

# Do heat prevention plans reduce heat-related mortality in Europe?

Aleš Urban, Veronika Huber  
Salomé Henry, Nuria Pilar Plaza,  
Pierre Masselot, Antonio Gasparrini  
PROCLIAS TG 3.1 + MCC

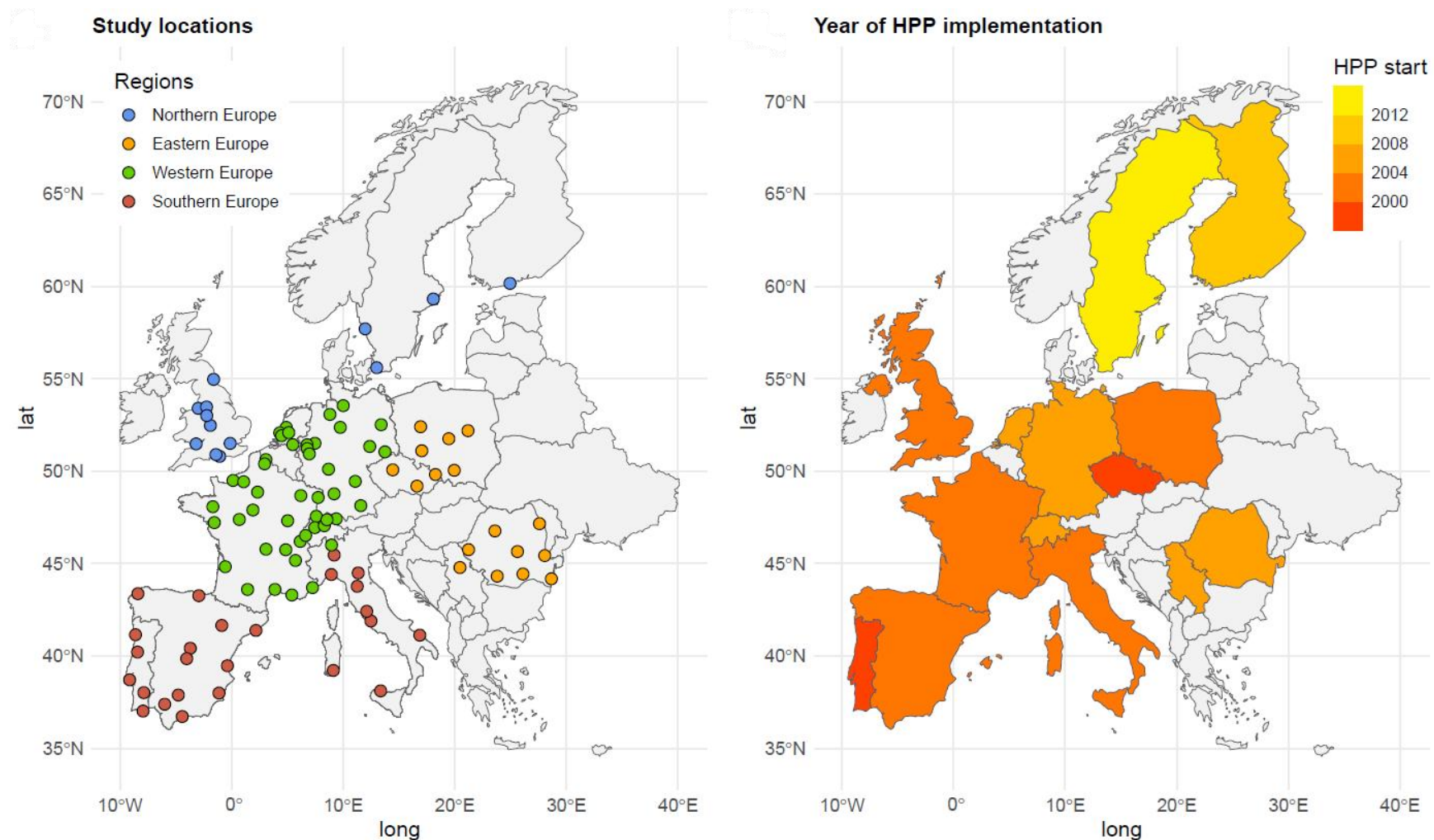


MCC Collaborative Research Network  
An international research program on the associations  
between environmental stressors, climate, and health



