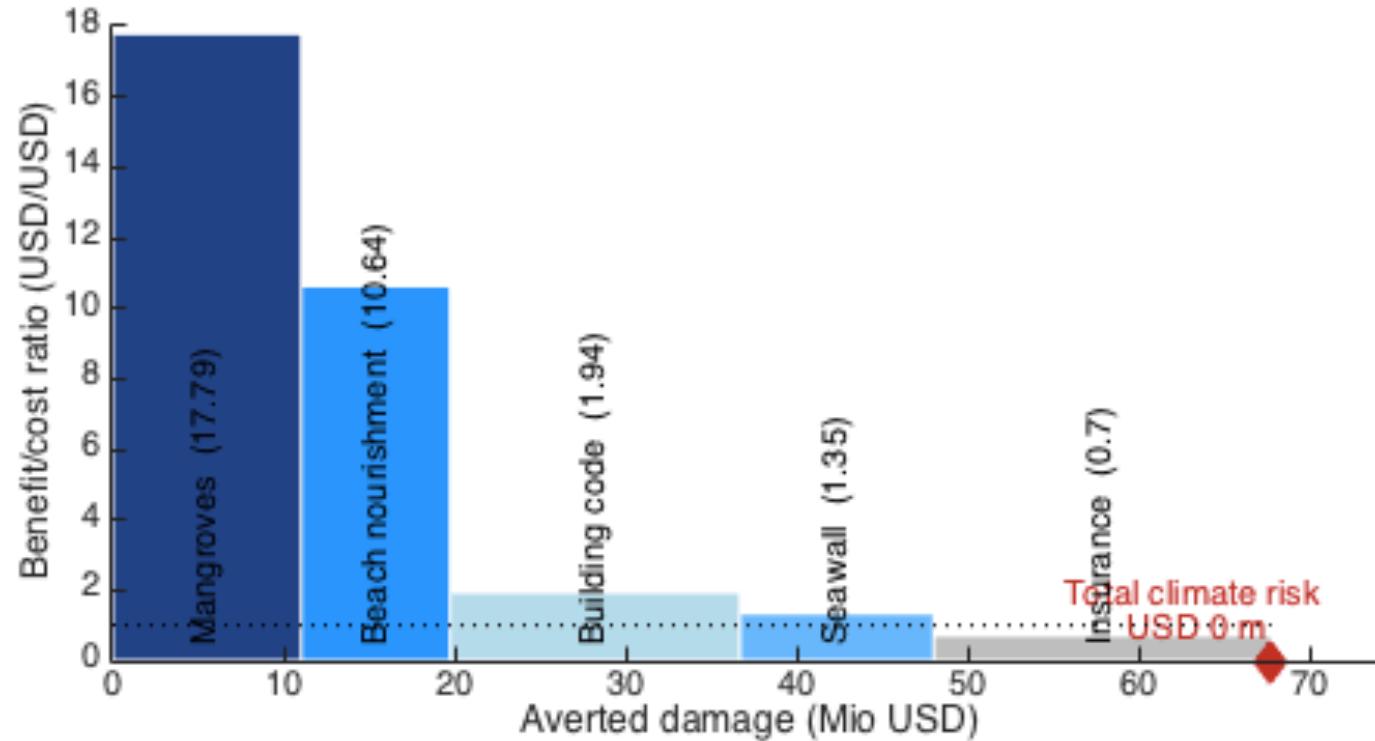
Risk today+economic growth+climate change: the ‘waterfall chart’



# Economics of climate adaptation (ECA)

## Key outputs of the methodology (2/2)

The adaptation cost curve: adaptation measures sorted by cost and benefit



# Risk

- Risk concerns the expected value of one or more outcomes of one or more future events.
- $\text{Risk} = \underbrace{\text{Probability}}_{\text{expected}} \otimes \underbrace{\text{Severity}}_{\text{value}}$
- Risk is defined (e.g. ISO 31000) as the effect of uncertainty on objectives (whether positive or negative).

# Risk<sup>1</sup> Management

Risk identification: Shared mental model, the prerequisite for awareness

- perception is based on a *shared mental model*  
→ wider sharing builds awareness

Risk analysis: Quantification, the basis for decision-making

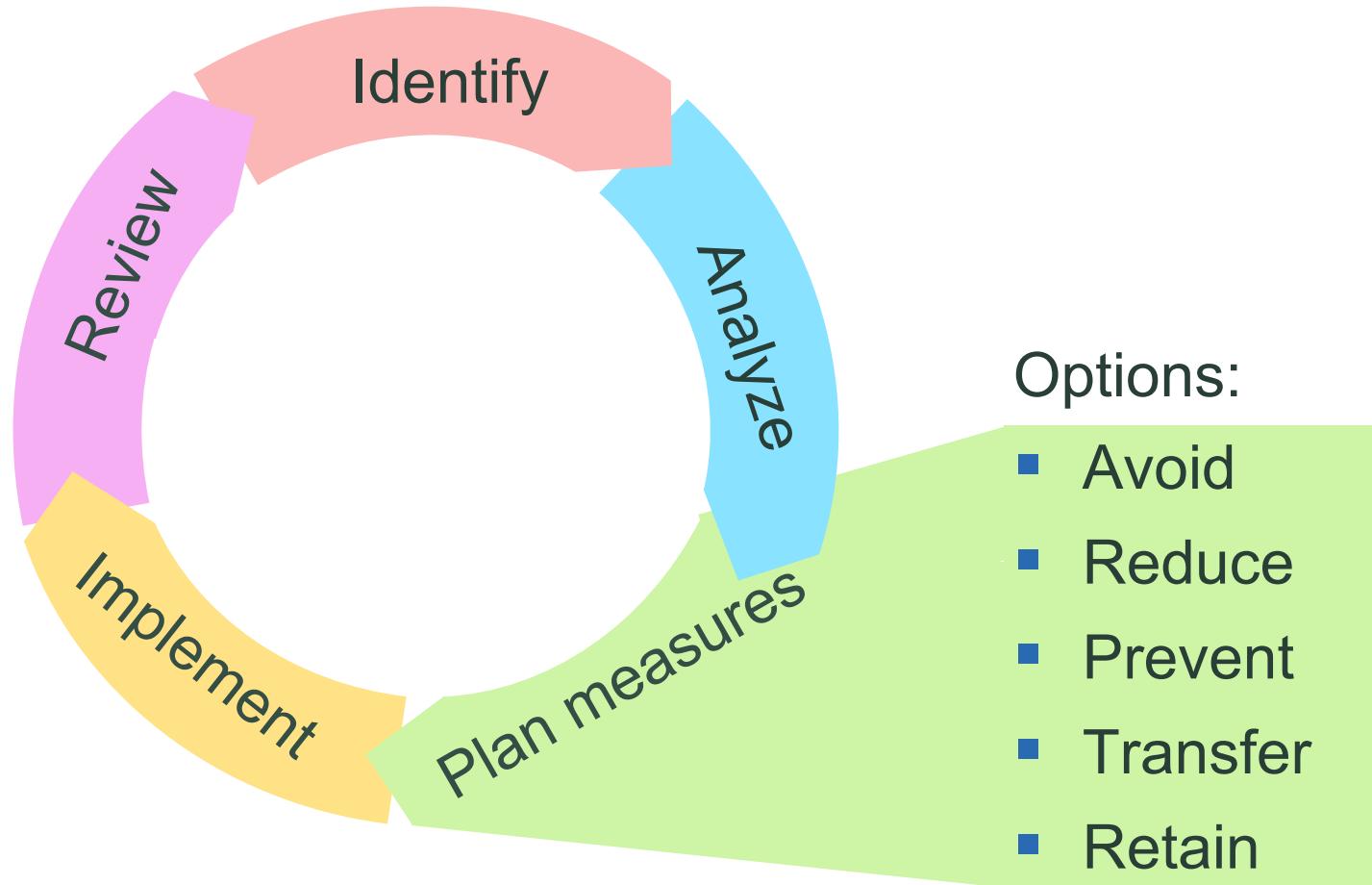
- Risk model: the quantitative expression of a shared mental model  
→ allows to assess risk mitigation options

