



POTSDAM INSTITUTE FOR  
CLIMATE IMPACT RESEARCH



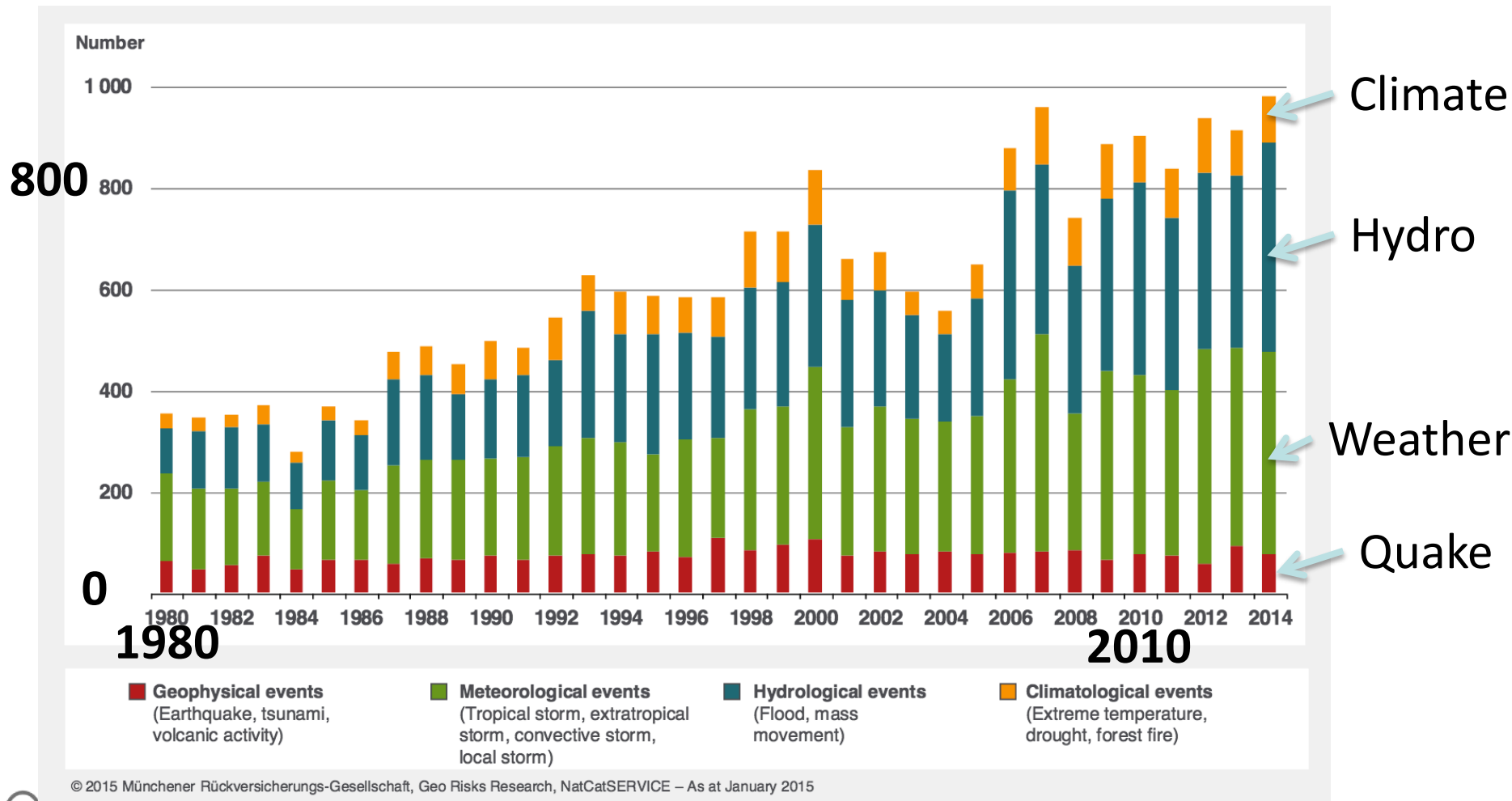
# **Deriving empirically based damage functions for integrated assessment models**