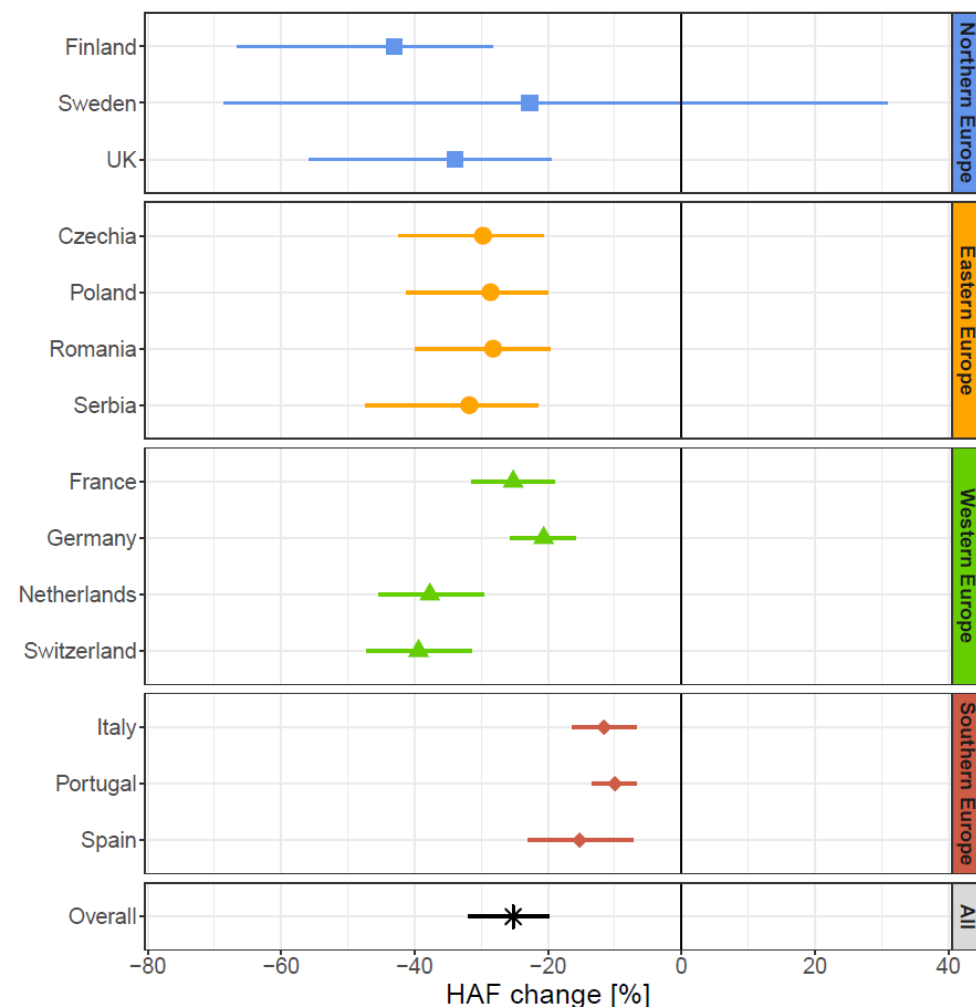
# Health, Weather and HPPs: 102 cities, 14 EU countries

Study period: 1990–2019



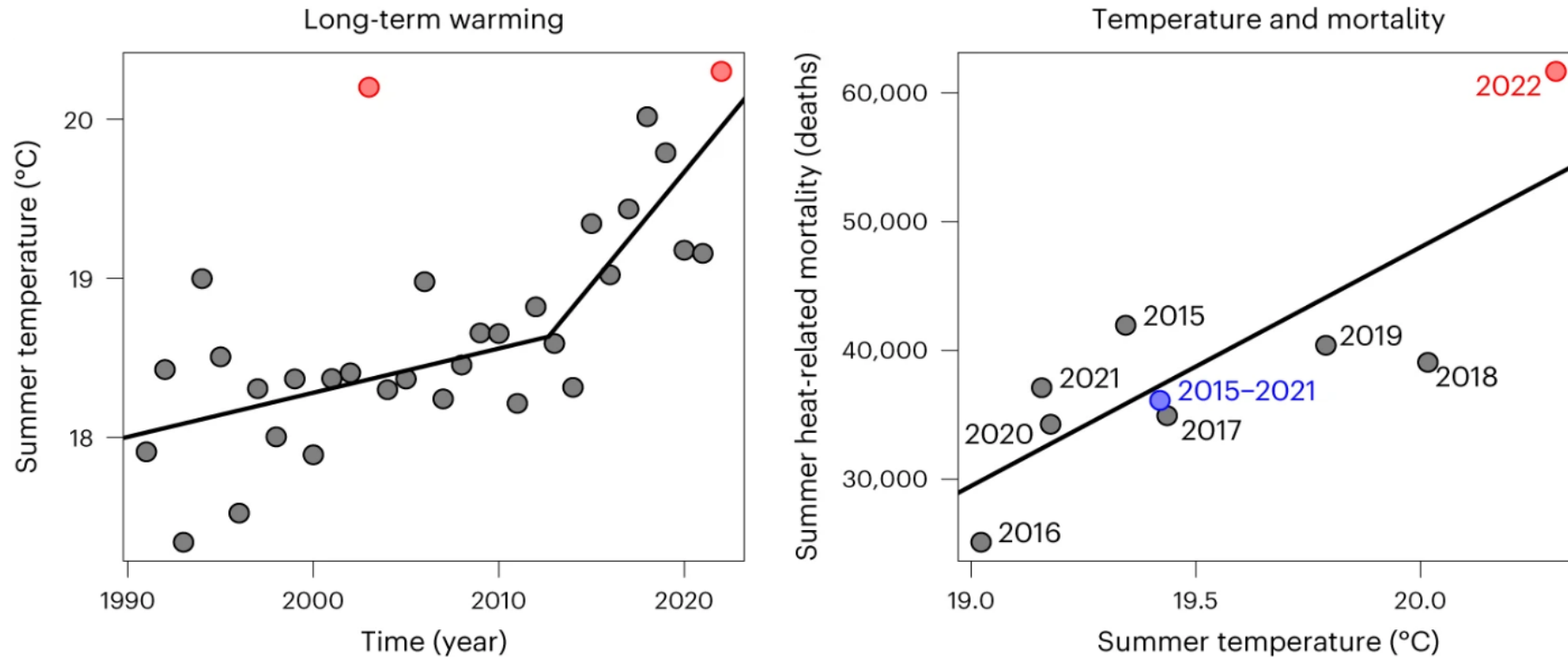
# Results

- **HPP implementation was associated with a 25.2% reduction in excess deaths** attributable to extreme heat.
- Correspond to **14,551 total deaths avoided across all study locations.**
- No significant differences in HPP effectiveness were observed by European region or HPP class.
- Further research on the effectiveness of specific adaptation measures is needed.