Risk mitigation: Prioritization based on metrics, options are to

- avoid
- reduce
- prevent
- transfer : Insurance puts a rice tag on risks → incentive for prevention
- or retain the risk

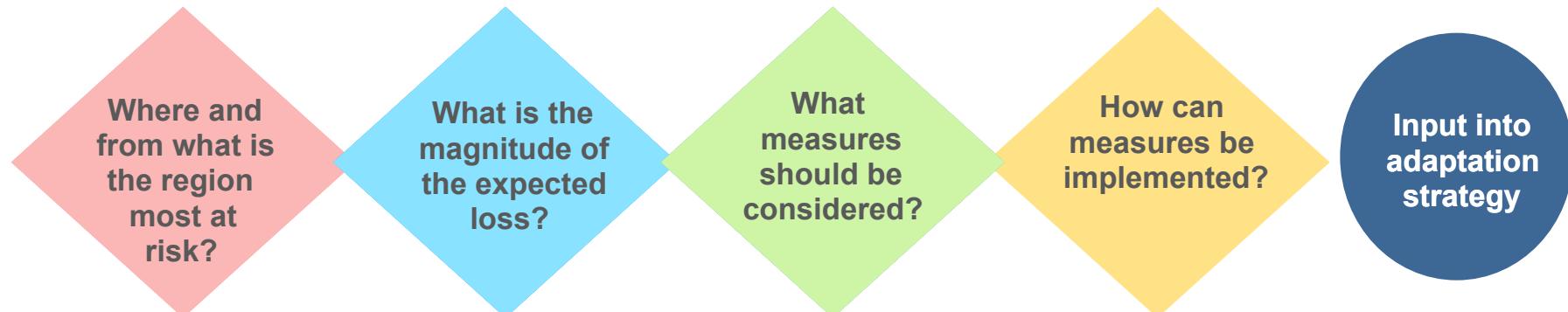
<sup>1</sup> Risk = Probability  $\otimes$  Severity

# Risk Management Cycle



# ECA<sup>1</sup> – the methodology

Identify → Analyze → Plan measures → Implement



## Map of areas at risk

- Identify most relevant hazard(s) in case location
- Identify areas that are most at-risk, by overlaying hazard(s) on:
  - Population
  - Economic value (GDP)

## Estimate of potential loss

- Hazard: Develop frequency and severity scenarios
- Assets: Quantify assets and income value in area at risk
- Vulnerability: Determine vulnerability of assets and incomes to the hazard

## Set of adaptation measures

- Identify potential adaptation measures
- Determine societal costs and benefits and basic feasibility
  - Interviews with experts
  - Economic analysis

## Implementation assessment

- Assess current progress against the measures
- Understand requirements to implementation
- Determine actions required to implement measures

<sup>1</sup>Economics of Climate Adaptation

# Natural catastrophe modelling

What is the magnitude of the expected loss?

Hazard

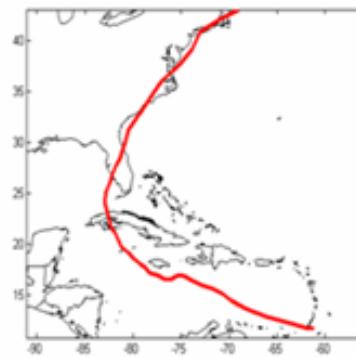
Damage function

Assets

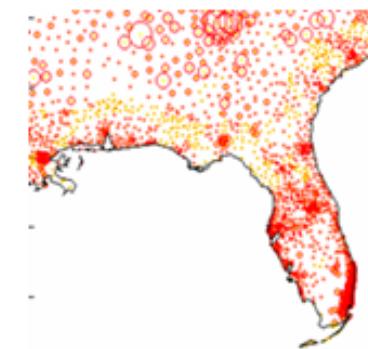
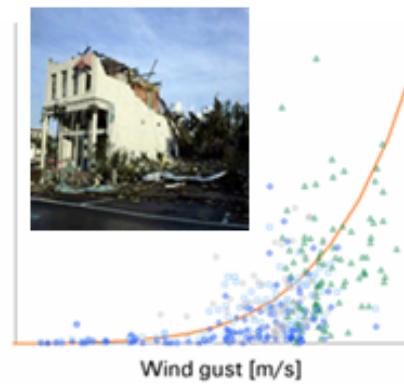
How strong?  
How frequent?

How well built?

