



Monte-Carlo climate-based multivariate emulator for coastal flooding

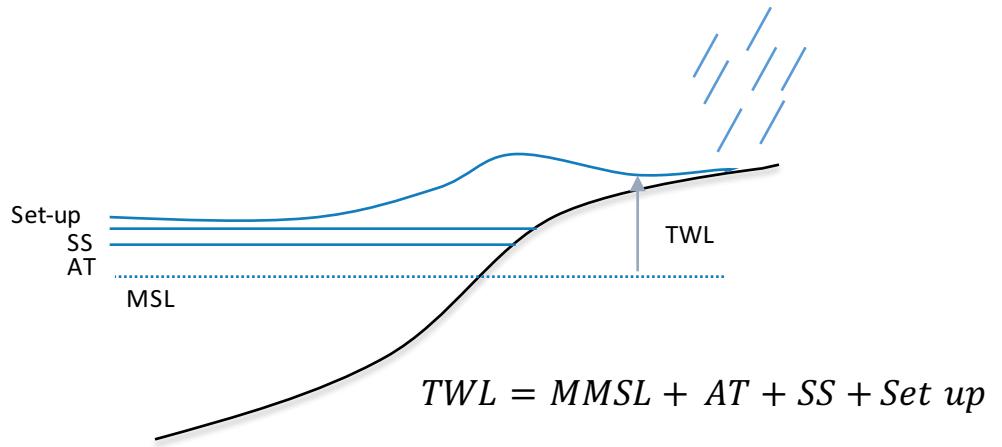
Ana Rueda, Paula Camus, Antonio Tomás, Fernando Méndez

14th International Workshop on Wave Hindcasting and Forecasting.
Key West, Florida, USA, Nov 10, 2015

Introduction

$$\text{Risk} = \int \text{Probability} \times \text{Consequences}$$

Multivariate nature of climate event

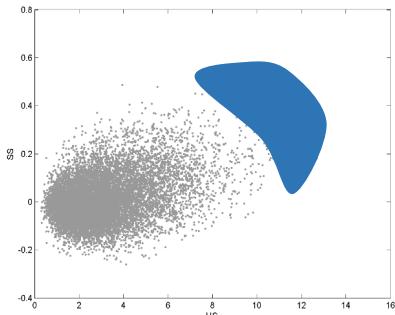
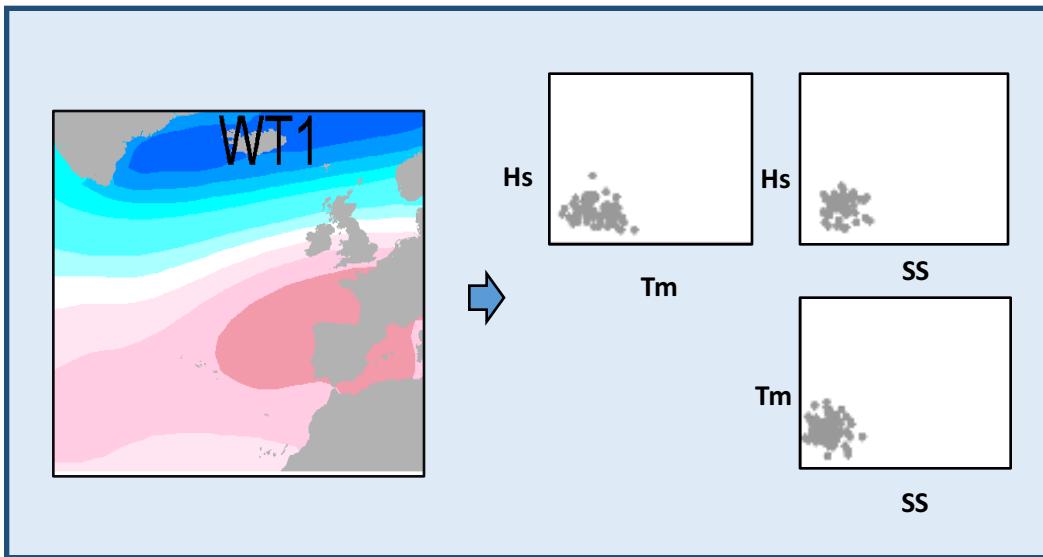