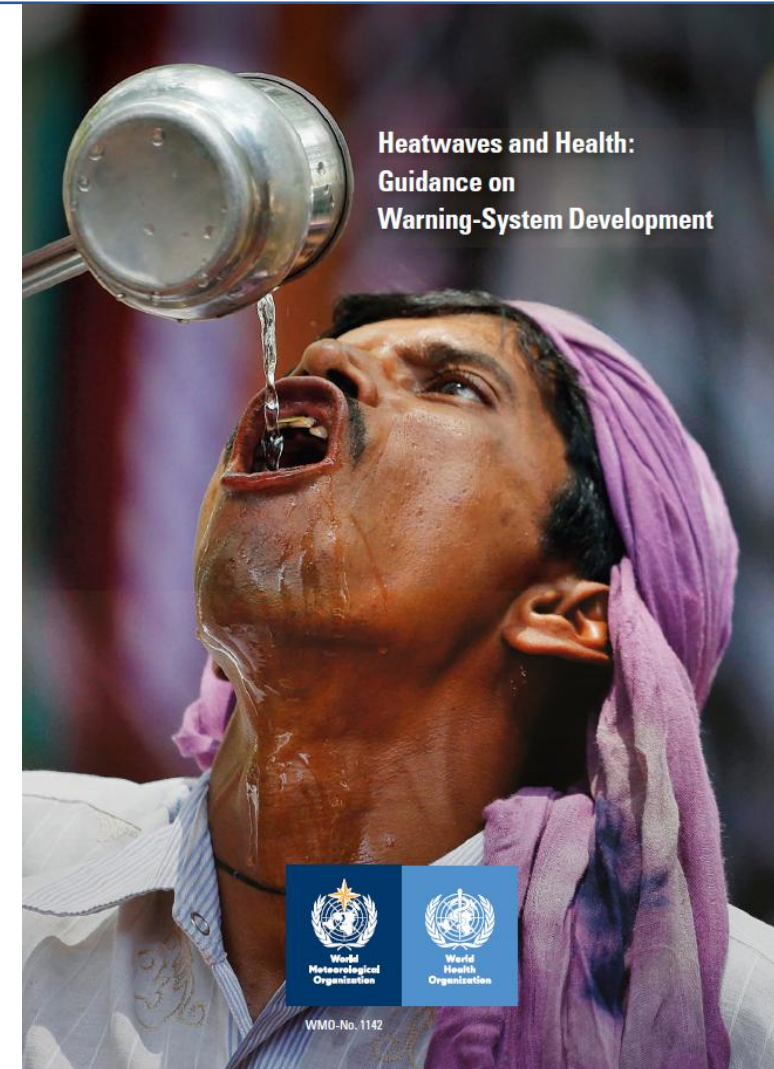
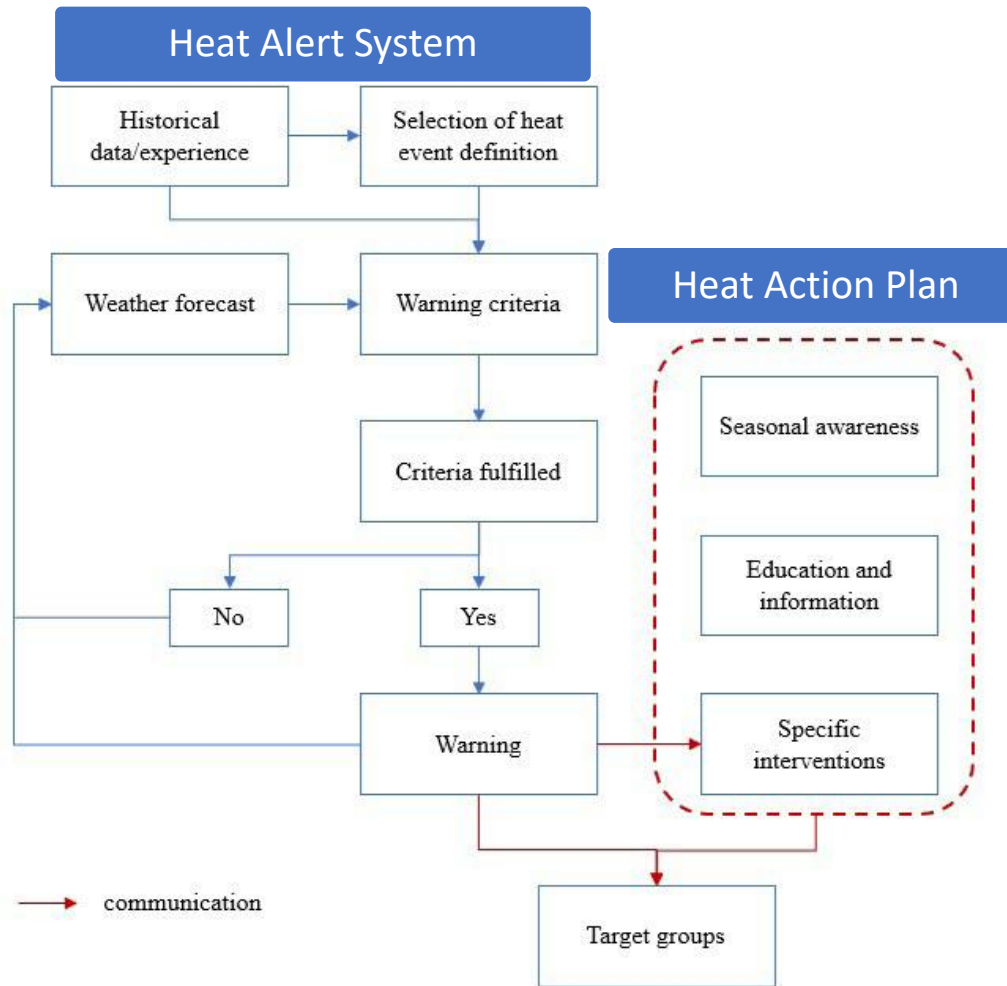
**25% heat-related death reduction attributable to HPPs**