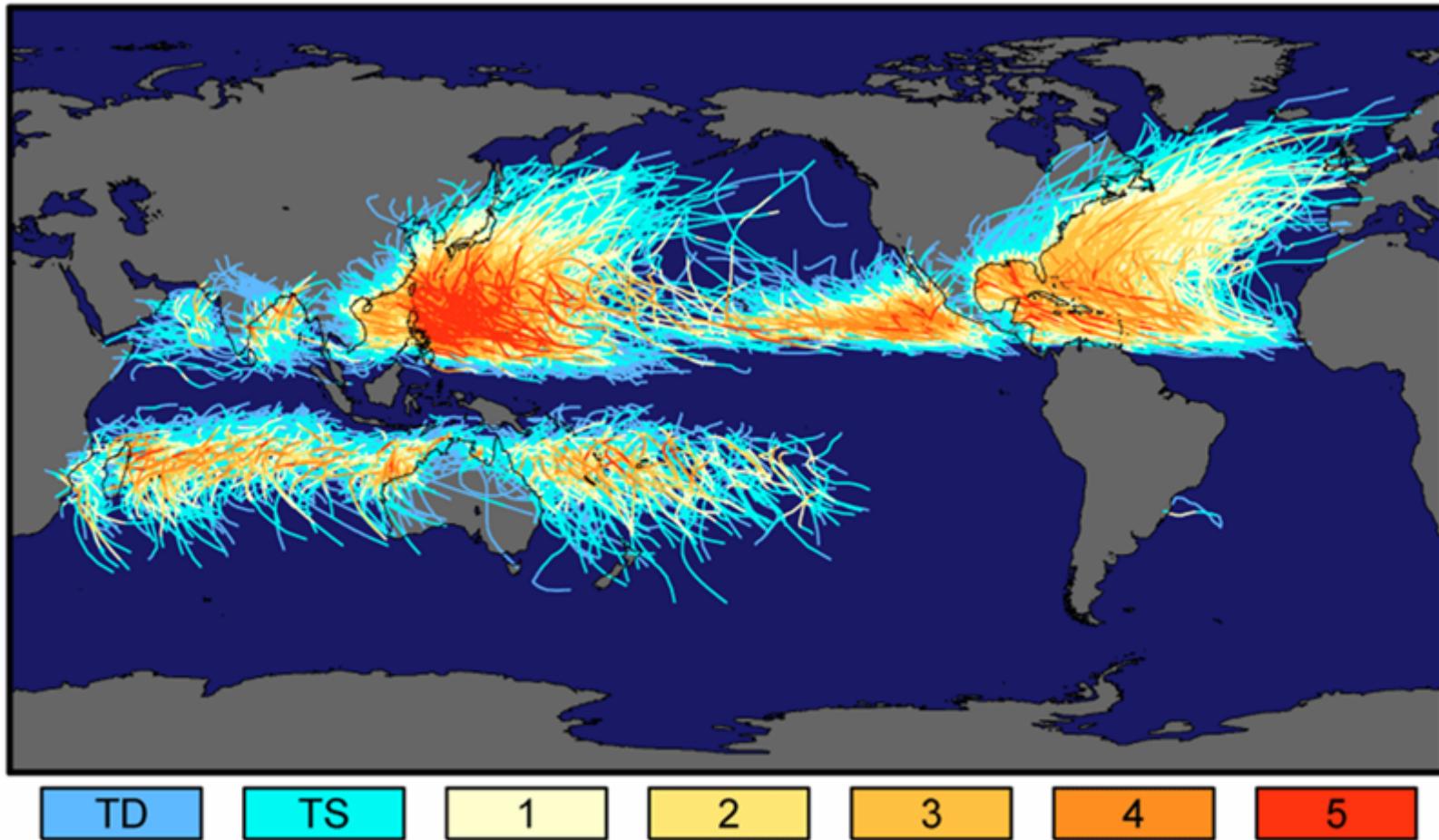
Where?  
What?



Mean damage ratio  
[% of total sum insured]

