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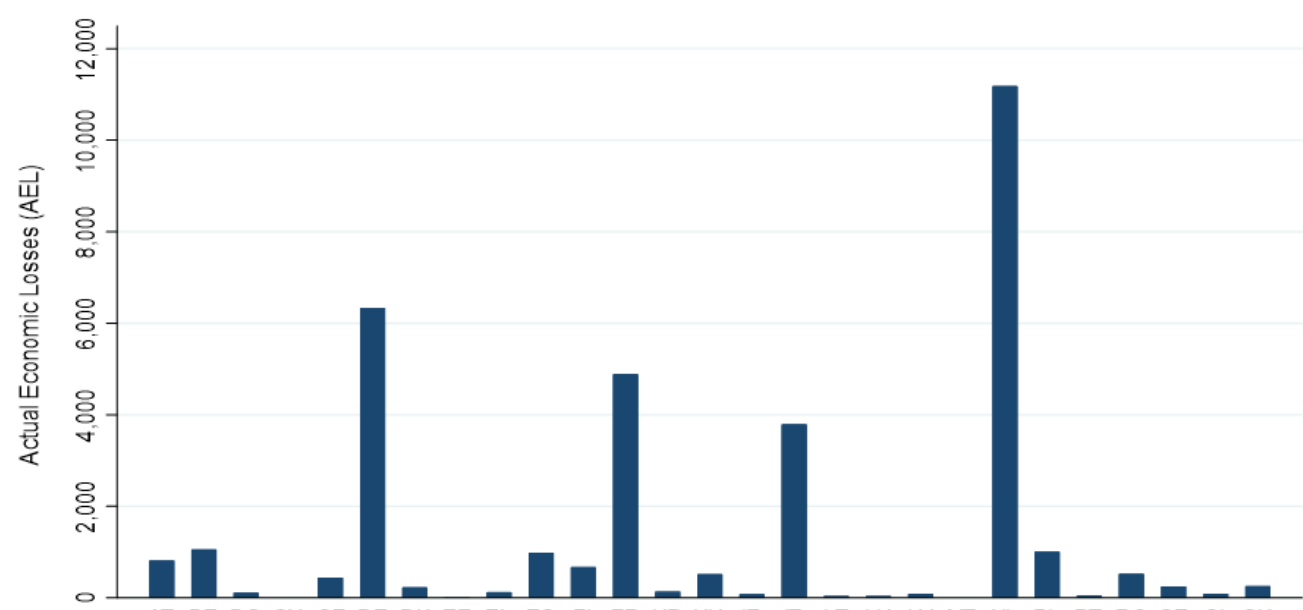
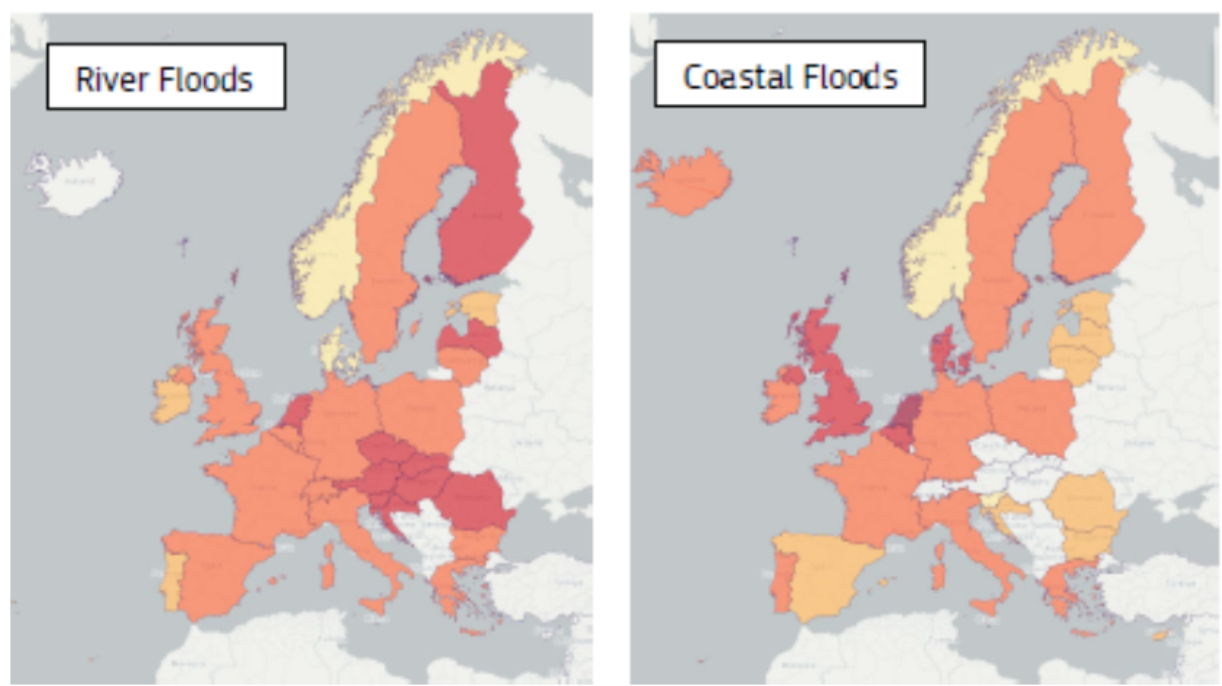
# Climate protection gap: evidences for public finances and insurance premiums

