



**A risk model for everyone: making extreme weather impact models accessible to decision-maker**

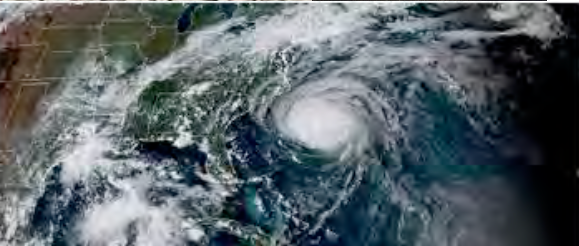
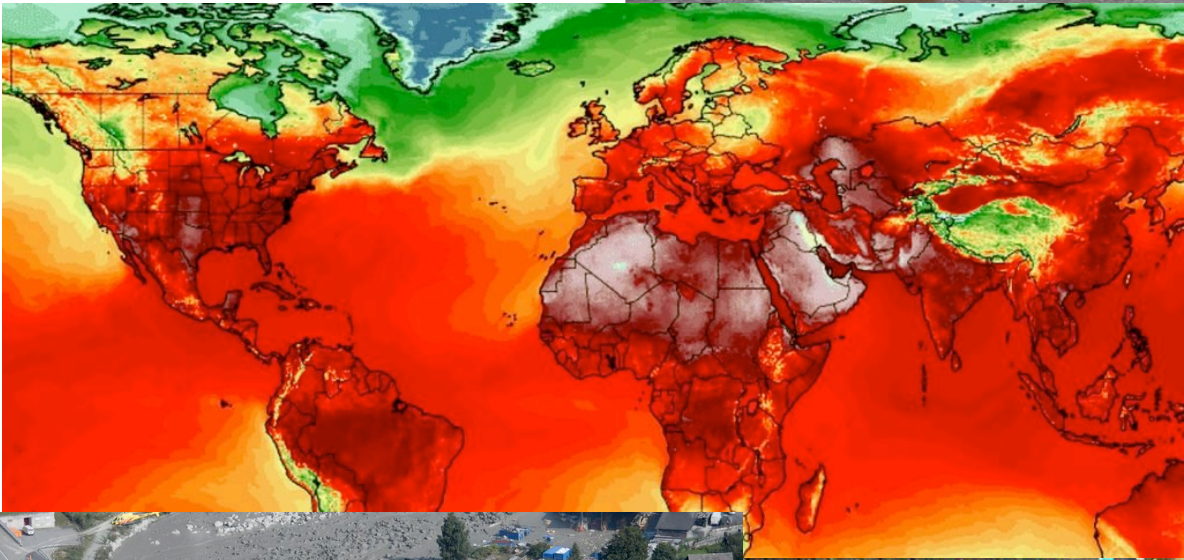
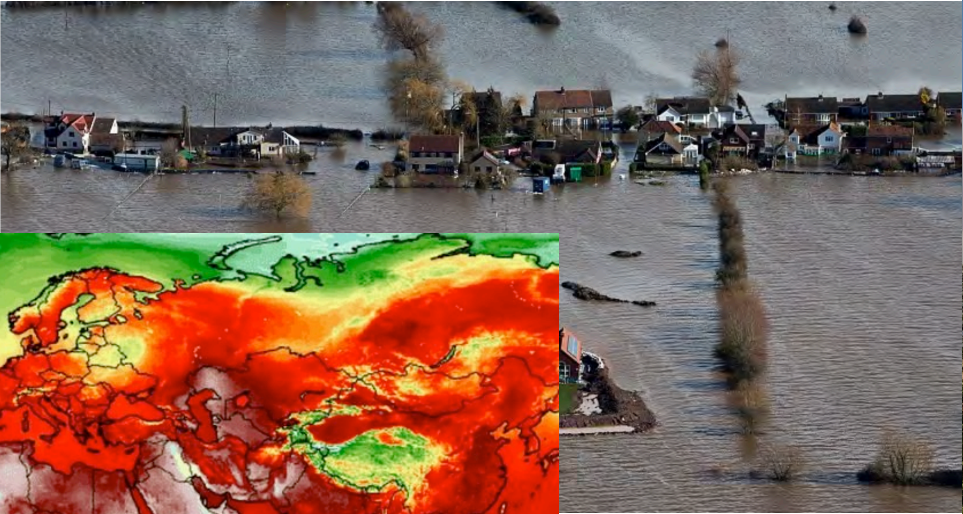
Cross-sectoral ISIMIP and PROCLIAS Workshop  
16-19 May 2022  
Chahan Kropf