# Motivation



- How can we avoid the increasing impact of heat on human health in Europe?

# Heat prevention plans (HPPs)



# Previous evidence

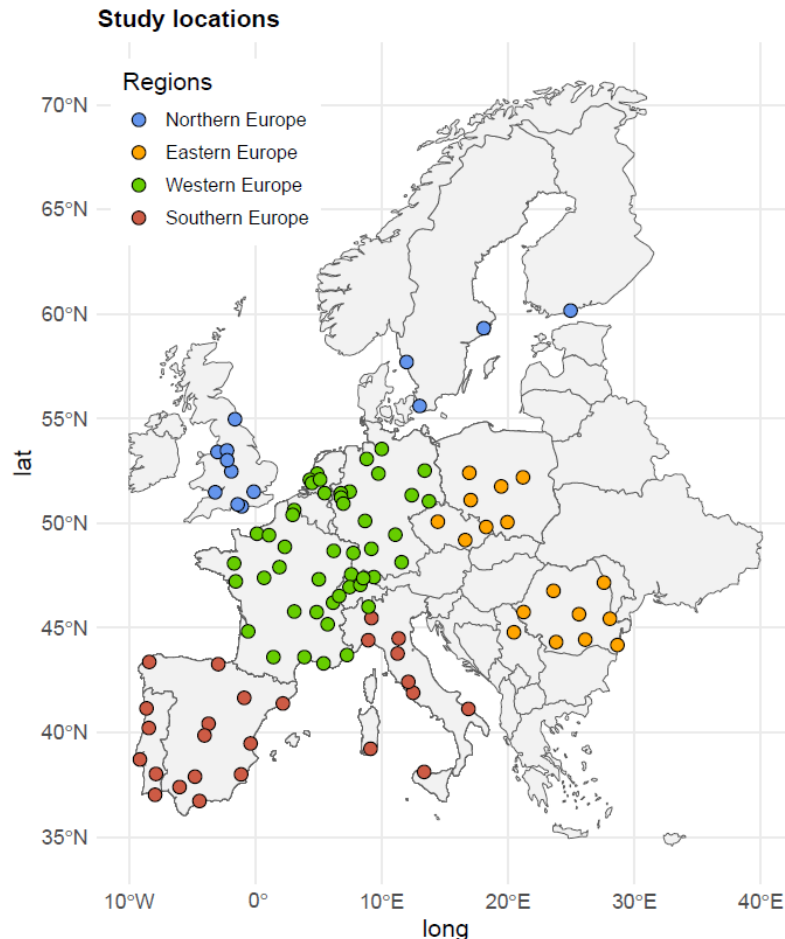
---

- Toloo et al (2013) Env. Health:
  - *„heat warning systems are effective in reducing mortality“*
  - *„more research is urgently required into the cost-effectiveness of heat warning systems“*
- Dwyer et al. (2022) Int. J. Biometeorology:
  - *„examined the reviews that identified the methodological challenges“*
  - *„evaluations of heat plans globally should employ robust methodologies“*
- **Limitations** of previous studies:
  - **Often limited to single cities/countries, selected heat events**, etc.
  - **Insufficient consideration of temporal and geographical variation** in mortality risks due to the underlying changes in vulnerability.



# Health and Weather Data

- Daily mortality and temperature data from 102 cities in 14 EU countries



Data collected via:




**MCC Collaborative Research Network**  
An international research program on the associations  
between environmental stressors, climate, and health