COMPOUND EVENT

- (1) The extremeness of the impact rather than variables or events it depends on;
- (2) The requirement of multiple variables or events on which the impact depends
- (3) The role of statistical dependence

Objectives

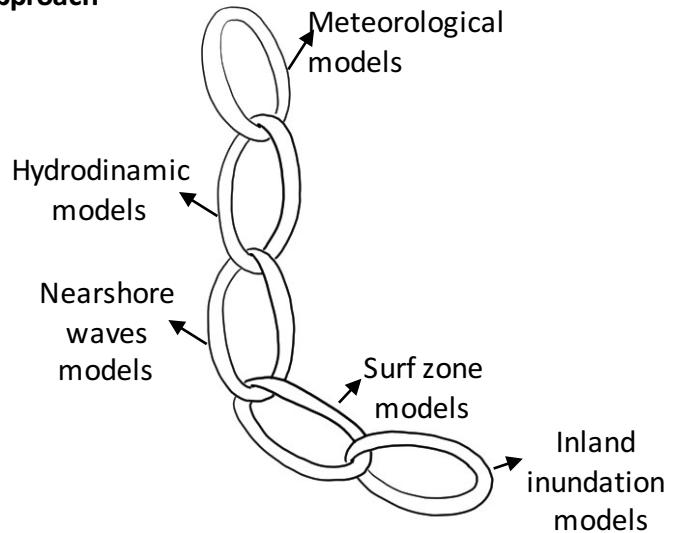
1) Extrapolation of the joint density function of the variables that influence coastal flooding taking into consideration climate variability



$$\text{Risk} = \int \text{Probability} \times \text{Consequences}$$

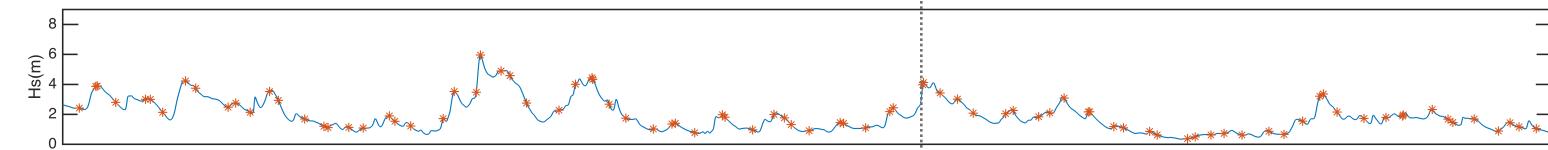
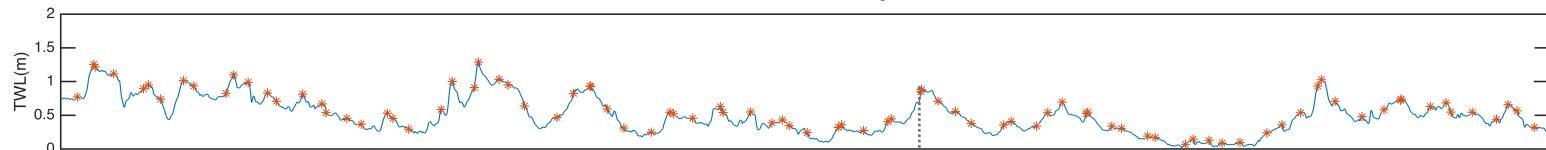
2) Downscaling to coastal flood risk assessment