(Bellia, M., Di Girolamo, F., Pagano, A., Petracco Giudici, M.)

Combining data from EIOPA (from 2016Q3 to 2022Q2), and JRC Risk Data Hub (as of January 2023), we estimate:

- The **potential increase in (gross) insurance premiums** due to an increase of **insurance penetration** for river and coastal floods up to **50%** or **75%** for Member States (MS) that are below these values.
- The **potential public finance losses** (in a worst-case scenario) at EU level, considering losses from a compound disaster including uninsured climate-related losses and potential defaults stemming from the insurance sector, and **its reduction** when increasing the insurance penetration.

## Distribution of losses from floods (Risk Data Hub)



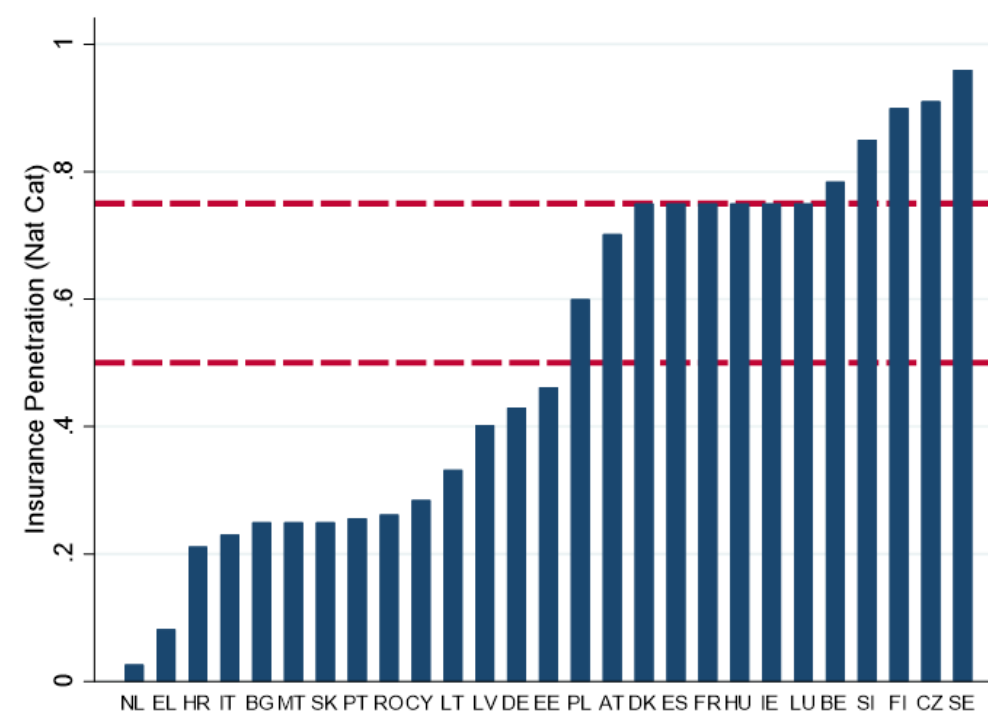
- Risk Data Hub includes estimates of probability of exceedance and area/population exposed to river floods and coastal floods (and other natural disasters)

- From these it is possible to calculate probability of occurrence of different events and expected exposure over different periods