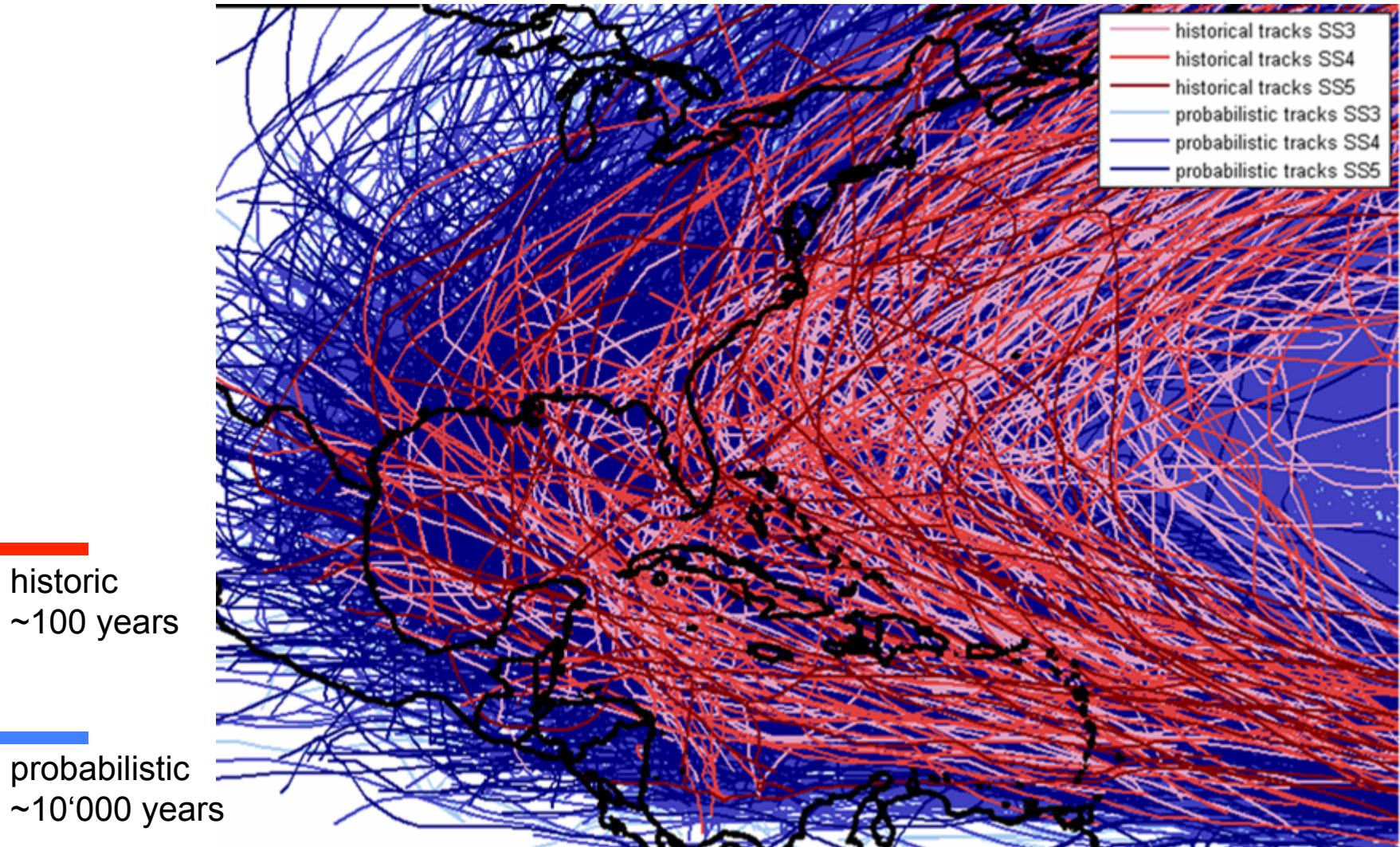


# Tropical cyclones



Saffir-Simpson Hurricane Intensity Scale

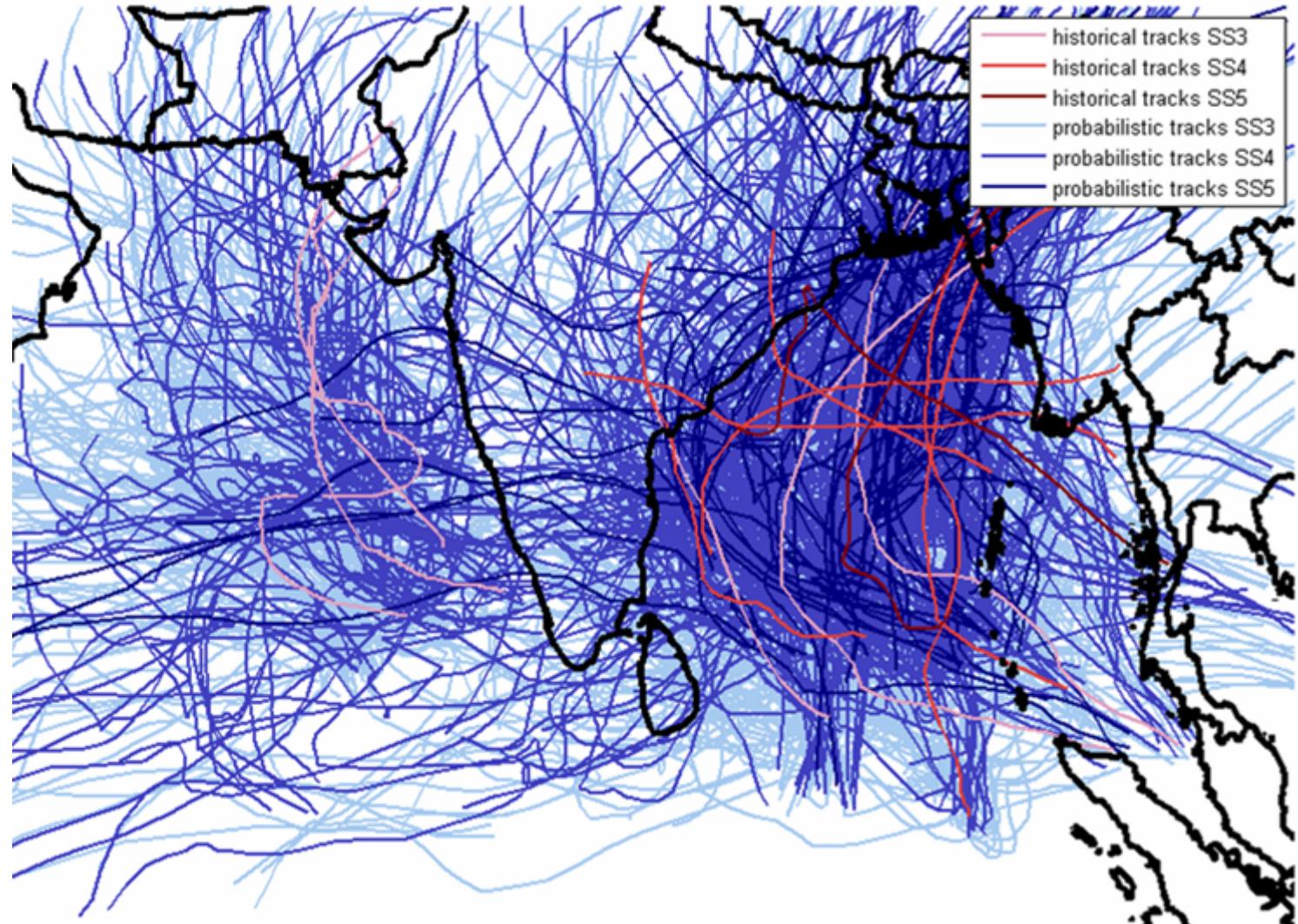
# Tropical cyclones in the North Atlantic



# Tropical cyclones in the Indian ocean

historic  
~ 25 years

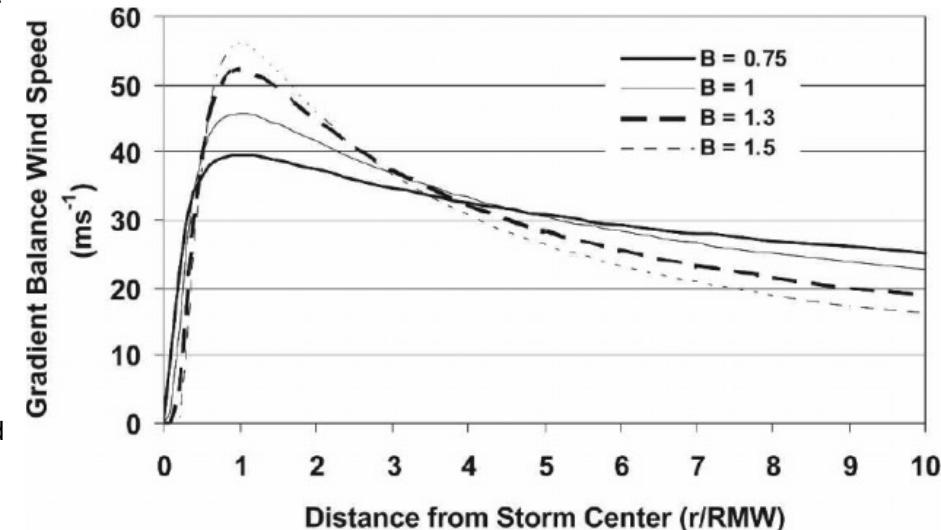
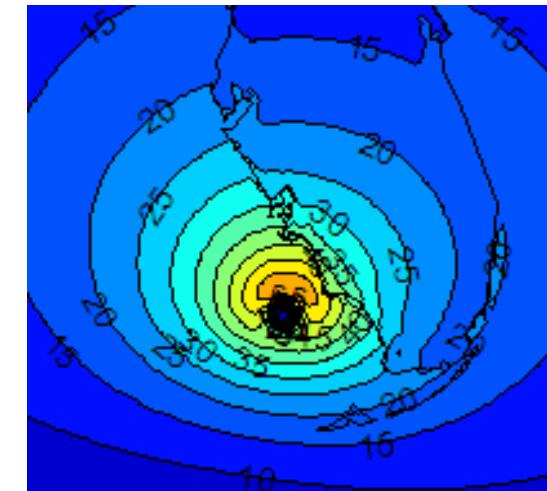
probabilistic  
~ 5'000 years



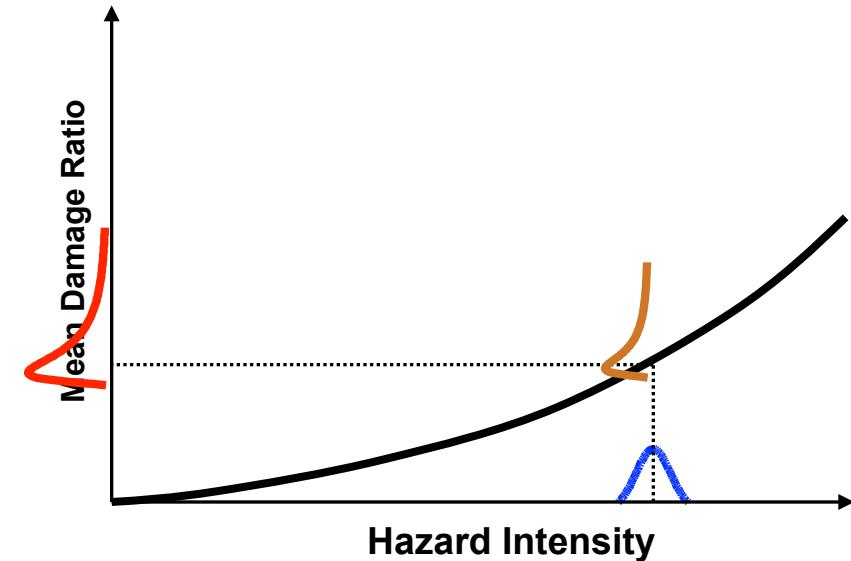
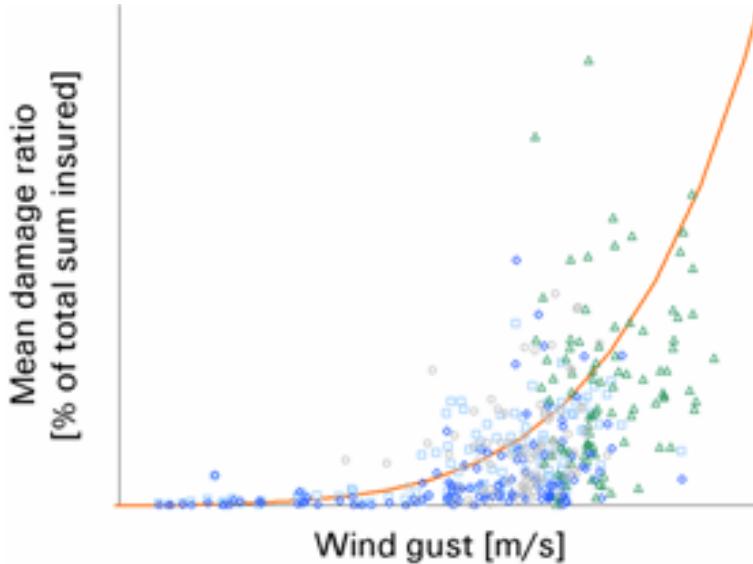
# Tropical cyclone intensity – the wind field