Multi-model approach



Predictand

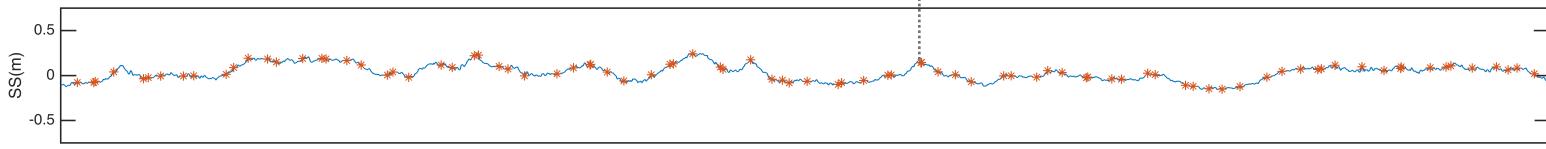
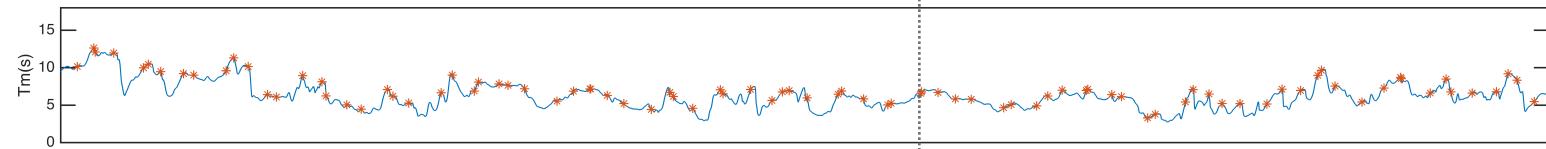
Maximum daily TWL