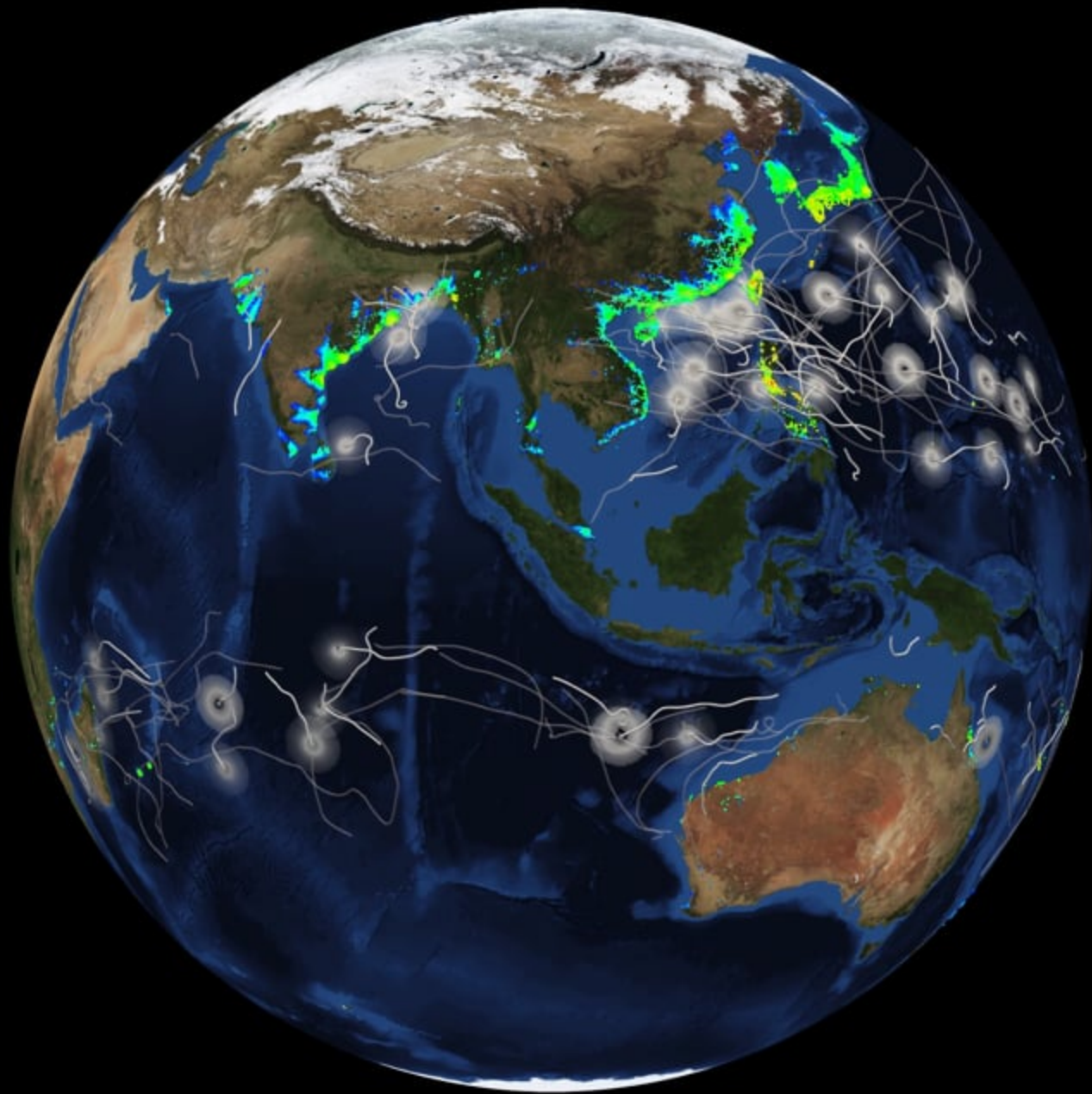
**CLIMADA - an open-source and -access  
global probabilistic risk modelling and  
adaptation economics platform**