**Tobias Geiger and Katja Frieler**

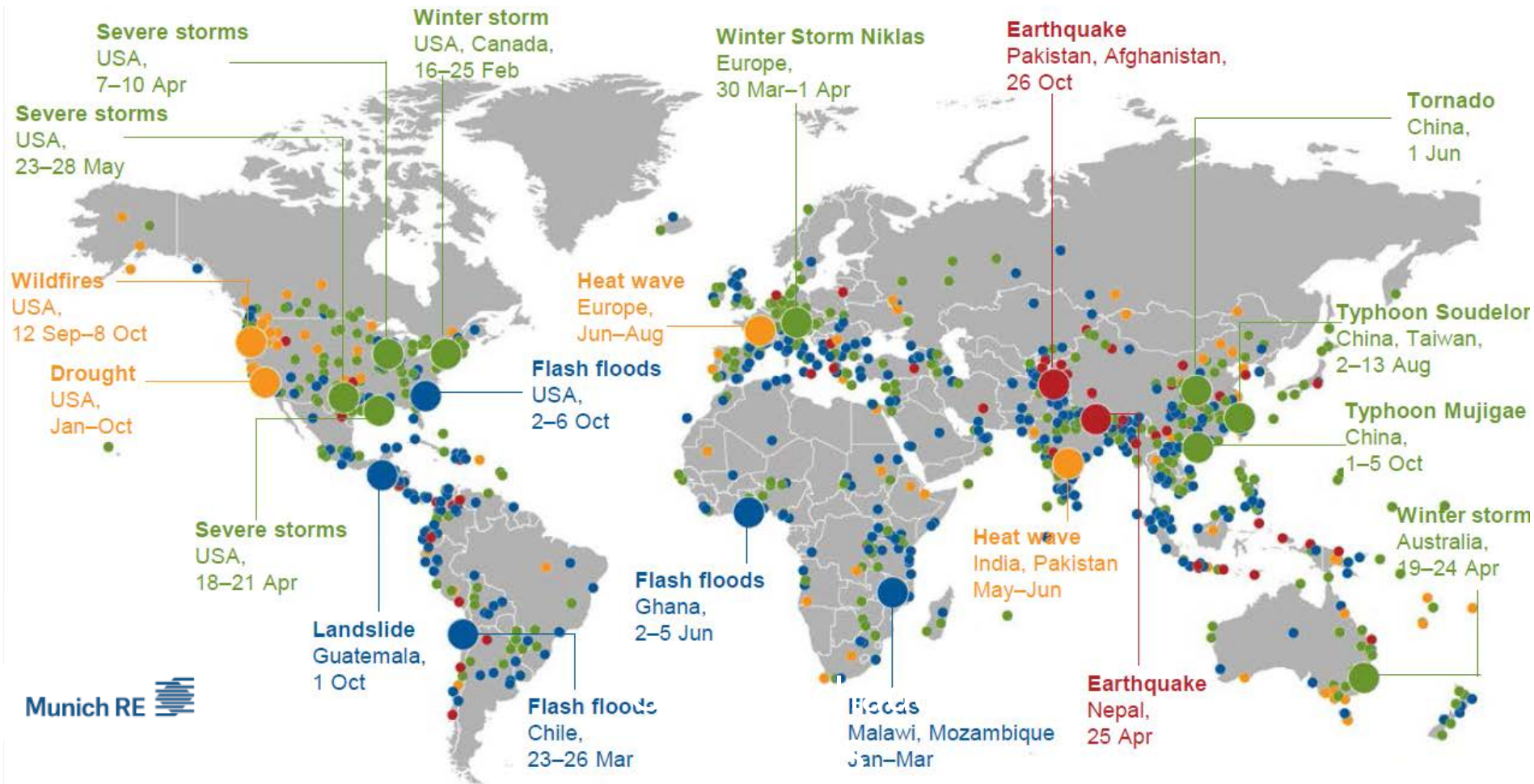
**Potsdam Institute for Climate Impacts Research**

**20 June 2016**

# Extreme events are rising



# Natural disasters 2015



● **Geophysical events**  
(Earthquake, tsunami, volcanic activity)

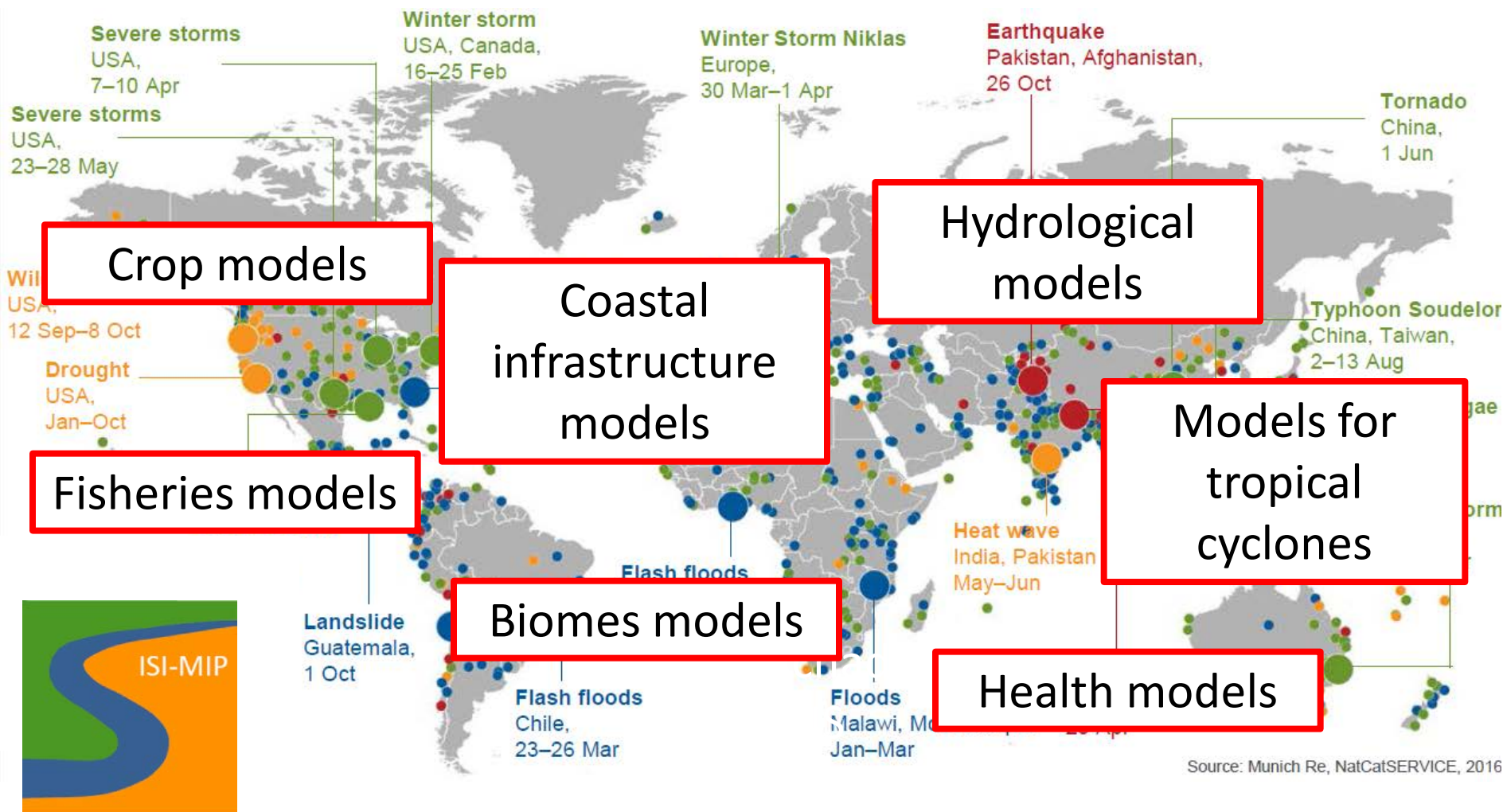
● **Hydrological events**  
(Flood, mass movement)