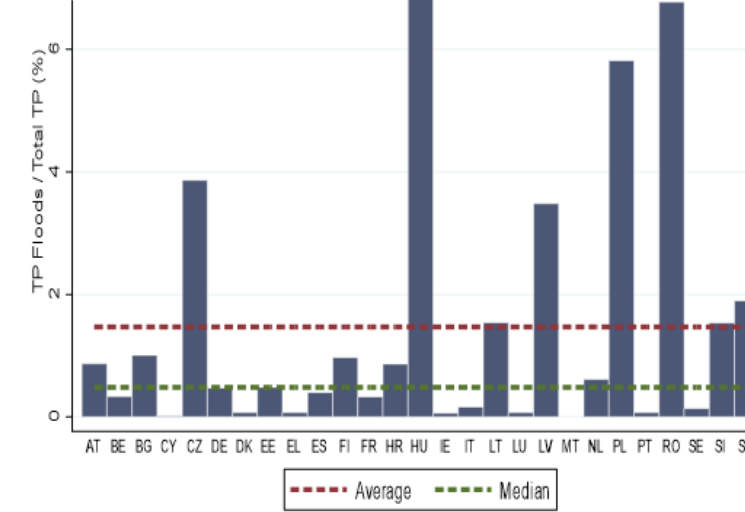
- Vulnerability allows move from exposure to “loss”

- Losses in area/population transformed in economic loss

## Insurance Penetration and Technical Provisions (EIOPA)



$$TP_{\text{flood},i} = IP_{\text{flood},i} \times AEL_i$$



- EIOPA provides data on Insurance Penetration Rate for Flood “peril”

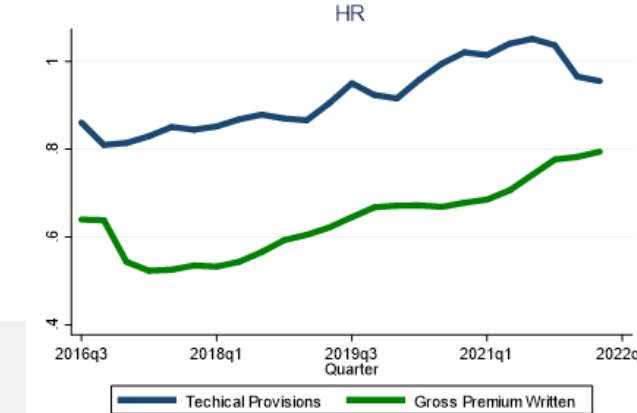
- EIOPA provides data on Total Technical Provisions and Gross Premiums Written for non-life insurance (a superset including property insurance)

- Make use of expected loss from RDH and penetrations rata to estimate theoretical Technical Provisions to insure all flood risks

- Calculate share of non-life TP due to flood risks

## Estimating additional premiums needed to harmonize the insurance penetration

- TP and Gross Premium move together (see an example for HR) and are non-stationary. Their relationship can be estimated using a Vector Error Correction Model (VECM), a special case of a VAR(p) model.



- Considering a VAR with p lags:

$$y_t = v + A_1 y_{t-1} + \dots + A_p y_{t-p} + \varepsilon_t$$

where  $v$  is a  $K \times 1$  vector of parameters,  $A_1 - A_p$  are  $K \times K$  matrices of parameters, and  $\varepsilon_t$  being i.i.d normal over time, with zero mean and covariance matrix  $\Sigma$ . The VAR(p) can be rewritten in a VECM form. Its representation is:

$$\Delta y_t = v + \Pi y_{t-1} + \sum_{i=1}^{p-1} \Gamma_i \Delta y_{t-i} + \varepsilon_t$$

where  $\Pi = \sum_{i=1}^{p-1} A_i - I_K$  and  $\Gamma_i = -\sum_{j=i+1}^p A_j$ .

- The final expected gross premium written for Member State  $i$ ,  $EGP_i$  are obtained multiplying the  $AEL_i$  by the value of the orthogonalized impulse response function for Member State  $i$ ,  $OIRF_i$  in the last step.

$$EGP_i = AEL_i \times (1 + OIRF_i)$$

- To evaluate the amount of  $EGP_i$  that need to be written in order to harmonize the penetration rate at 50% ( $EGP_i^{50}$ ) or 75% ( $EGP_i^{75}$ ) for each Member State:

$$EGP_i^{50} = \frac{EGP_i \times 0.5}{IP_{\text{flood},i}} \quad EGP_i^{75} = \frac{EGP_i \times 0.75}{IP_{\text{flood},i}}$$

## Economic losses from insurance defaults

- We do not model single insurance undertaking, but **all insurance companies at individual country level** (or even at the aggregate EU27 level).The loss rate distribution can be seen as the loss rate on a portfolio of exposures to several insurance undertakings.