# HPP classification

---

- We classified nationwide HPPs based on WHO's Lead Criteria:\*

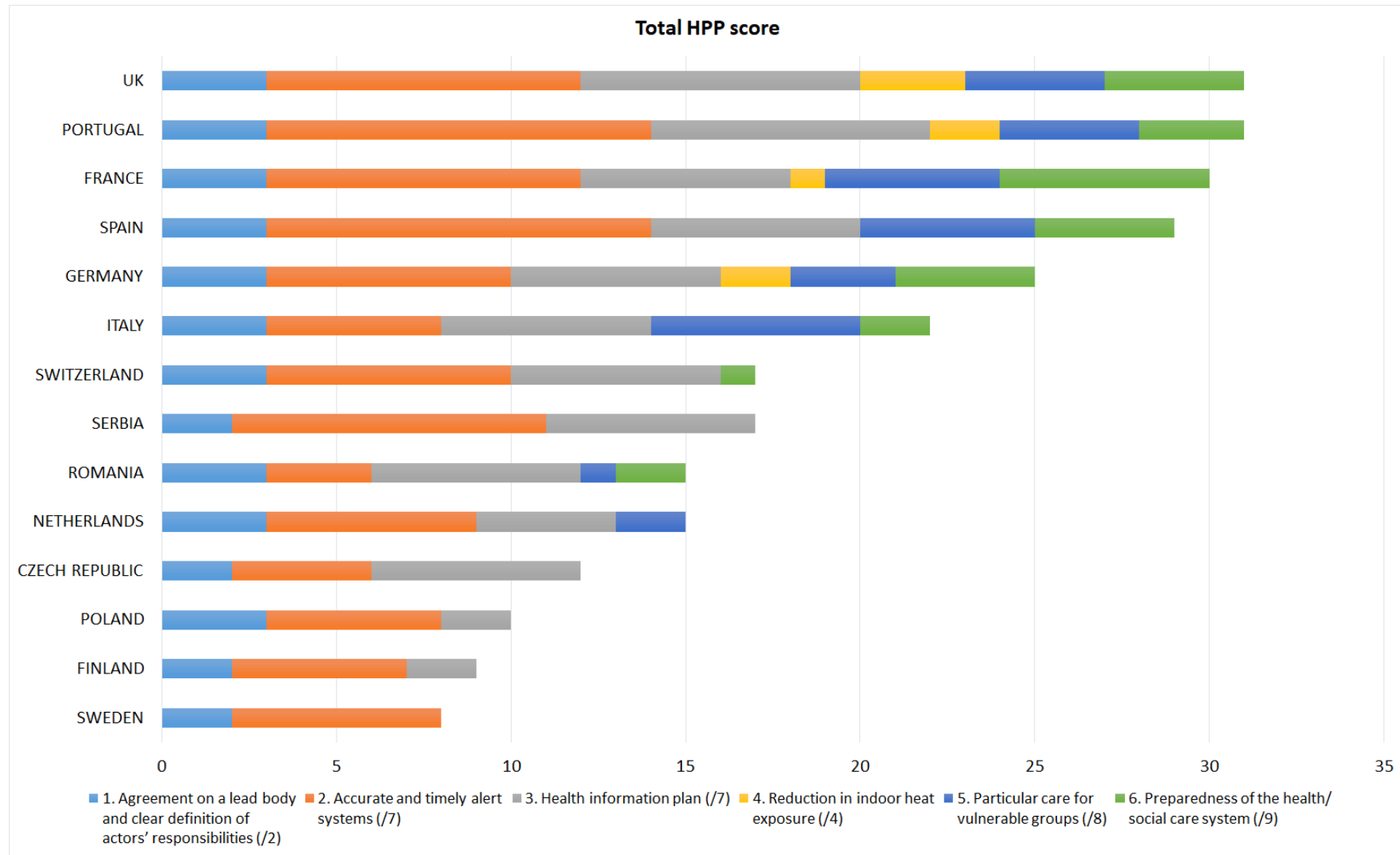
Lead	Maximum points
Agreement on a lead body	2
Accurate and timely alert systems	7
Health information plan	7
Reduction in indoor heat exposure	4
Particular care for vulnerable groups	8
Preparedness of the health/social care system	9
Real-time surveillance and evaluation	2

\*Data were collected during the COST Action  PROCLIAS

$\Sigma=35$



# HPP classification



# Data

- Mortality data from 102 cities in 14 EU countries + **implementation year, level of HPPs**

COUNTRY	N LOCATIONS	1990	1991	1992	1993	1994	1995	1996	1997	1998	1999	2000	2001	2002	2003	2004	2005	2006	2007	2008	2009	2010	2011	2012	2013	2014	2015	2016	2017	2018	2019	
Finland	1 metropolitan area					0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	1	1	1	1	1	1	1	1	North
Sweden	3 cities	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	1	1	1	1	1	1	North
UK	9 cities	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	North
Czechia	3 cities					0	0	0	0	0	0	0	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	East
Romania	8 cities					0	0	0	0	0	0	0	0	0	0	0	0	2	2	2	2	2	2	2	2	2	2	2	2	2	2	East
Poland	5 cities		0	0	0	0	0	0	0	0	0	0	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	East
Serbia	1 city					0	0	0	0	0	0	0	0	0	0	0	0	0	2	2	2	2	2	2	2	2	2	2	2	2	2	East
France	20 cities											0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	West
Germany	14 cities				0	0	0	0	0	0	0	0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	West
Netherlands	5 cities					0	0	0	0	0	0	0	0	0	0	0	0	0	2	2	2	2	2	2	2	2	2	2	2	2	2	West
Switzerland	8 cities					0	0	0	0	0	0	0	0	0	0	0	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	West
Italy	10 cities	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	South
Portugal	5 districts	0	0	0	0	0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	South
Spain	11 cities	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	South

HPP class	Definition
HPP = ?	No data
HPP class 0	No/basic weather forecast before HPP implementation
HPP class 1	HPP score $\leq 10$
HPP class 2	$10 > \text{HPP score} \leq 20$
HPP class 3	HPP score $> 20$

# Methods – details

---

Two-stage metaregression study design:

- **1<sup>st</sup> stage:** time series on city level.  
Divided to 3-year subperiods (slide 10) with HPP implementation (NO vs YES)
  - Distributed lag non-linear models (DLNM; *dlnm* R package) – adjusted for time trends and seasonality in mortality data
  - DLNM: ERF for each subperiod in each location, May-September
  - Reduced *coefficients* of the exposure response function exported to the second stage.