● **Meteorological events**  
(Tropical storm, extratropical storm, convective storm, local storm)

● **Climatological events**  
(Extreme temperature, drought, wildfire)

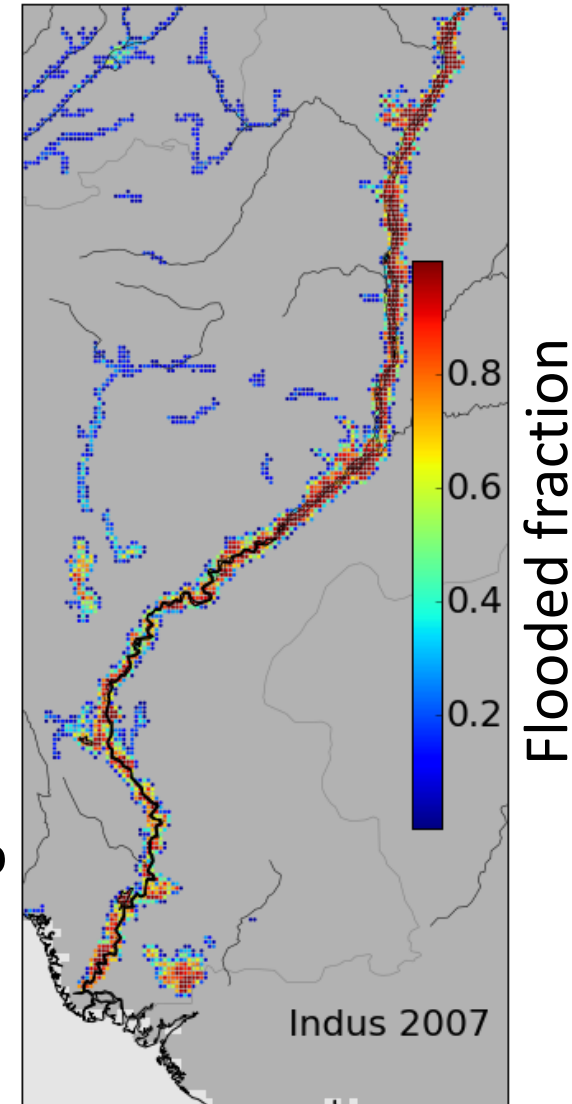
Average annual weather losses 100 billion \$US

# Extreme events in a 2°C-world?



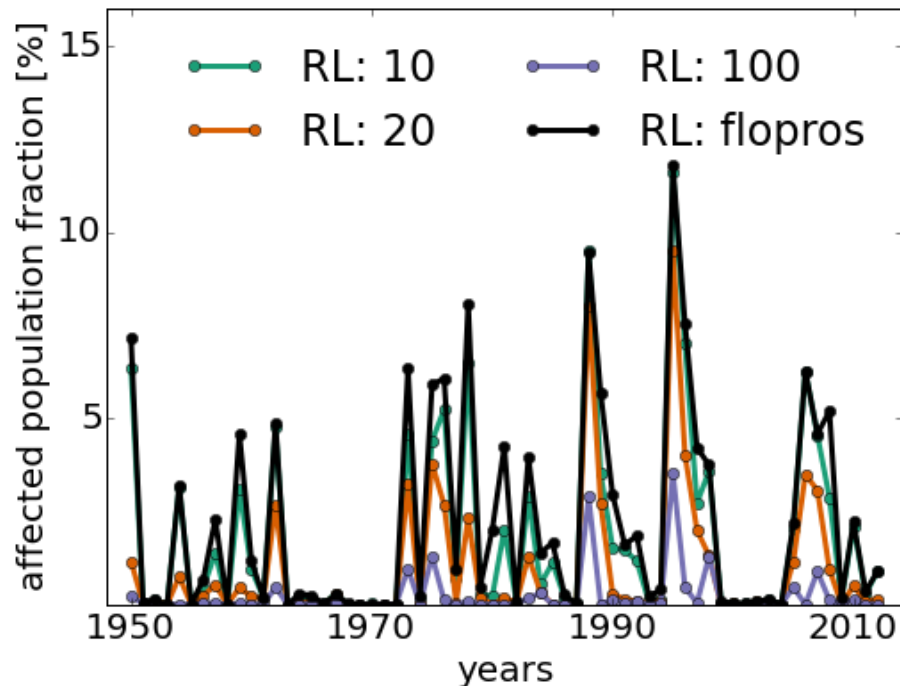
# Global river flood modeling

- **Daily Run-off simulation by 10 models from ISI-MIP**
  - 1970-2012 driven by observed weather
  - present-2100 driven by 5 GCMs, all RCPs
- **Floodplain flow scheme -> CaMaFlood [1]**
  - Gridded flood protection FLOPROS [2]
  - Inundation areas & depth @ 0.01° resolution
- **Validation in progress!**