- We use the **Vasicek (2002)** model to define the event of default, as occurring when the insurer's asset value falls below a predetermined threshold. **The maximum loss  $L_i$**  for country  $i$  that cannot be exceed in one year with a probability level  $\alpha$  is given by:

$$L_i = EAD_i \times LGD \times N \left[ \frac{\sqrt{\rho + \delta(1-\rho)} N^{-1}(1-\alpha) + N^{-1}(PD)}{\sqrt{1-\rho-\delta(1-\rho)}} \right]$$

- $EAD_i$  of  $TP_i$ , our best estimate of liabilities and risk margin and  $SRC_i$  as the total amount of funds that an insurer is required to hold to ensure that the company will be able to meet its obligations with a probability of at least 99.5%

$$EAD_i = SCR_i + TP_i$$

- We apply this modelling framework under a worst-case scenario, where flood events happen together with insurance defaults. We do so by considering **uninsured catastrophic losses, besides those stemming from defaults in the insurance sector**

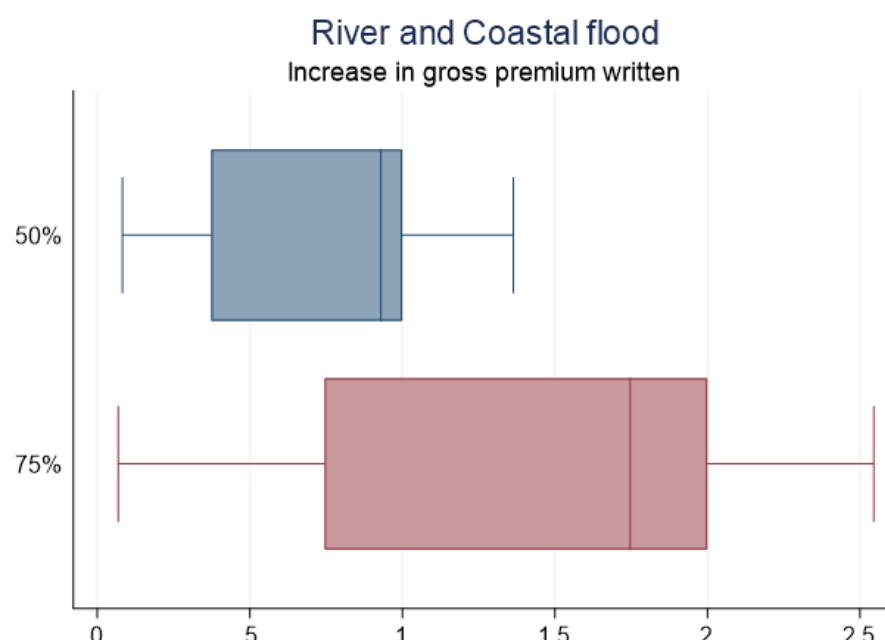
- Final losses on public finances are then computed as **the sum of uninsurable losses and leftover from the insurance sector:**

$$FL_i = L_i + (1 - IP_{\text{flood},i}) \times AEL_i$$

## Results - Additional premiums needed to harmonize the insurance penetration

Member State	$IP_{\text{flood},i}$	$OIRF_i$	$EGP_i^{50}$ (EUR Mn)	$EGP_i^{75}$ (EUR Mn)
AT	70%	2.83%		631.70
BG	25%	4.30%	57.21	85.82
CY	28%	1.93%	0.56	0.84
DE	43%	1.77%	3,224.13	4,836.19
EE	46%	4.42%	6.93	10.39
EL	8%	1.64%	63.05	94.58
HR	21%	2.38%	70.61	105.91
IT	23%	2.14%	1,936.61	2,904.91
LT	33%	2.11%	20.40	30.60
LV	40%	4.87%	43.67	65.51
MT	25%	7.29%	0.01	0.01
NL	3%	3.46%	5,784.46	8,676.68
PL	60%	3.18%		779.86
PT	26%	2.07%	23.74	35.61
RO	26%	3.12%	270.22	405.32
SK	25%	2.91%	131.34	197.00
Total			11,632.92	18,860.93

Note: Sensitivity of Gross Premium written w.r.t. technical provisions and Estimation of the Expected Gross Premiums



- Harmonise penetration at 50% : EUR 11.6 billion
- Harmonise penetration at 75% : EUR 18.7 billion

- Actual (estimated) premiums from EIOPA for flood events is roughly EUR 10.06 billion (a proxy since for the non-life insurances, multiple risks are bundled together, and the coverage for natural catastrophes is part of the fire or property insurance)