# Methods – details

---

Two-stage metaregression study design:

- **2<sup>nd</sup> stage:** metaregression model (mixmeta R package):
  - `model <- mixmeta (coef ~ Region*year + HPPstart), ... , random=~year | cityname)`
    - *coef* and *vcov* = first stage *coefficients* for each city in each subperiod
    - *Region* = 4 European Regions (slide 7)
    - *Year* = linear trend in heat-mortality (general heat-vulnerability)
    - *HPPstart* = NO – before HPP / YES – after HPP
    - *random* = random effect to capture heterogeneity in data across cities
  - => **Pooled effect for all locations based on Region and HPP implementation, adjusted for the long-term trend in heat-vulnerability** (slide 13)

## Main output:

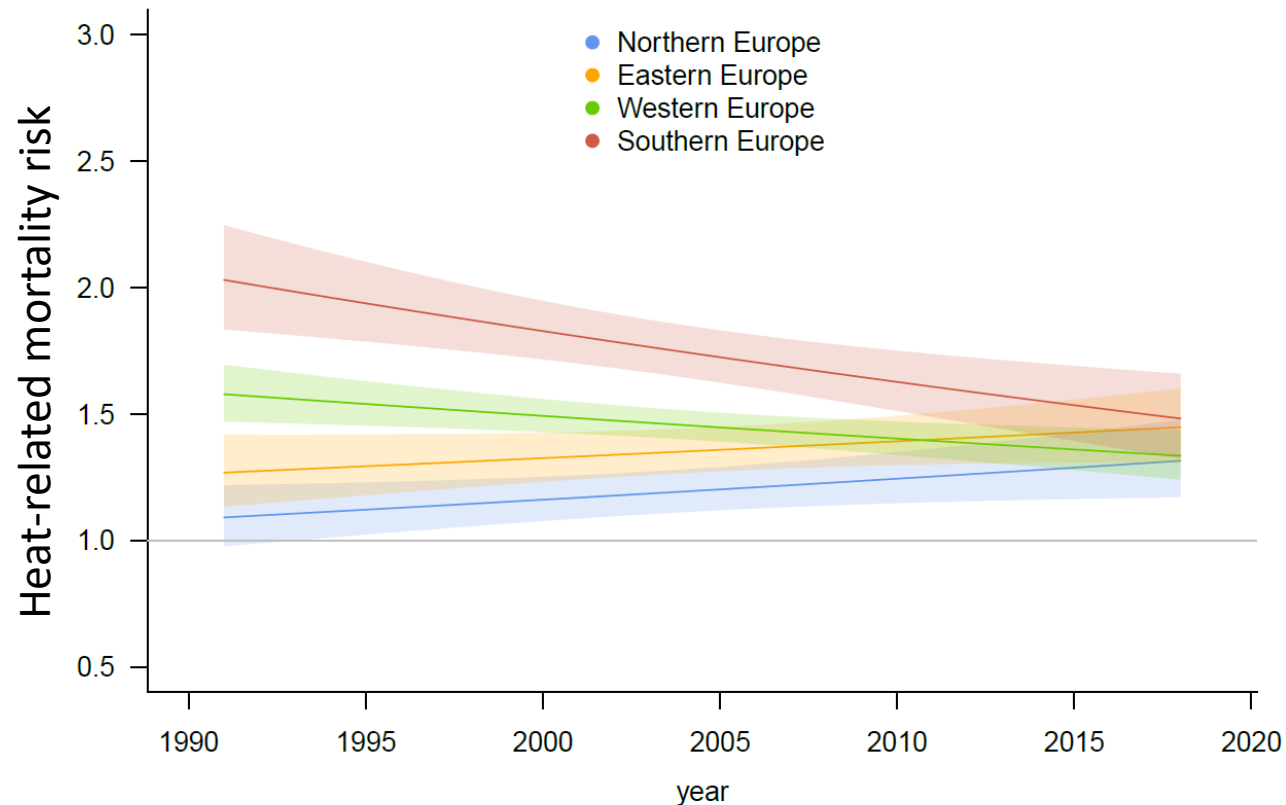
Comparison of **counterfactual** (w/o HPP) vs **factual** scenario (w/ HPP)