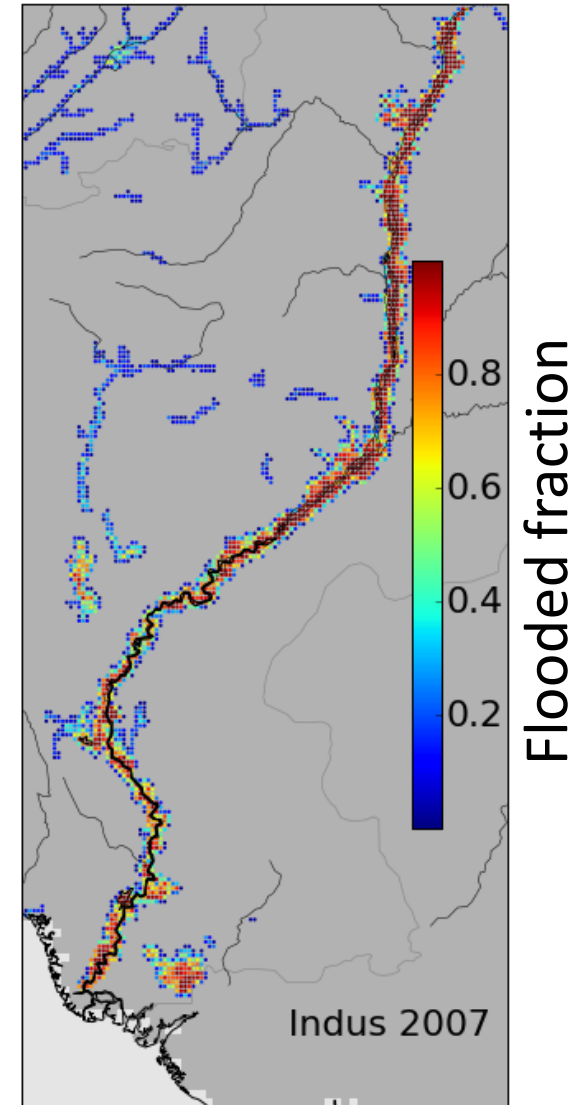


# Global river flood impacts

- Exposed people (e.g. Pakistan)



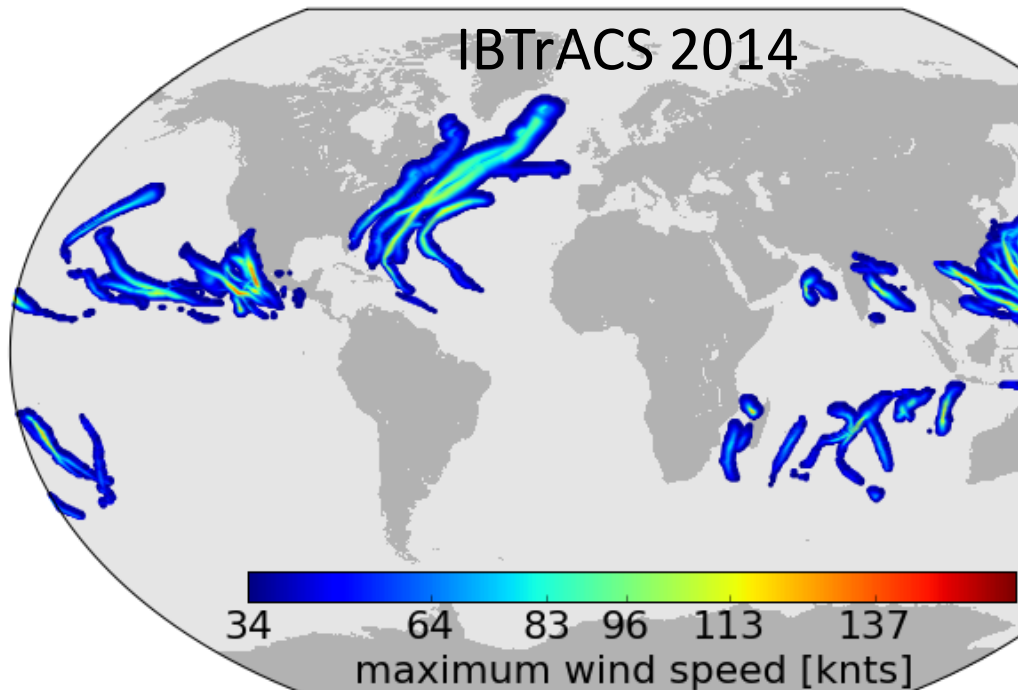
- Stock losses
  - Damage functions by Juan Carlos [1]



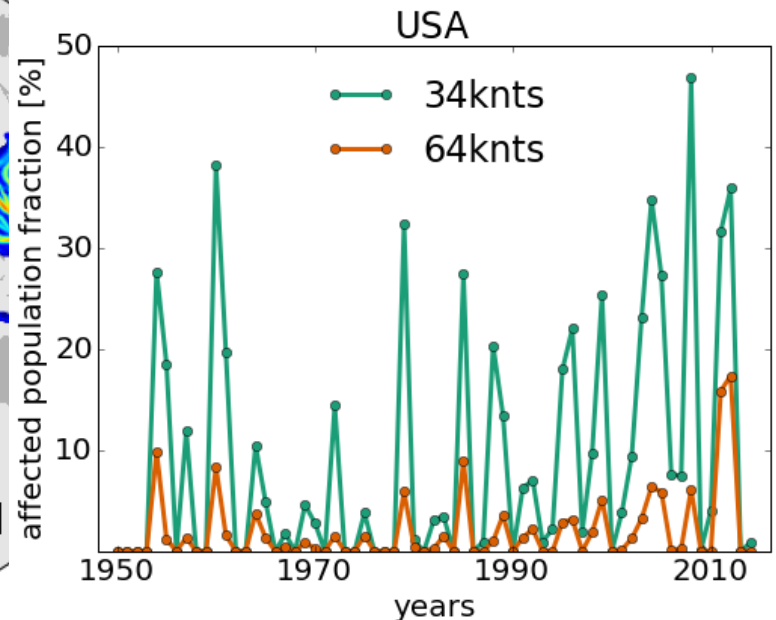


# Global tropical cyclone impacts

- Global best track archive IBTrACS
- 540k cyclone tracks from dynamical downscaling [1]
  - 6 GCMs: 1950-2005 & 2006-2100 (RCP 8.5)
- TC extension via wind field model [2]