Cross-sectoral ISIMIP and PROCLIAS Workshop  
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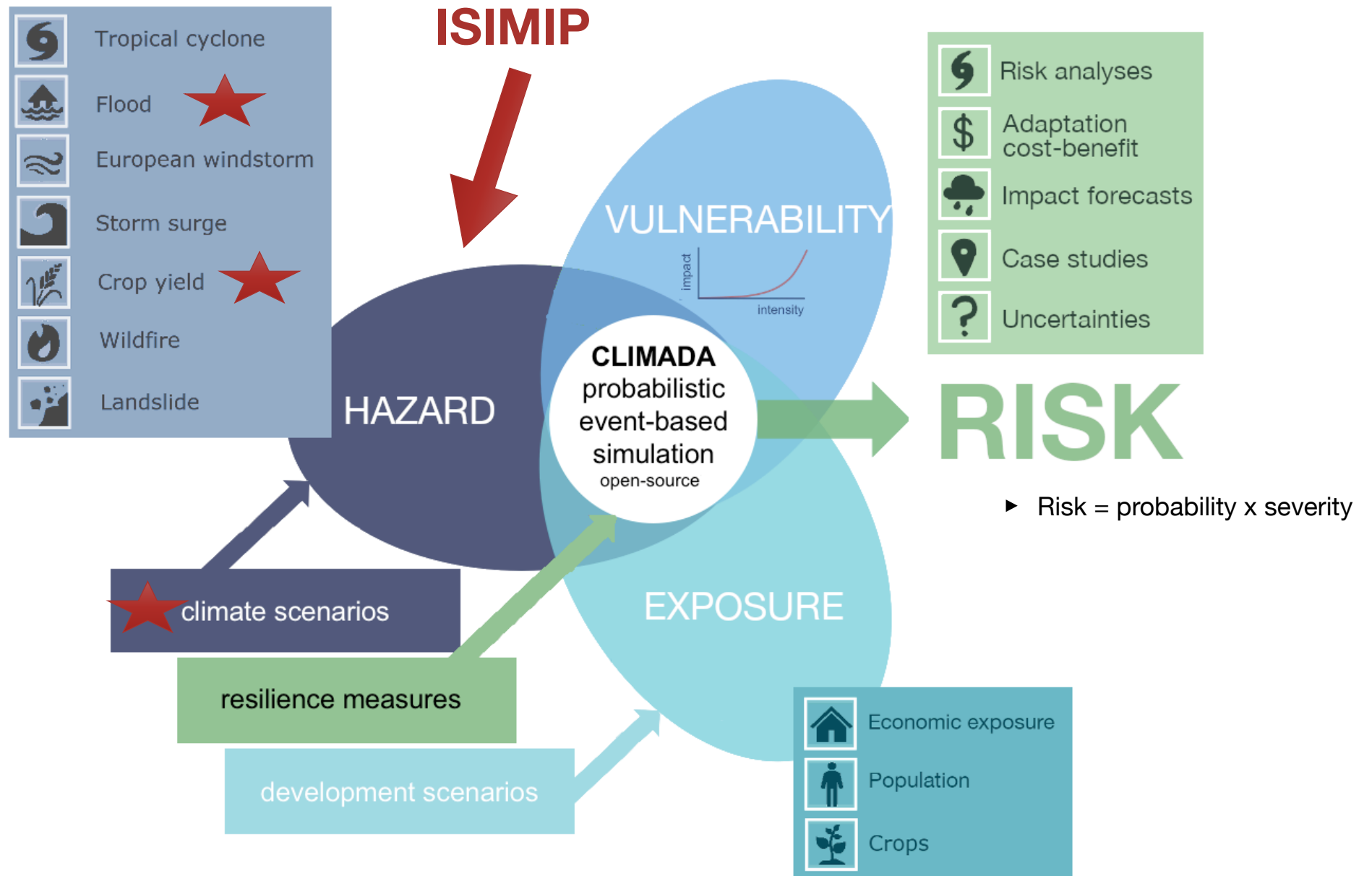


# Natural hazards



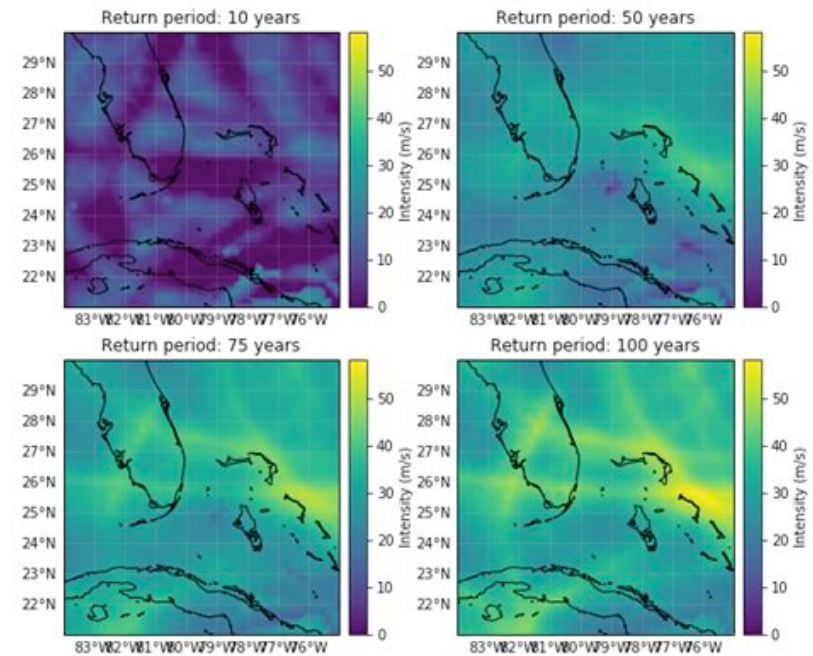
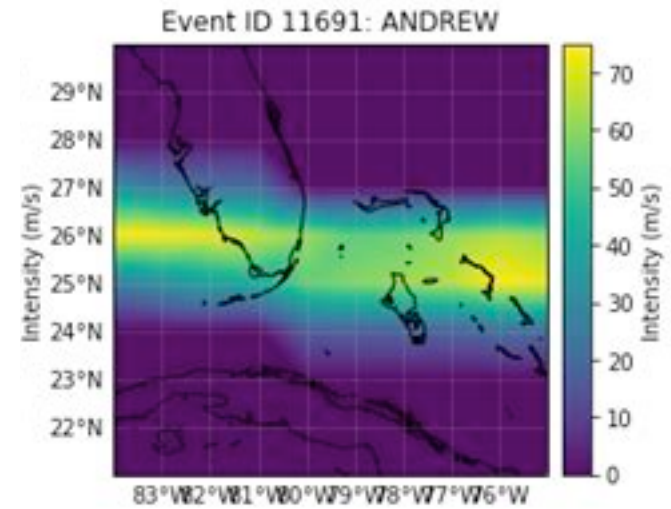
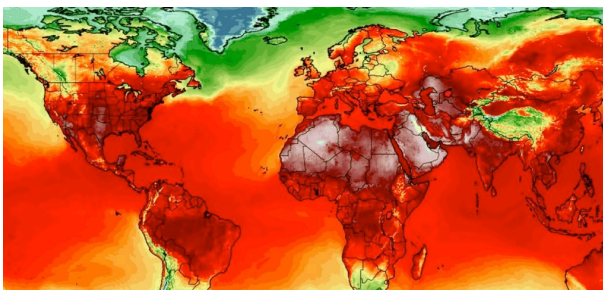