We use the Holland wind field model

- The 1-min sustained wind at gradient wind level (boundary layer height & no surface effects) is modelled using the Holland 2008 approach. It models the first-order vortex of a tropical cyclone.
  - The translational speed (also called celerity) is added geometrically.
- Holland, G. J., 1980: An analytic model of the wind and pressure profiles in hurricanes. *Monthly Weather Review*, 108, 1212-1218.
- Vickery, P.J. and D. Wadhera, 2008: Statistical models of Holland pressure profile parameter and radius to maximum winds of hurricanes from flight-level pressure and H\*wind data. *J. Appl. Meteor. Clim.*



# Notes on damage function



Uncertainty of the  
hazard intensity



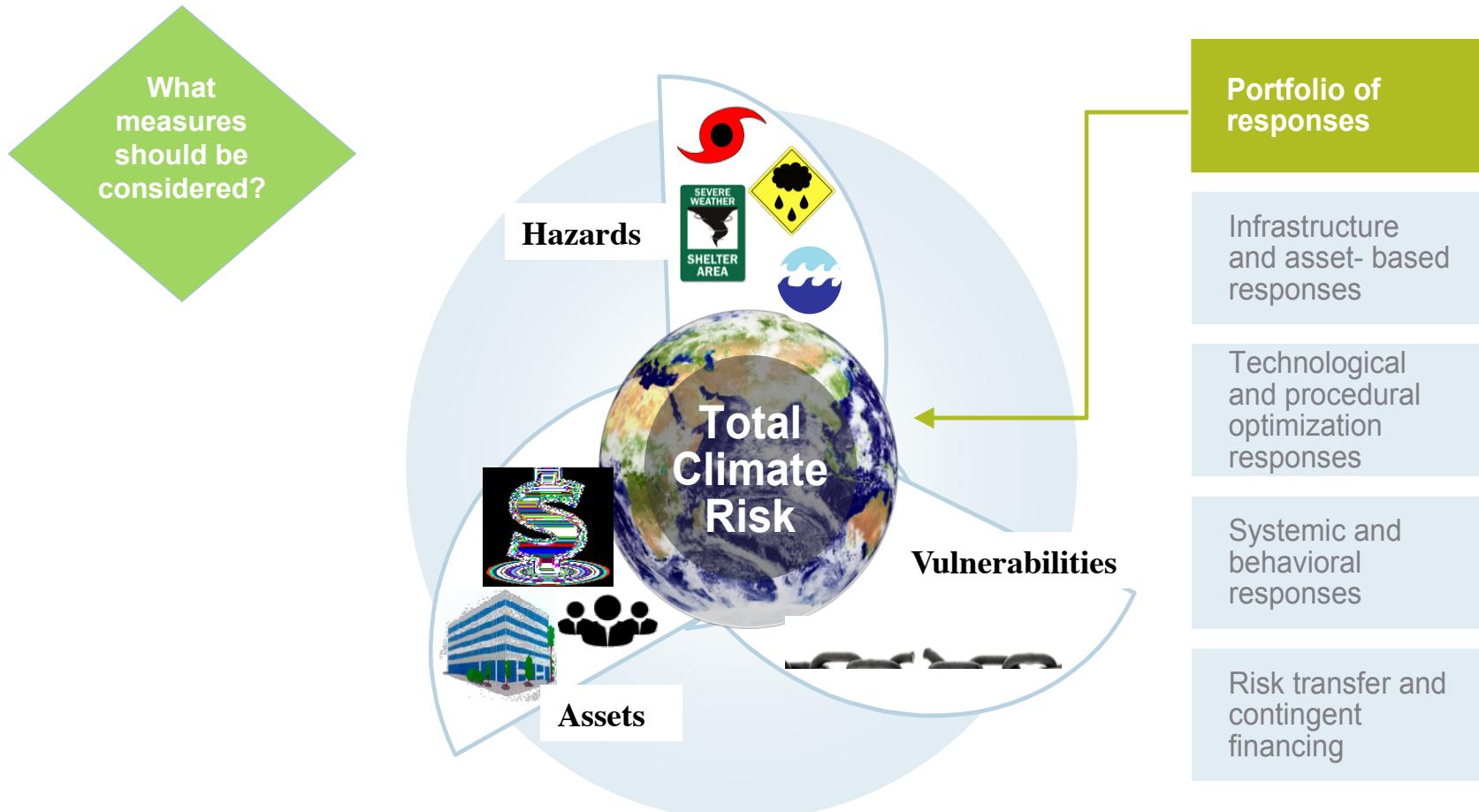
+  
Uncertainty of the  
damage



results in  
**Convoluted Distribution**



# Basket of adaptation measures



→ adaptation measures for Miami, Florida, any ideas?

## Excursion: Discounting – Present value calculation

- All consideration are net of inflation, means all future costs and benefits expressed in terms of the amount they could purchase at today's prices. If we expect 3% inflation next year, then \$103 at next year's prices has the same purchasing power as \$100 at today's prices. So we can refer to it as \$100 in 'real' or inflation-adjusted dollars (or any other currency).
- Is it better to receive \$100 today or to receive \$100 in the future?  
→ clearly better to receive \$100 today and to put it into a bank account. At say 2% interest, you will possess \$122 [ $=100*(1+0.02)^{10}$ ] in ten years from now. Or you only need to put \$82 into the bank today to receive \$100 in ten years [ $=100/(1+0.02)^{10}$ ]. In the jargon of economics, \$82 today is the present value of 100\$ to be received ten years from now, at a discount rate of 2%.
- The present value (PV) is the amount you would have to put in a bank account today, earning interest at discount rate, to end up with the target amount at the specified time in the future.