## Exposed people: USA



# Tropical cyclone impacts for USA

$$Loss = \alpha \times f_1(Hazard) \times f_2(Socio - Econ.)$$



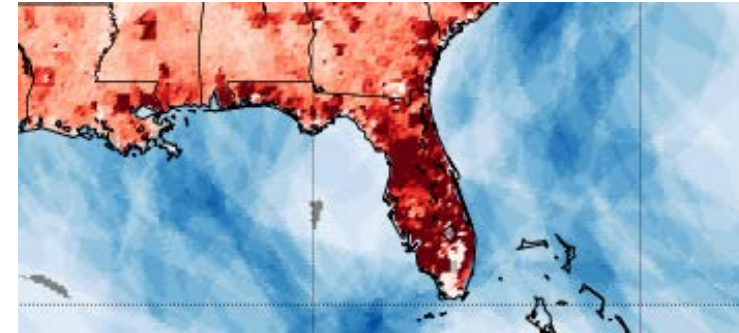
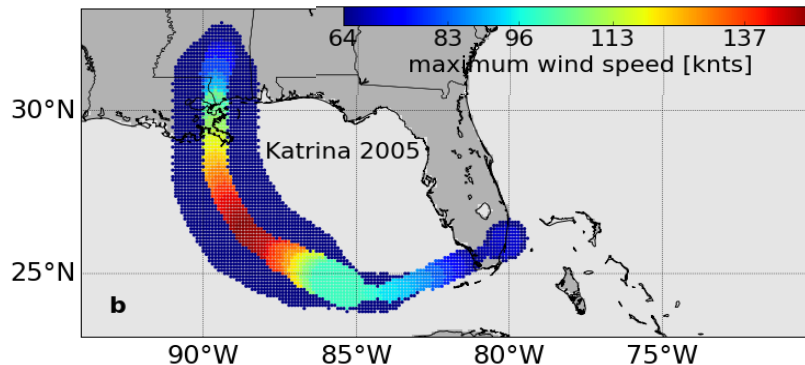
**Empirical losses**  
e.g. Munich Re



**Wind-speed /  
Storm size**



**GDP per capita /  
Population**





# Different socio-economic scaling of losses

$$Loss \propto GDP^{\beta_{GDP}} \times f_1(v_{wind})$$

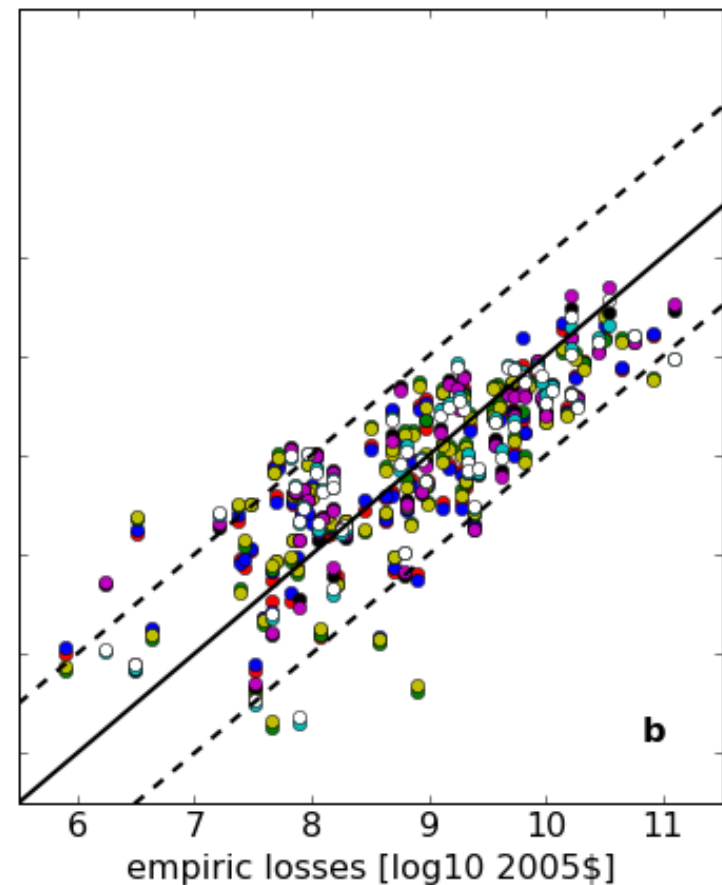
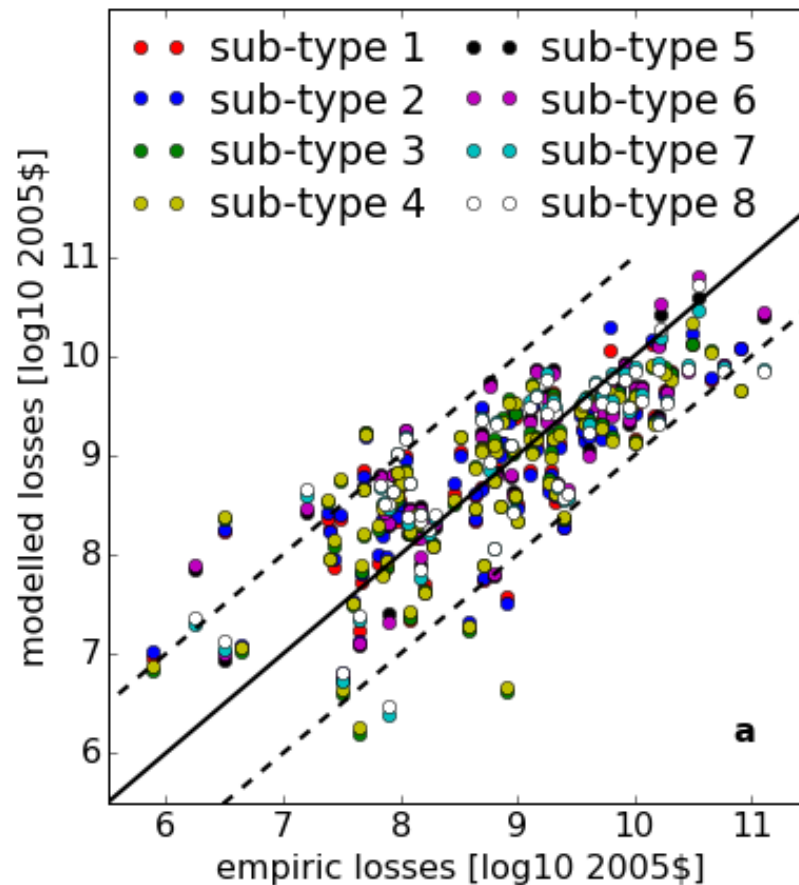
	8 model-mean	8 model-median	8 model-range	
$\beta_{GDP}$	0.50	0.57	0.20 - 0.67	< 1
$\beta_{GDPpc}$	2.29	2.26	1.48 - 3.13	> 1
$\beta_{Pop}$	0.41	0.47	0.12 - 0.59	< 1