# CLIMADA v3.1.2



# Hazard

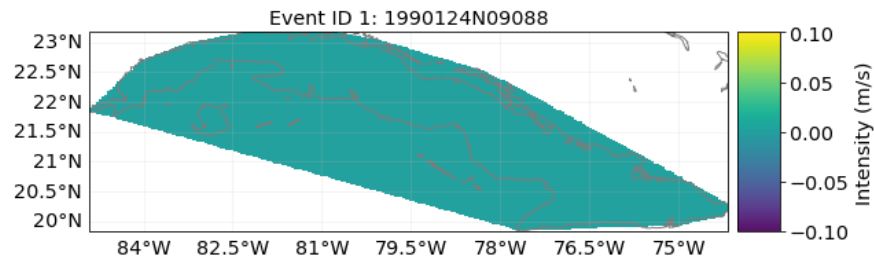
- Weather hazard events
  - ▶ Probability of event
  - ▶ Intensity at location



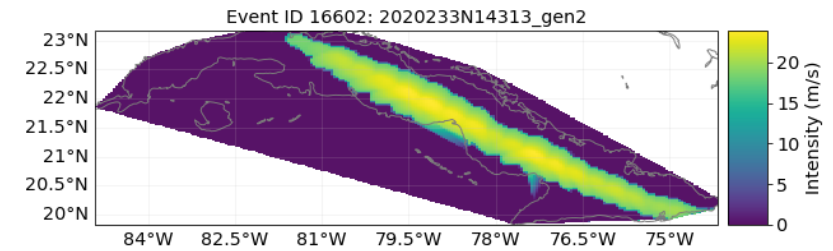
# Hazard

- Probabilistic ensemble
  - ▶ Physical modelling
  - ▶ Historical data + statistical modelling

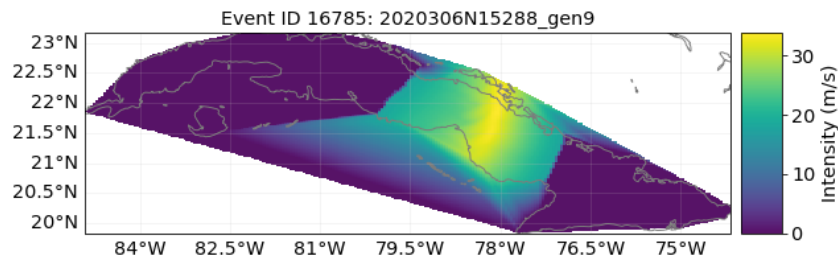
P = 1/2 Years



P = 1/10 Years

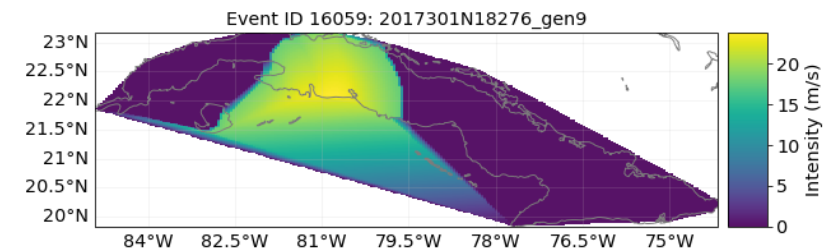


P = 1/10 Years



...