## Costs and benefits – example (1/2)

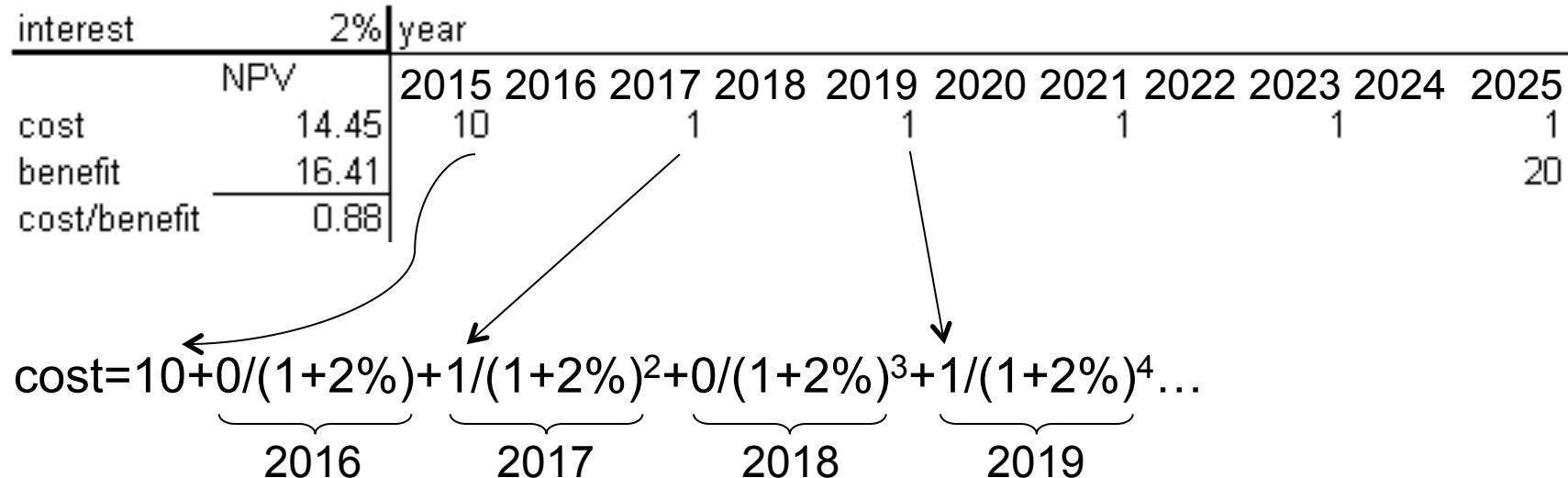
In most cases, one deals with cost and benefit streams or patterns over years. Hence one needs to discount (complex) payment patterns – and often with a time-dependent yield curve. A simple example shall illustrate this:

- Let's assume we expect a climate-related loss of 20 mio CHF by 2025 and hence evaluate the option to invest in prevention (the *cost*) starting 2015 in order to avert the loss (the *benefit*).
- Let's further assume the preventive measure be a dam to be built in 2015 (at a *cost* of 10 mio CHF) and recurring maintenance costs of 1 mio CHF every second year.
- Is it worth building the dam?
- No discounting, cost: dam, benefit: averted loss, in mio CHF:

interest	0%	year	2015	2016	2017	2018	2019	2020	2021	2022	2023	2024	2025
	NPV												
cost		15	10		1					1		1	1
benefit		20											20
cost/benefit		0.75											

## Costs and benefits – example (2/2)

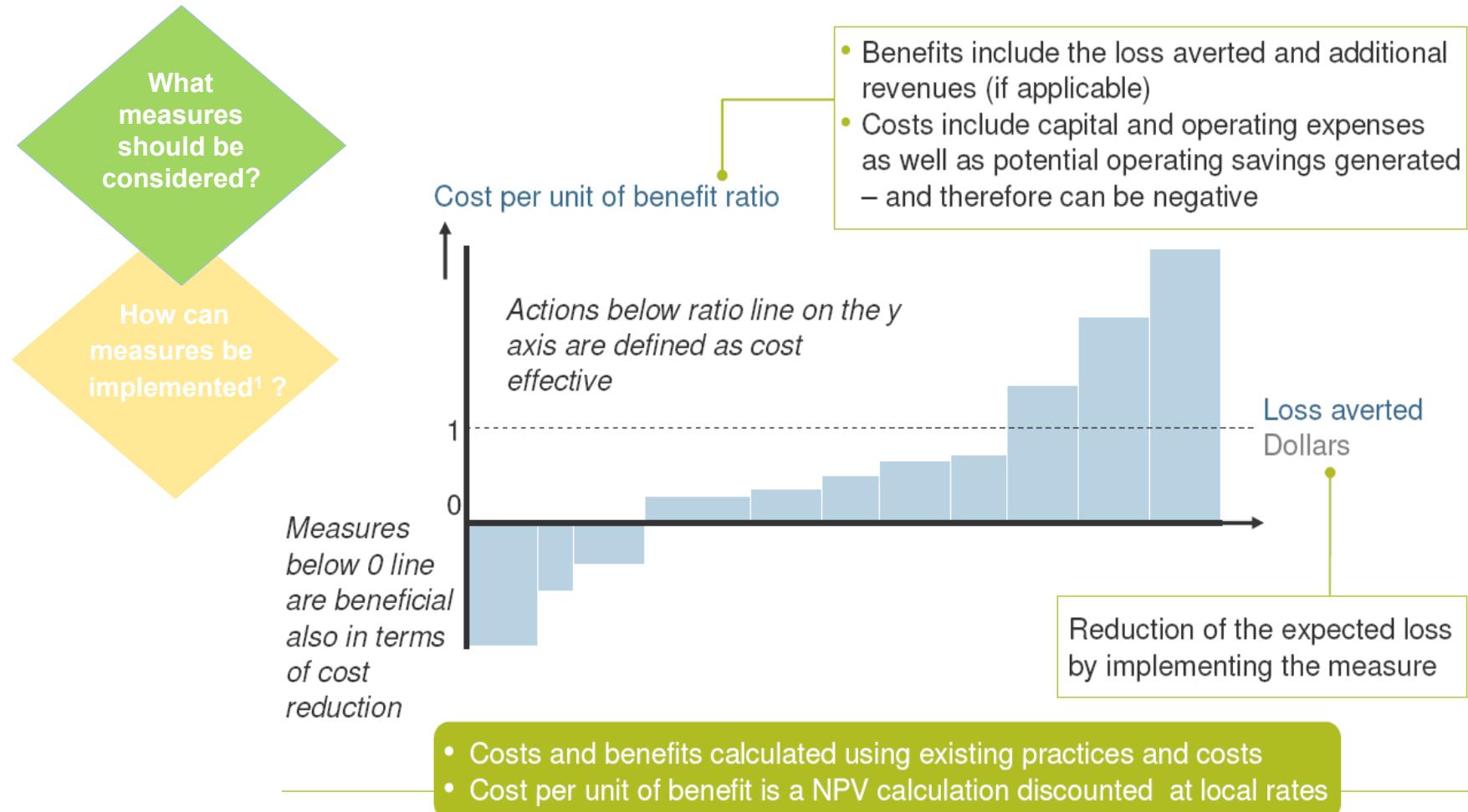
- at 2% discount rate:



- at 5% discount rate:

interest	5%	year	2015	2016	2017	2018	2019	2020	2021	2022	2023	2024	2025
NPV													
cost	13.77			10		1					1		1
benefit	12.28												20
cost/benefit	1.12												

# The adaptation cost curve



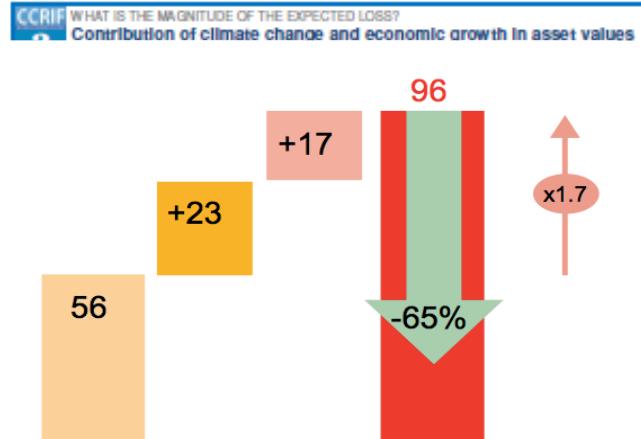
<sup>1</sup>The 'how' refers primarily to the sequence or priority and the financials, not the physical implementation

# Adaptation cost curve – the recipe (one measure)

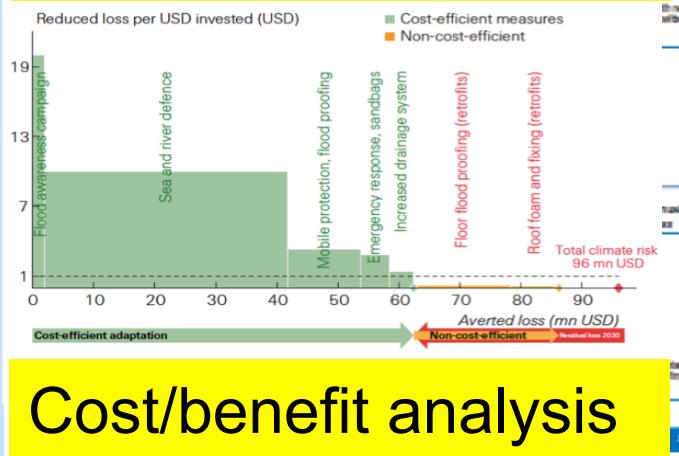
1. Calculate present value (PV) of costs of measure
2. Today (year 2015): assets, hazard as per today (probabilistic model)
  1. calculate annual expected loss with no measures
  2. calculate annual expected loss with measure applied  
→ difference 2.1) minus 2.2) gives you benefit of measure today
3. Future (year 2030): assets, hazard as in the future (prob+scenario)
  1. calculate future annual expected loss with no measures
  2. calculate future annual expected loss with measure applied  
→ difference 3.1) minus 3.2) gives you future benefit of measure
4. Discount benefits → horizontal axis of adaptation cost curve  
compare with PV of costs → vertical axis of adaptation cost curve  
→ no worries, all implemented in climada, the open-source tool ;-)

# Roadmap and business case for adaptation funding

## Output of ECA analyses



## Loss assessment



## Cost/benefit analysis

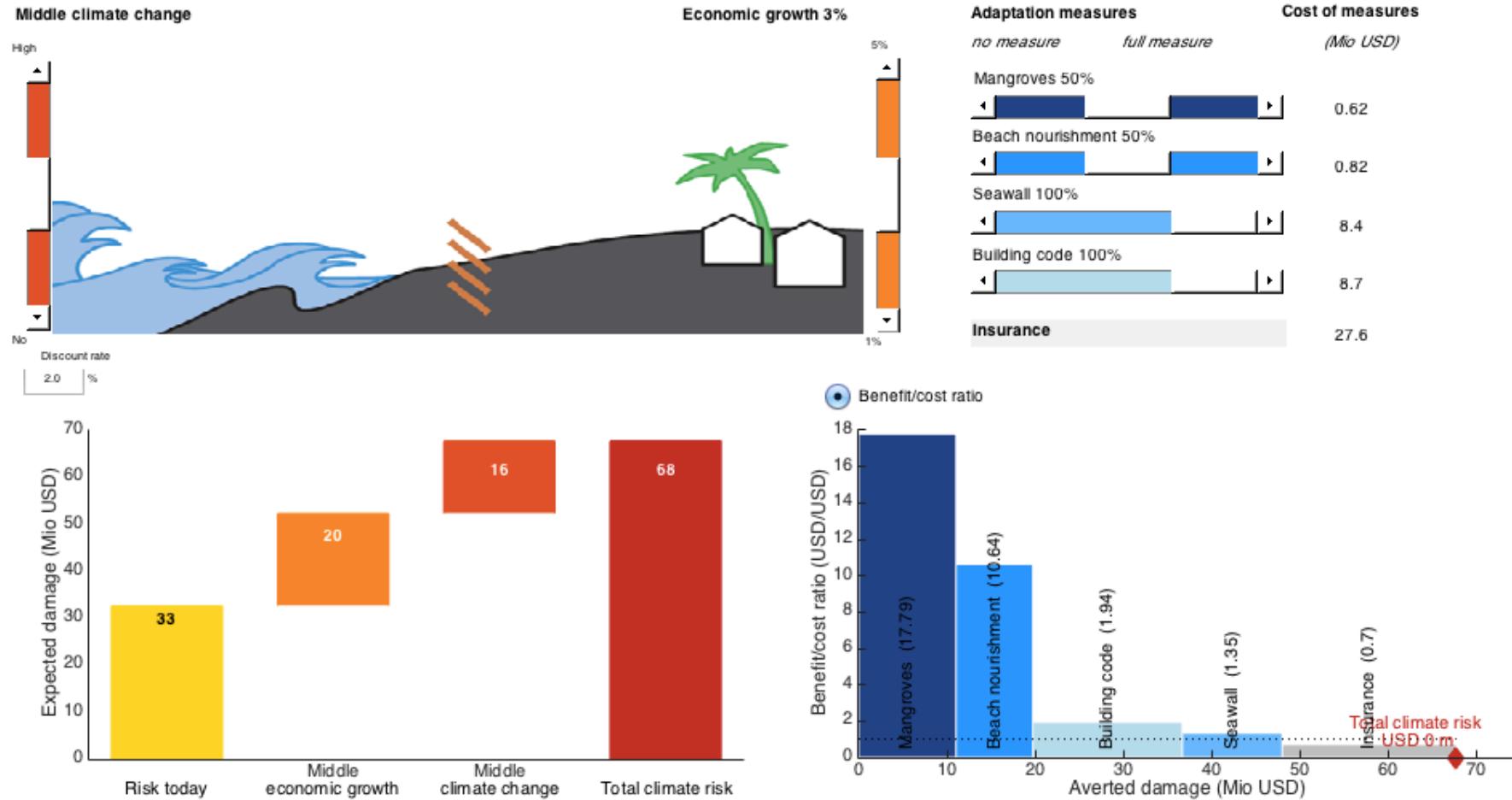
### What if we ...