$$Loss \propto GDPpc^{\beta_{GDPpc}} \times Pop^{\beta_{Pop}} \times f_1(v_{wind})$$

# Skill of damage function ensemble

**GDP only**

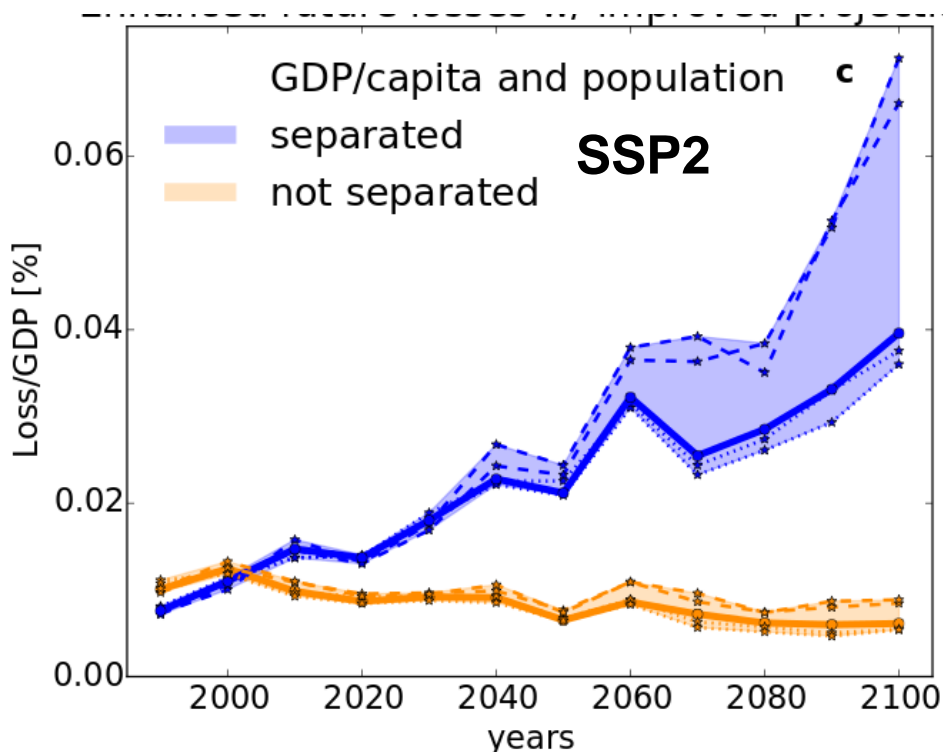
**GDP per capita / Population**



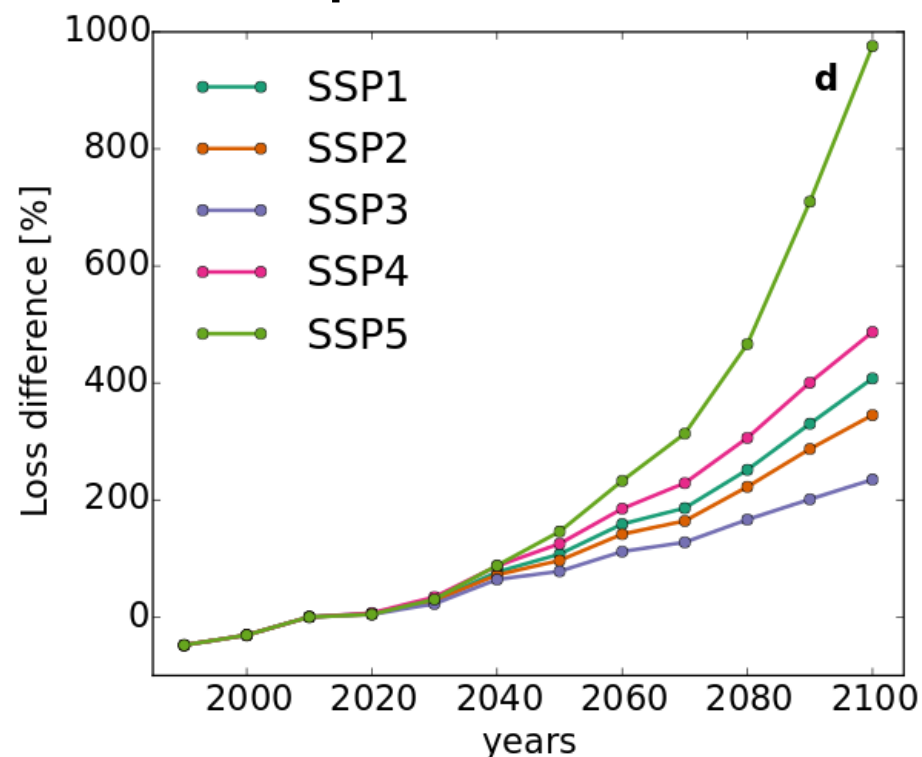
# Projecting future losses for USA

- Simulated TC tracks (Emanuel, 2013)
- Socio-economic vulnerability becomes strongest loss driver!

Loss/storm as median over 8 models & 6 GCMs



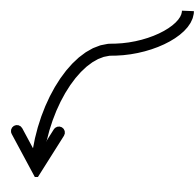