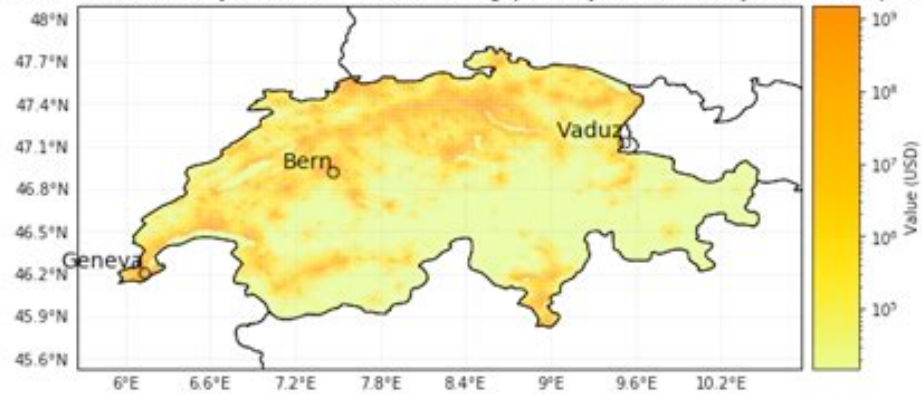
P = 1/12 Years



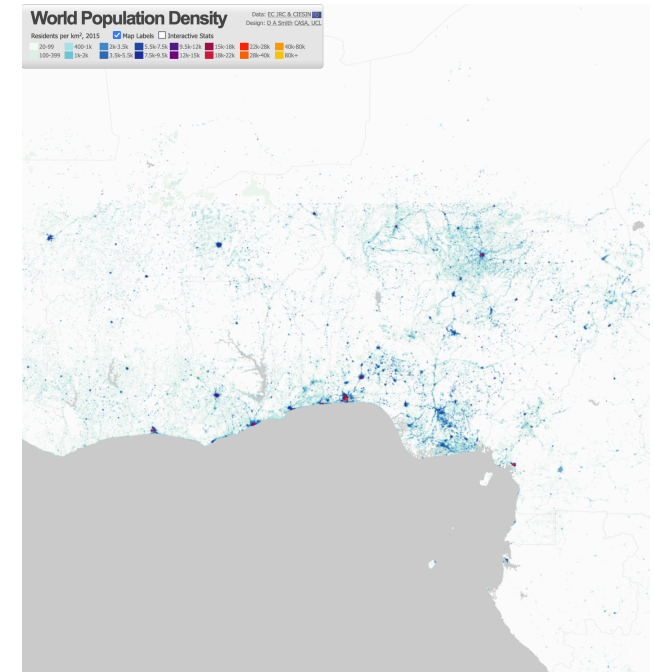
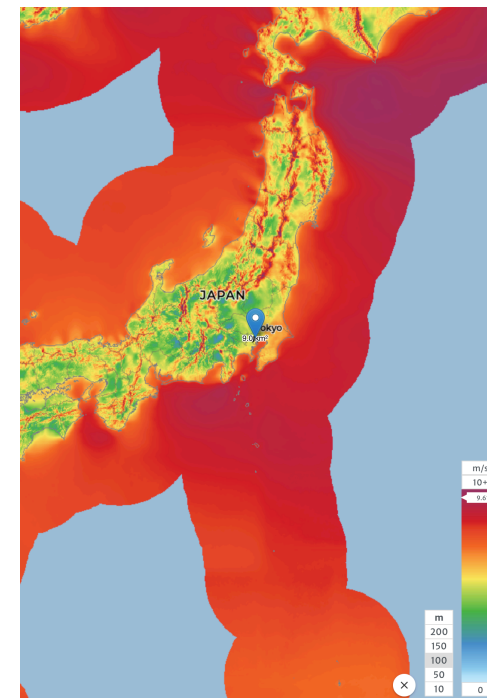
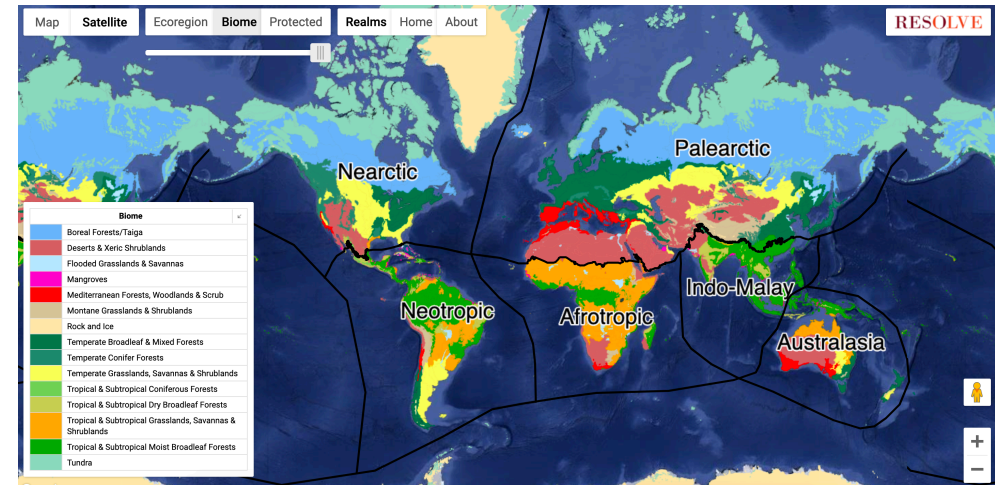
# Exposures