**counterfactual** = what would have been the heat-attributable risk without HPP?  
(slide 14)

# Methods

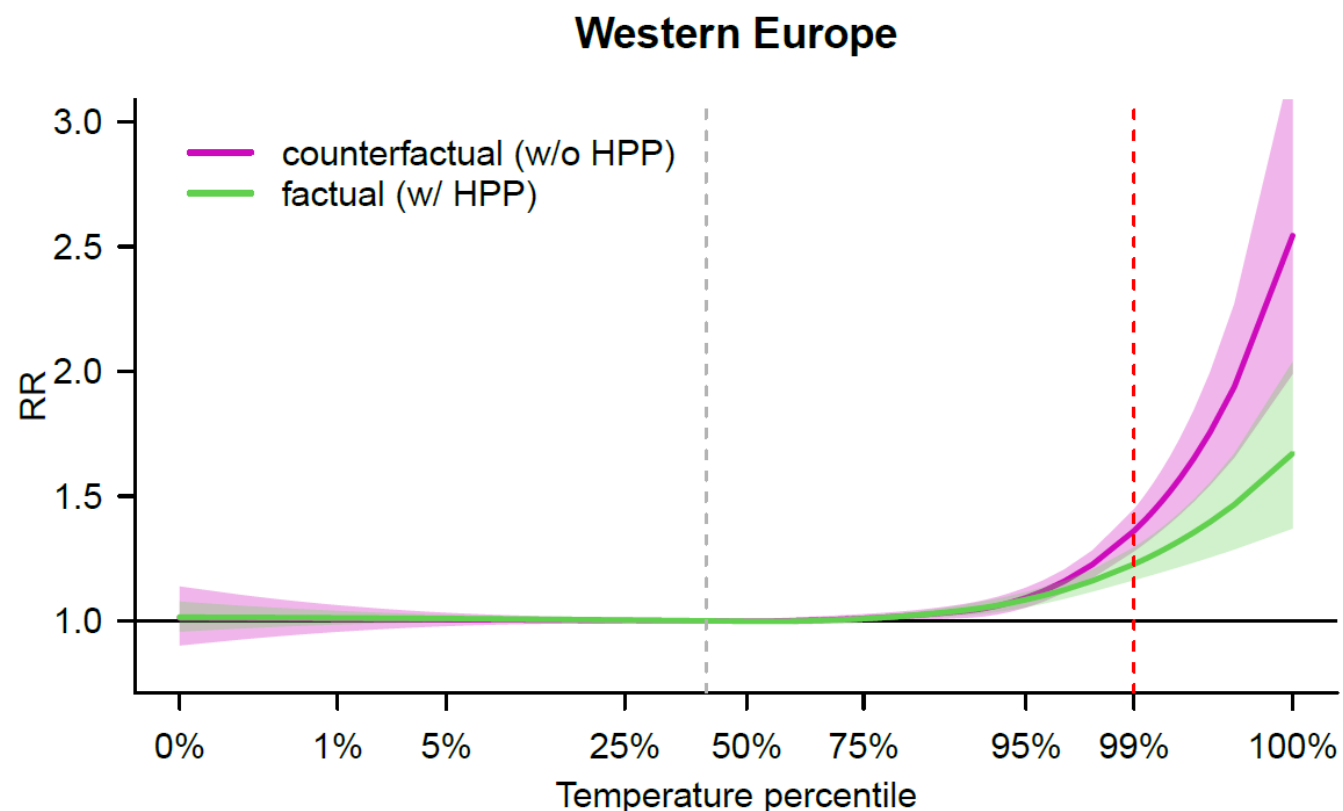
---

- The effect of HPP implementation adjusted for **the long-term trend in heat-related mortality risk (vulnerability) in the four main EU regions.**