Loss difference for different development scenarios



# From impacts to economic models

We have  
climate change impacts:

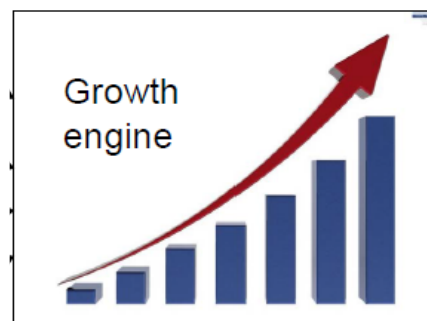
- Exposed population
- Stock damage



spatio-  
temporal  
aggregation



We have  
economic growth models:



Climate  
damage

$\alpha$

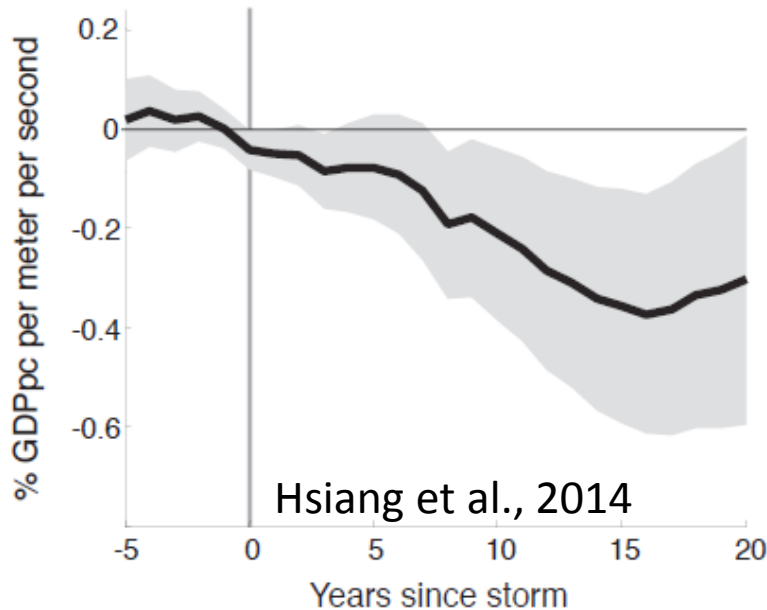
Output (Y)  
(food,  
consumption,  
health)

$(1-\alpha)Y$

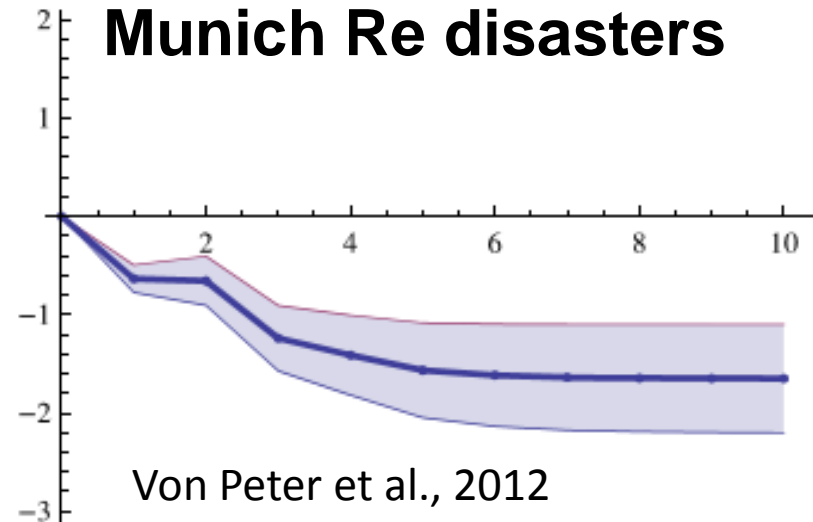
How will the output then change?