- Exposure - value at given place
  - Value at location

LitPop for Switzerland at 30 as, year=2016, financial mode=gdp, GPW-year=2015, BM-year=2016, exp=[1, 1]



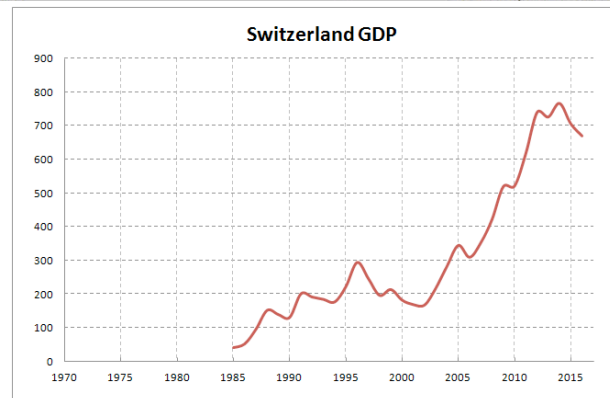
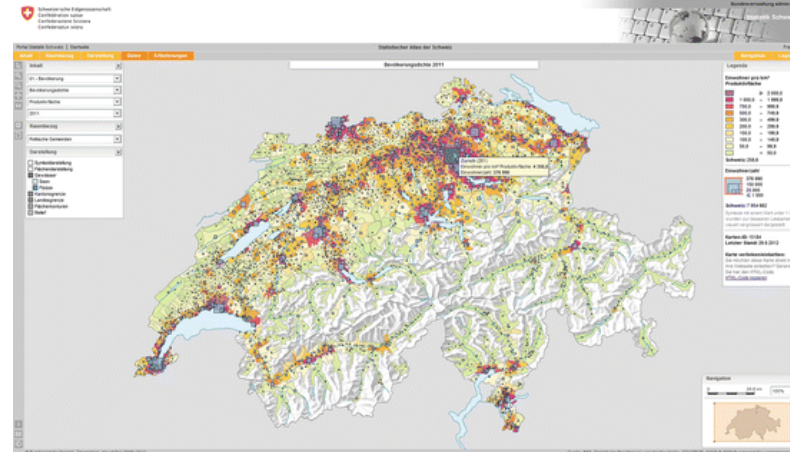
	value	geometry	latitude	longitude	region_id	impf_
0	183961.258736	POINT (8.54583 47.79583)	47.795833	8.545833	756	1
1	209830.757151	POINT (8.55417 47.79583)	47.795833	8.554167	756	1
2	176574.663650	POINT (8.56250 47.79583)	47.795833	8.562500	756	1
3	125076.058282	POINT (8.57083 47.79583)	47.795833	8.570833	756	1
4	56323.656151	POINT (8.57917 47.79583)	47.795833	8.579167	756	1