- ... specify our '**risk appetite**' in line with our development priorities
- ... incorporate further criteria relevant to us in addition to cost-benefit ratio
- ... (re-)prioritise risk mitigation and transfer **measures** based on our priorities
- ... calculate an **adaptation business case** incl. investment plan
- ... develop a **roadmap** incl. **priority initiatives**
- ... use **roadmap and business case for funding discussions**
- ... speed-up implementation with the additional funding and further **increase resilience**

# Workshop step-by-step

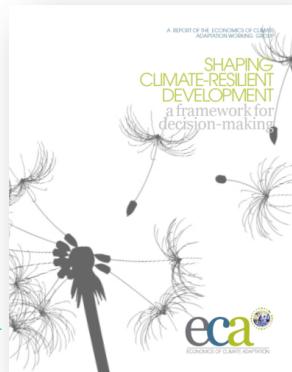
→ see the file climada\_workshop\_step\_by\_step.pdf for further instructions.

# A visual primer in MATLAB: climada\_demo



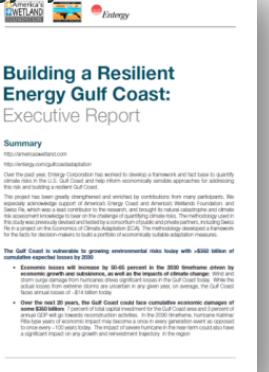
## *A global overview of ECA studies with a focus coastal*

**ECA full report featuring  
the first 8 case studies,  
164 pages**



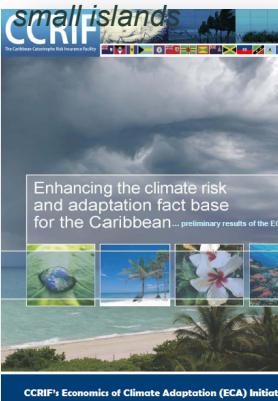
<http://media.swissre.com/documents/ECA+Brochure-EN.pdf>

## **US Gulf Coast:** *Hurricane risk to the energy system*



[http://media.swissre.com/documents/Entergy\\_study\\_exec\\_report\\_20101014.pdf](http://media.swissre.com/documents/Entergy_study_exec_report_20101014.pdf)

## **Caribbean:** *Hurricane risk to*



<http://media.swissre.com/documents/ECA+Brochure-final.pdf>

## **New York: Tropical cyclones and storm surge risk to a metropolis**



**New York: Tropical cyclones and storm surges risk to a metropolis**

Swiss Re  
in

Economics of Climate Adaptation (ECA) -  
Shaping climate-resilient development  
A framework for decision-making

"We must build a stronger, more resilient city – and this plan puts us in the path to do just that."

New York City Mayor,  
Michael Bloomberg

**Background**

**Hurricane Sandy**

Hurricane Sandy was the second costliest natural disaster in US history. New York City, Puerto Rico, and the US Virgin Islands were particularly hard hit. The total insured losses from Hurricane Sandy are estimated at \$50 billion. The insured losses in New York City alone are estimated at \$15 billion.

The insurance industry has been instrumental in helping to mitigate the damage caused by Hurricane Sandy. But does insurance work? What's the role of insurance in a climate-resilient future? How can insurance help to protect people and property? Further research – and the breadth of this discussion – are needed to answer these questions.

The ECA methodology provides decision-makers with the tools to answer these questions. It helps to identify the most effective adaptation measures to reduce climate change risk – and identify what to prioritize. By understanding the costs and benefits of different adaptation measures, decision-makers can provide a clear rationale for climate action.

**What is the impact of the insured cost?**

In the first step, we look at the location-specific and age-specific population, as identified by the US Census Bureau. This allows us to estimate the insured cost of a given location.

Using data on the probability distribution, we estimate the expected economic loss due to insured damage.

**What is the impact of the uninsured cost?**

Using data on the probability distribution, we estimate the expected economic loss due to uninsured damage.

**What is the impact of the insured and uninsured cost?**

Using data on the probability distribution, we estimate the expected economic loss due to insured and uninsured damage.

[http://media.swissre.com/documents/  
ECA\\_New\\_York\\_Gov\\_Factsheet.pdf](http://media.swissre.com/documents/ECA_New_York_Gov_Factsheet.pdf)

## **Hull, UK: Flood and storm risk to urban property**



**Hull, UK: Flood and storm risk to urban property**

**Economics of Climate Adaptation (ECA) – Shaping climate-resilient development A framework for decision-making**

Adaptation measures are available to make cities more resilient to the effects of climate change. But decision-makers need to take account of the costs to identify the most cost-effective investments.

**Climate adaptation can be approached at the individual and local levels, such as through resilience and disaster risk reduction measures, or at the national level, such as through international agreements like the Paris Agreement. What investments will be needed to protect our cities and the benefits**

The ECA methodology identifies adaptation measures that have the best chance of being effective. It identifies the relationship between climate change and the risk of flooding and storm damage. It also identifies the potential for adaptation measures to reduce the risk of flooding and storm damage. The ECA methodology is based on the following principles:

- Assess risks to urban property
- Identify adaptation policies that can reduce risk
- Calculate the economic value of adaptation
- Determine the cost-effectiveness of adaptation measures

**1. Introduction**  
The Economics of Climate Adaptation (ECA) is a methodology developed by the World Bank to help decision-makers understand the costs and benefits of climate adaptation measures. It is designed to help decision-makers make informed decisions about how to invest in climate adaptation measures to protect their cities from the effects of climate change.

**2. Methodology**  
The ECA methodology identifies adaptation measures that have the best chance of being effective. It identifies the relationship between climate change and the risk of flooding and storm damage. It also identifies the potential for adaptation measures to reduce the risk of flooding and storm damage. The ECA methodology is based on the following principles:

- Assess risks to urban property
- Identify adaptation policies that can reduce risk
- Calculate the economic value of adaptation
- Determine the cost-effectiveness of adaptation measures

**3. Results**  
The results of the ECA methodology are used to inform the development of climate adaptation policies. These policies can help decision-makers make informed decisions about how to invest in climate adaptation measures to protect their cities from the effects of climate change.

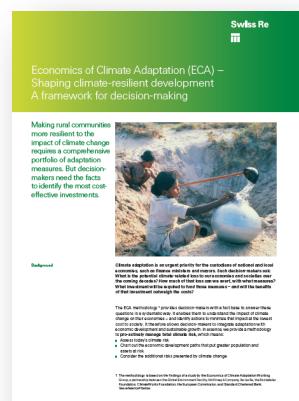
**4. Conclusion**  
The ECA methodology is a valuable tool for decision-makers who want to protect their cities from the effects of climate change. It helps them to understand the impact of climate change on their cities and to identify the most effective adaptation measures to reduce the risk of flooding and storm damage. By using the ECA methodology, decision-makers can make informed decisions about how to invest in climate adaptation measures to protect their cities from the effects of climate change.

## **China: Drought risk to agriculture**



[http://media.swissre.com/documents/rethinking\\_shaping\\_climate\\_resilient\\_development\\_en.pdf](http://media.swissre.com/documents/rethinking_shaping_climate_resilient_development_en.pdf)

## *India: Drought risk to agriculture*



<http://media.swissre.com/documents/>