# Extreme impacts have long-term effects

## Growth impact of TCs



## Growth impact of all Munich Re disasters



**Effect depends on disaster type, resolution, and methodology**

See also Felbermayer et al (2013), Strobl (2008), and others

# Long term growth effects across impacts

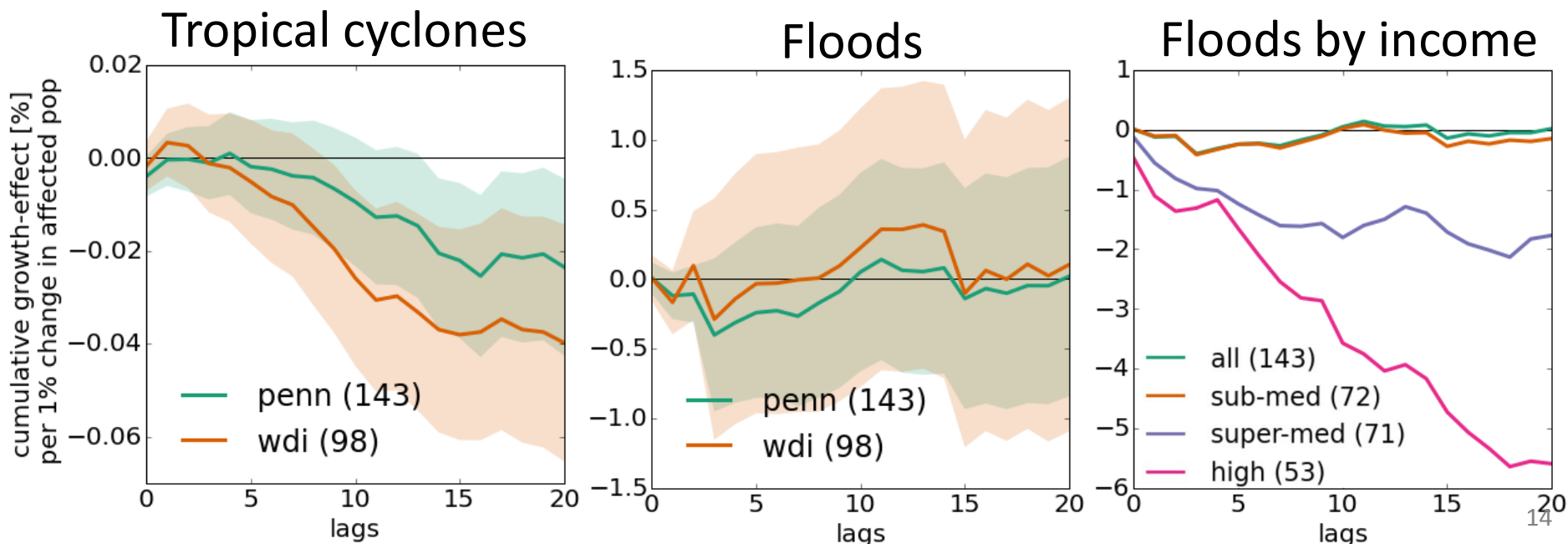
- Unified predictor across impacts: Exposed population

$$\Delta GDP_{i,t} = \sum_{L=0}^k [\beta_L \times D_{i,t-L}] + C_{i,t} + \varepsilon_{i,t}$$

lags

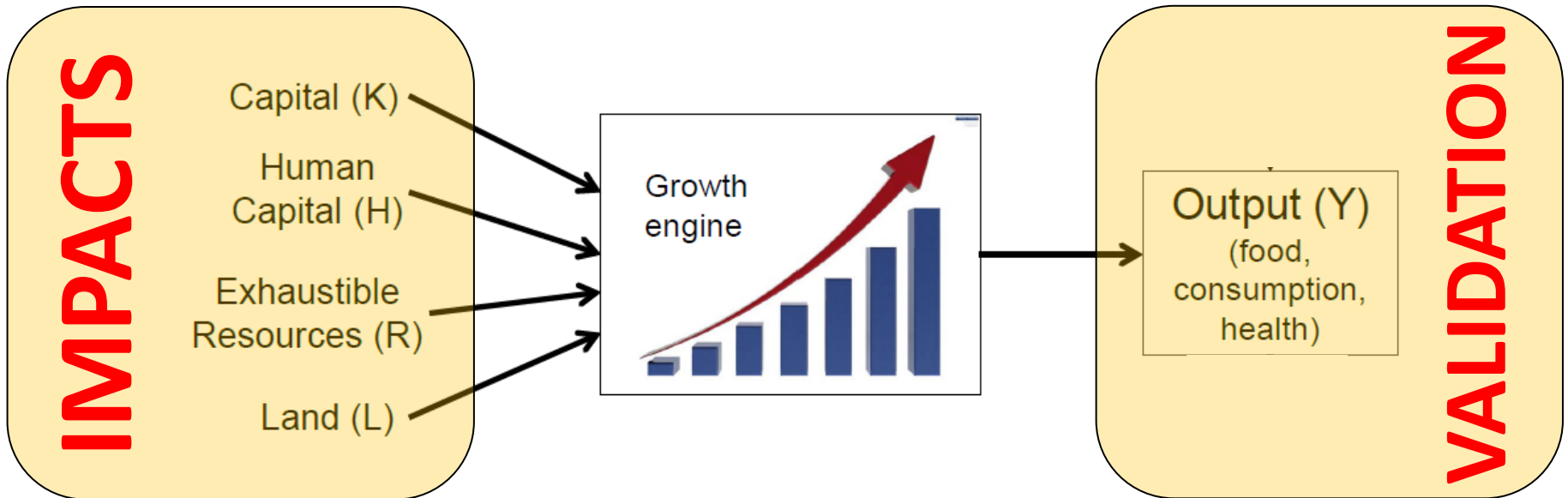
various controls

exposed population





# Will economic models be able to reproduce the observed long-term growth reduction?



# Thank you!