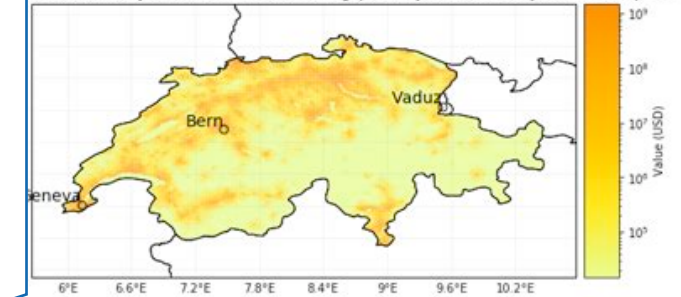


# Exposures

- LitPop
  - ▶ Nightlight images
  - ▶ Population census data
  - ▶ GDP

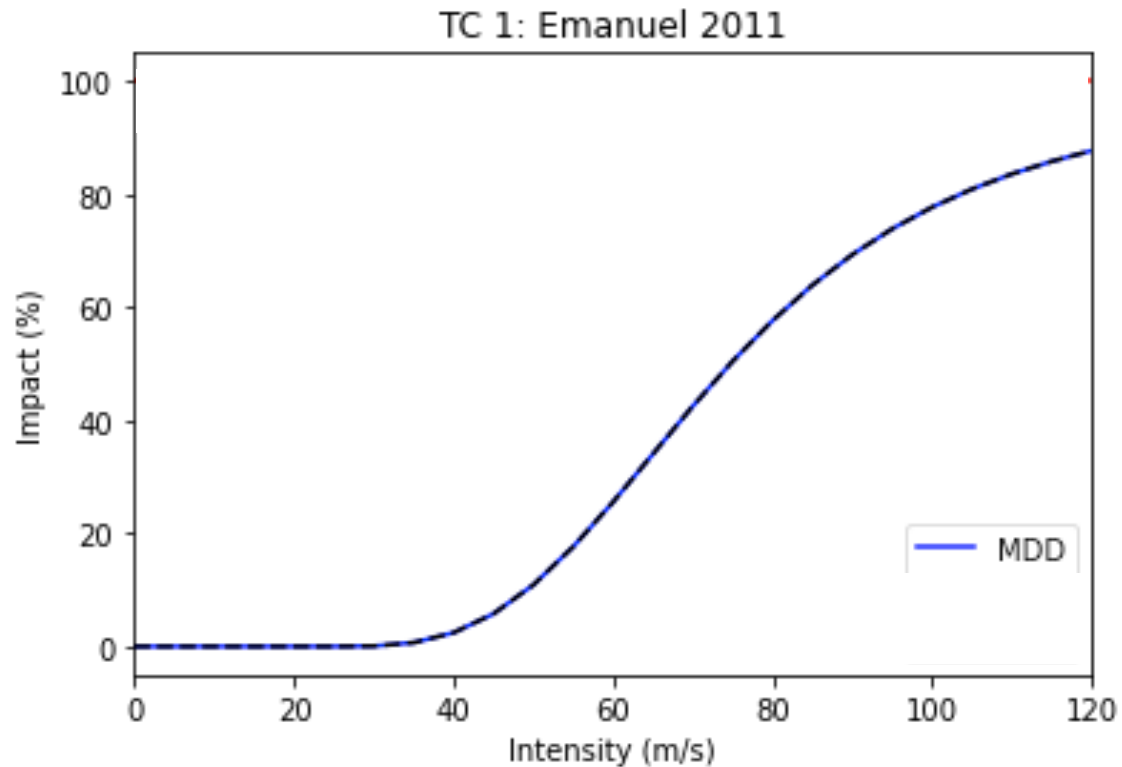


erland at 30 as, year=2016, financial mode=gdp, GPW-year=2015, BM-year=2016, exp=[1, 1]



# Impact function

- Vulnerability i.e., impact function
  - ▶ How is value changed at given intensity



- E.g.: Damage to property value, power-generated from wind-turbine, surface of forest affected

# Impact and risk in CLIMADA

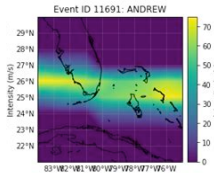
- Risk is the combination of the probability [or likelihood] of a consequence and its magnitude

- ▶ Risk = probability x impact

- Weather hazard events

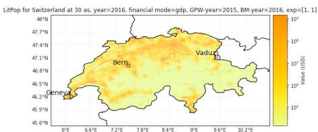
- ▶ Probability of event

- ▶ Intensity at location



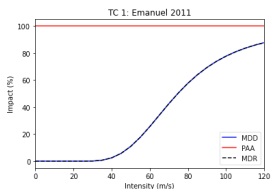
- Exposure - value at given place

- ▶ Value at location



- Vulnerability i.e., impact function

- ▶ How is value changed at given intensity



- Impact =  $\text{impf}(\text{intensity}) * \text{value}$

- Risk =  $\text{probability} * \text{impf}(\text{intensity}) * \text{value}$



# Core impact computation

- Exposures value at given location :  $E(x)$
- Intensity of hazard event epsilon at modelled location  $\tilde{x}$  closest to  $x$  :  $h_\epsilon(\tilde{x})$
- Frequency (probability) of event :  $\nu_\epsilon$
- Impact function of exposures at location  $x$  :  $f(E(x)) = f_x$
- Impact matrix:

$$I_{\epsilon,x} = f_x(h_\epsilon(\tilde{x}))E(x)$$

# Impact and risk metrics

- Impact at event

$$I_{\epsilon} = \sum_x I_{\epsilon,x}$$

- Expected average impact at exposures

$$\bar{I}_x = \sum_{\epsilon} I_{\epsilon,x} \nu_{\epsilon}$$

- Average impact over all exposures and all events (total annual expected risk)

$$\bar{R} = \sum_{\epsilon,x} I_{\epsilon,x} \cdot \nu_{\epsilon}$$

# CLIMADA summary

- CLIMADA is a **framework** NOT a model.
- **Scale** all: Worldwide, Country, Region, City
- Extreme events (**probabilistic** or single events)
- Now or Near-future casting (e.g., risk warnings), **Current and future risk** (e.g. Socio-economic development + Climate change), Adaptation option
- **Exposures**: People, Ecosystems, Assets, Economic supply chains, Critical infrastructure, ...
- **Hazards**: Tropical cyclones, Winter storms, Wildfires, Flood, Drought, Heatwaves
- **API**: data obtainable directly - Worldwide consistent at 4x4km
- Open-source and open-access **Python platform**.
- **Uncertainty**: uncertainty and sensitivity analysis
- Various **output metrics** (e.g. return period curves, risk transfer, average impact, ...)
- **Applications**: Risk assessment, adaptation option appraisal, story lines ,...
- Support for **decision**-making

# Economics of Climate Adaptation



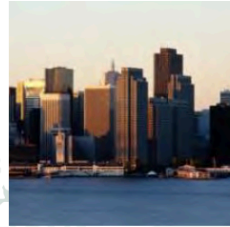
More than twenty adaptation case studies worldwide<sup>1</sup>:  
 Many hazards, economic sectors and risk cultures