- **Actual insurance premiums for flood events should be at least doubled to reach a 50% penetration across the EU**

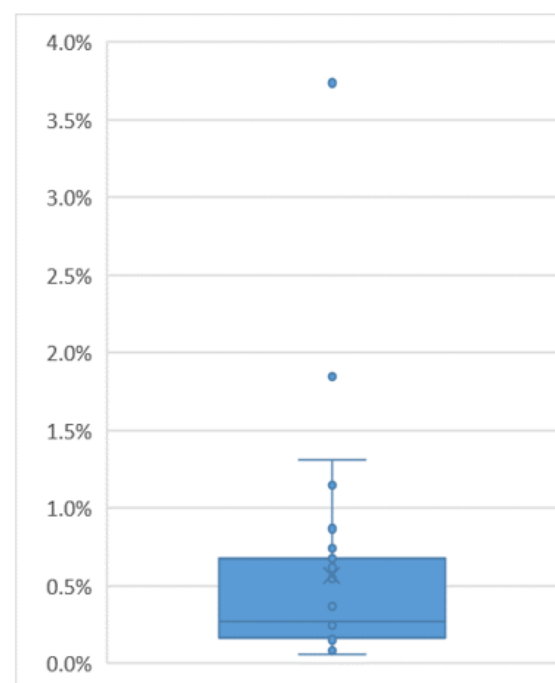
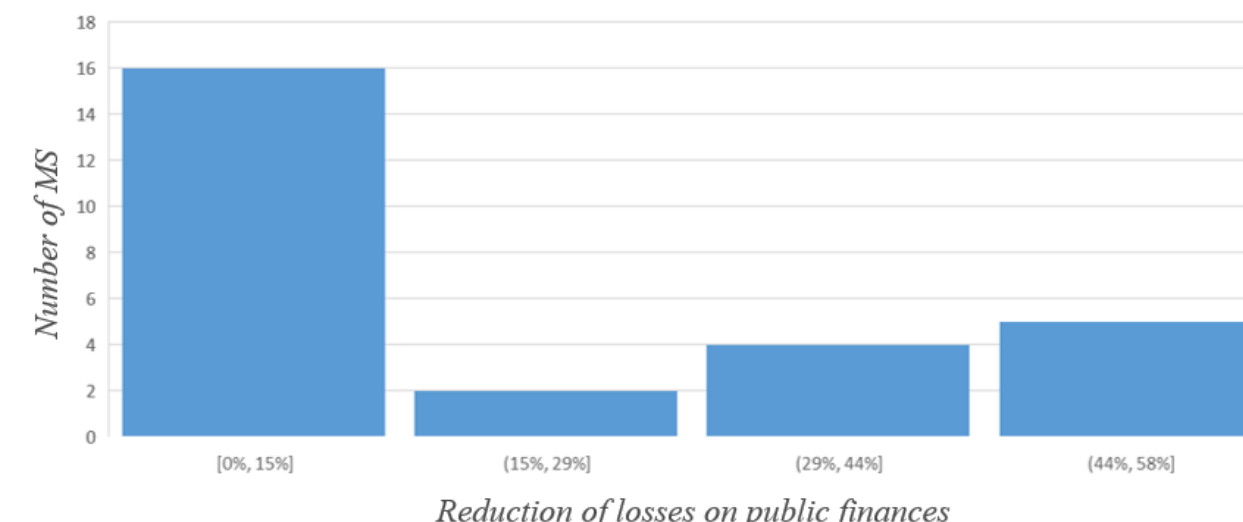
## Results - Economic losses on public finances

- In a worst-case scenario, when extreme weather-related events take place and insurers' defaults make them unable to fulfil their contractual commitments, losses for the EU would amount to **EUR 90 billion** under a **confidence level of 99%** over one year time.

- Although the impact is contained for the majority of countries (see the boxplot) with **losses lower than 1% of the GDP, in some cases losses rise significantly** (up to 3.5% of GDP).

- **Harmonization of the insurance penetration for floods across countries at 75%** would be quite effective in reducing final losses on public up to 20% under a confidence level of 99%.

- Benefits could be up to 60% reduction in losses for countries where the actual penetration rate is low



Distribution of public finance losses in EU under the actual insurance penetration rate % GDP. ( $\alpha = 1\%$ ).

Results



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Bellia Mario, Di Girolamo Francesca Erica, Pagano Andrea, Petracco Giudici Marco, *Climate protection gap: evidences for public finances and insurance premiums*, JRC Technical Reports (forthcoming)