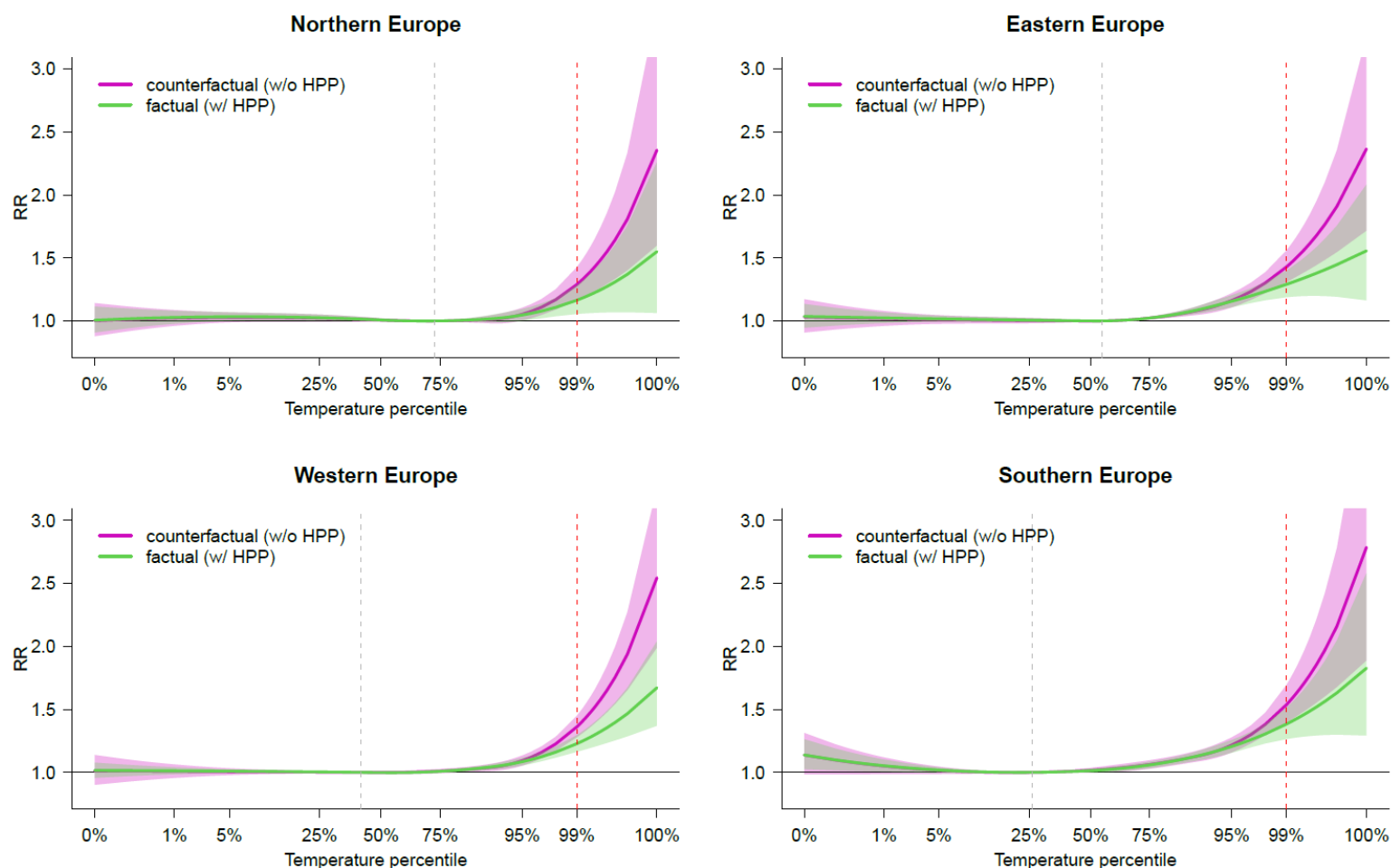
# Results

- Reduction of the heat-related mortality risk after HPP implementation in Western Europe – **!!! adjusted for the long-term trend in heat vulnerability** (slide 13)



# Results

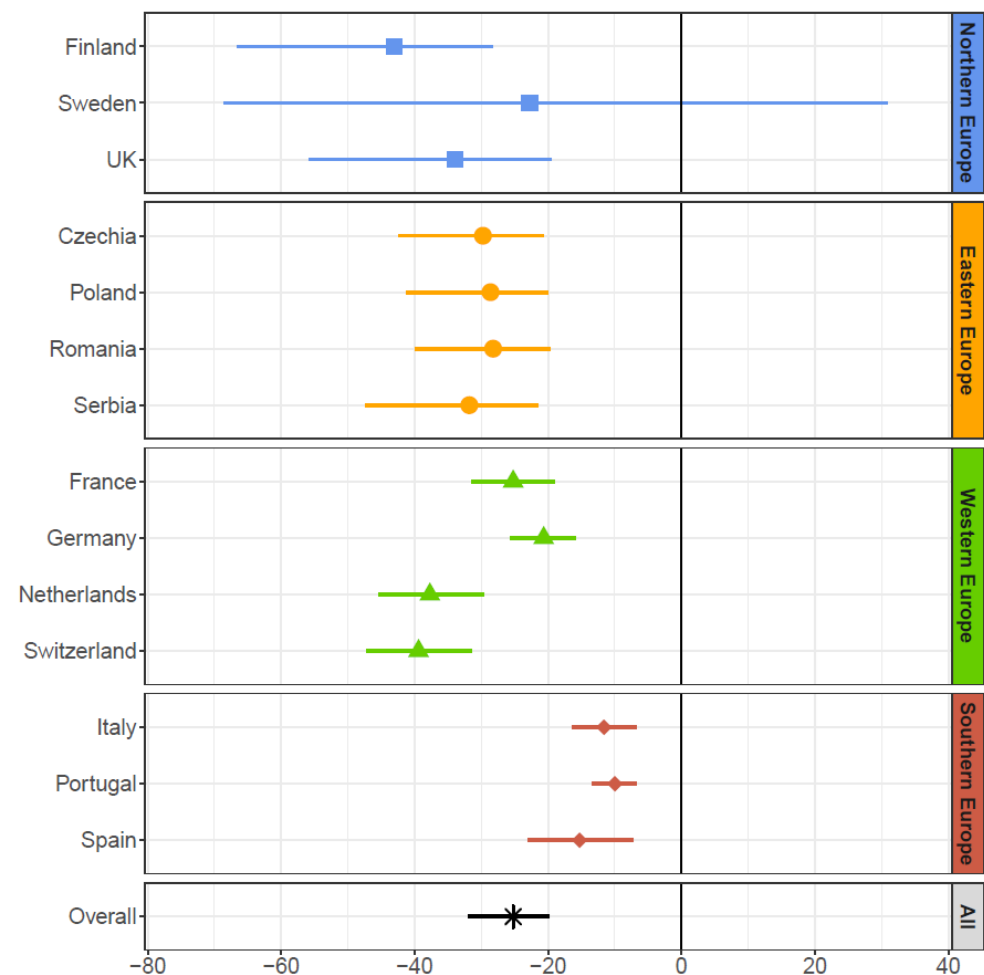
- Reduction of the heat-related mortality risk after HPP implementation in the four main EU regions.





# Results

- **HPP implementation was associated with a 25.2% reduction in excess deaths** attributable to extreme heat.
- Corresponds to **14,551 total deaths avoided across all study locations.**
- No significant differences in the HPP effect were observed by European region or HPP class.
- Further research on the effectiveness of specific adaptation measures is needed.



% change in heat-attributable mortality fraction associated with HPP implementation

# Thank you!

urbana@fzp.czu.cz  
@urbales



MCC Collaborative Research Network  
An international research program on the associations  
between environmental stressors, climate, and health



Funded by the Horizon 2020 Framework Programme  
of the European Union



CrossEU

This research received funds from the project “Cross-sectoral Framework for Socio-Economic Resilience to Climate Change and Extreme Events in Europe (CROSSEU)” funded by the European Union Horizon Europe Programme, under Grant agreement n° 101081377