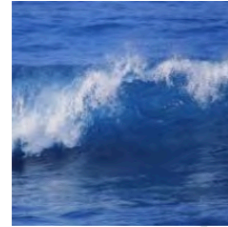
**Florida:** Hurricane risk to public and private assets



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



**New York:** Cyclones and surge risk to a metropolis



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

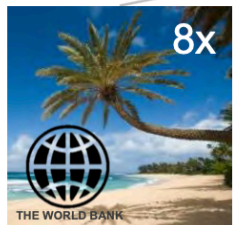


**China:** Drought risk to agriculture

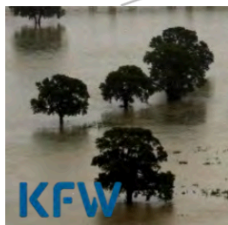


**Bangladesh:** Flood risk to a fast-developing city

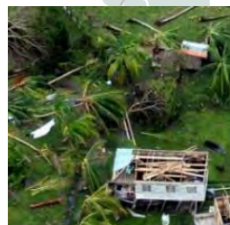
→ <http://www.wcr.ethz.ch/research/casestudies.html>



**Caribbean:** Hurricane risk to small islands



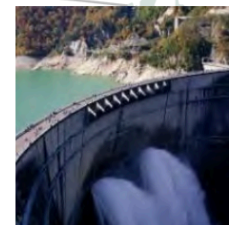
**El Salvador:** Flood and landslide risk to vulnerable people



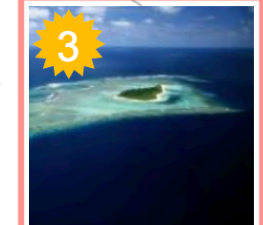
**Guyana:** Flash flood risk to a developing urban area



**Mali:** Risk of climate zone shift to agriculture



**Tanzania:** Drought risk to health and power generation



**Samoa:** Risk of sea level rise to a small island state



**India:** Drought risk to agriculture



Economics of Climate Adaptation (ECA) Working Group, a partnership between the Global Environment Facility, McKinsey & Company, Swiss Re, the Rockefeller Foundation, ClimateWorks Foundation, the European Commission, and Standard Chartered Bank. Later studies powered by open-source model CLIMADA

<sup>1</sup> ECA working group, supported by CCRIF/WorldBank, see: <http://www.wcr.ethz.ch/research/casestudies.html>

# Many users and partners (logo style & size arbitrary, non-exhaustive)



Eidgenössische Technische Hochschule Zürich  
Swiss Federal Institute of Technology Zurich



Federal Department of Home Affairs FDHA  
Federal Office of Meteorology and Climatology  
MeteoSwiss



UNIVERSITÄT  
BERN



THE WORLD BANK



"La Ciencia sin Moral es Vana"



POTSDAM-INSTITUT FÜR  
KLIMAFOLGENFORSCHUNG



InsuResilience  
Solutions Fund

United Nations University



THE GLOBAL GOALS  
For Sustainable Development





# Up-coming talks

- Case study
- Uncertainty
- Forecasting
- WildFire
- Heat-mortality
- Multi-hazard

# Selected CLIMADA publications

- Aznar-Siguan, G. and Bresch, D. N.: CLIMADA v1: a global weather and climate risk assessment platform, 12, 3085–3097, <https://doi.org/10.5194/gmd-12-3085-2019>, 2019.
- Bresch, D. N. and Aznar-Siguan, G.: CLIMADA v1.4.1: towards a globally consistent adaptation options appraisal tool, 14, 351–363, <https://doi.org/10.5194/gmd-14-351-2021>, 2021.
- Eberenz, S., Stocker, D., Rösli, T., and Bresch, D. N.: Asset exposure data for global physical risk assessment, 12, 817–833, <https://doi.org/10.5194/essd-12-817-2020>, 2020.
- Eberenz, S., Lüthi, S., and Bresch, D. N.: Regional tropical cyclone impact functions for globally consistent risk assessments, 21, 393–415, <https://doi.org/10.5194/nhess-21-393-2021>, 2021.
- Kropf, C. M., Ciullo, A., Otth, L., Meiler, S., Rana, A., Schmid, E., McCaughey, J. W., and Bresch, D. N.: Uncertainty and sensitivity analysis for probabilistic weather and climate risk modelling: an implementation in CLIMADA v.3.1., 2022.
- Lüthi, S., Aznar-Siguan, G., Fairless, C., and Bresch, D. N.: Globally consistent assessment of economic impacts of wildfires in CLIMADA v2.2, 14, 7175–7187, <https://doi.org/10.5194/gmd-14-7175-2021>, 2021.
- Kropf, C. M., Ciullo, A., Otth, L., Meiler, S., Rana, A., Schmid, E., McCaughey, J. W., and Bresch, D. N.: Uncertainty and sensitivity analysis for probabilistic weather and climate risk modelling: an implementation in CLIMADA v.3.1.0, 1–32, <https://doi.org/10.5194/gmd-2021-437>, 2022.

**Thank you!**