$H_s(m)$

$Tm(s)$

$SS(m)$



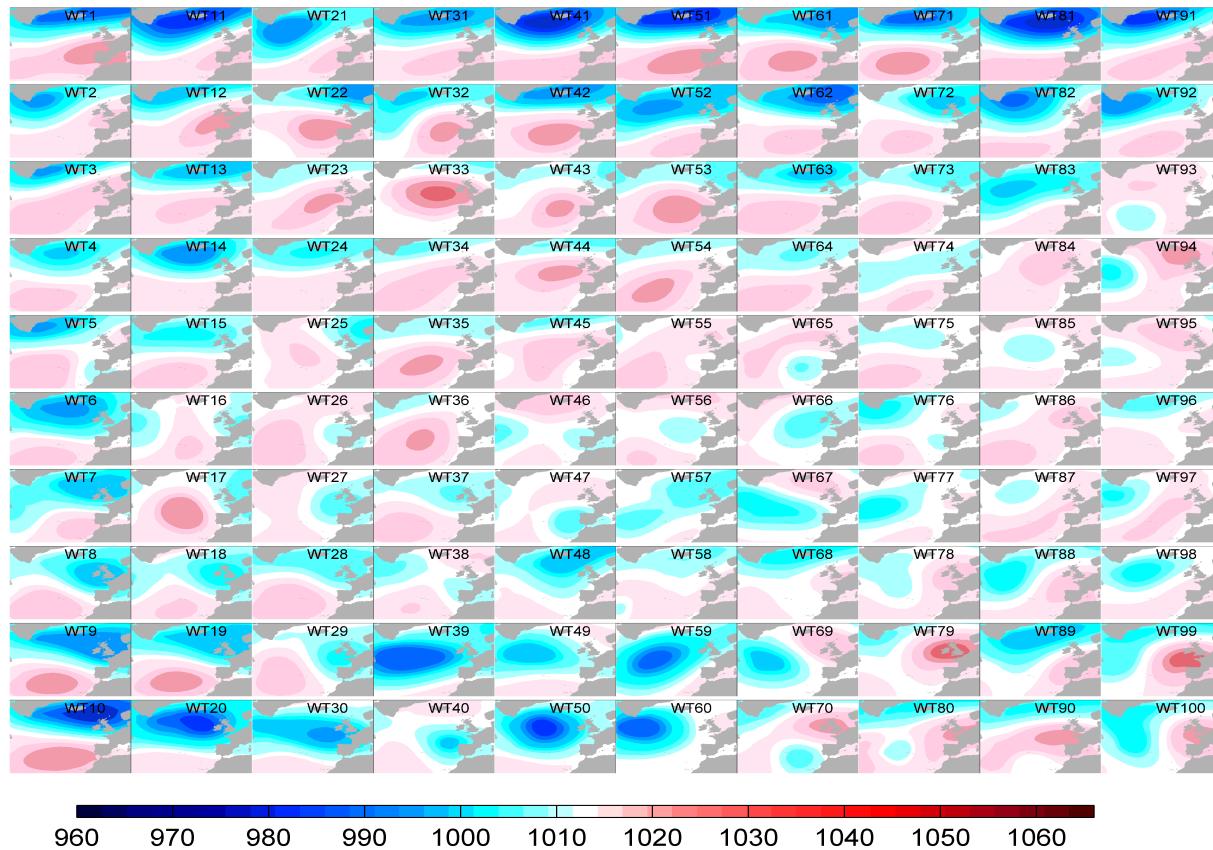
Set-up
SS
AT

MSL

TWL

$$TWL = SS + 0.043 \cdot \sqrt{H_s \cdot L_0^2}$$

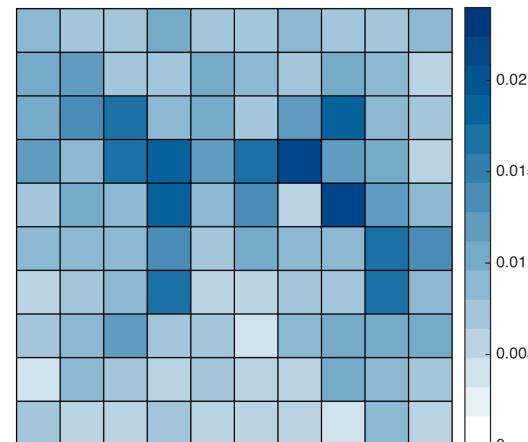
Weather type classification



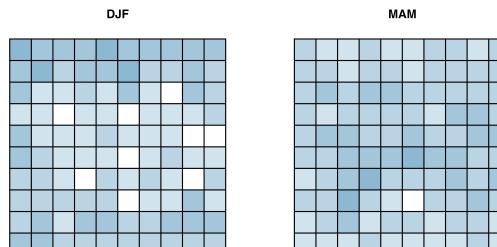
(Camus et al., JGR 2014)

(Camus et al., OD submitted)

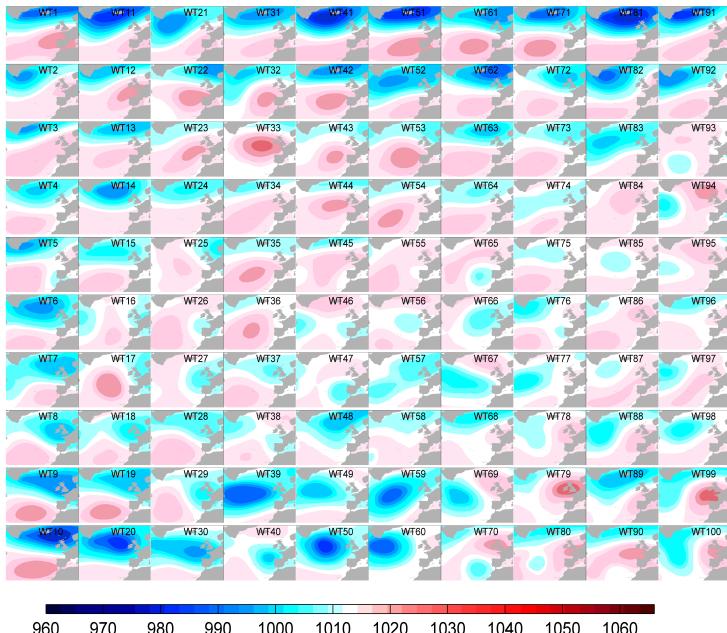
Annual probabilities



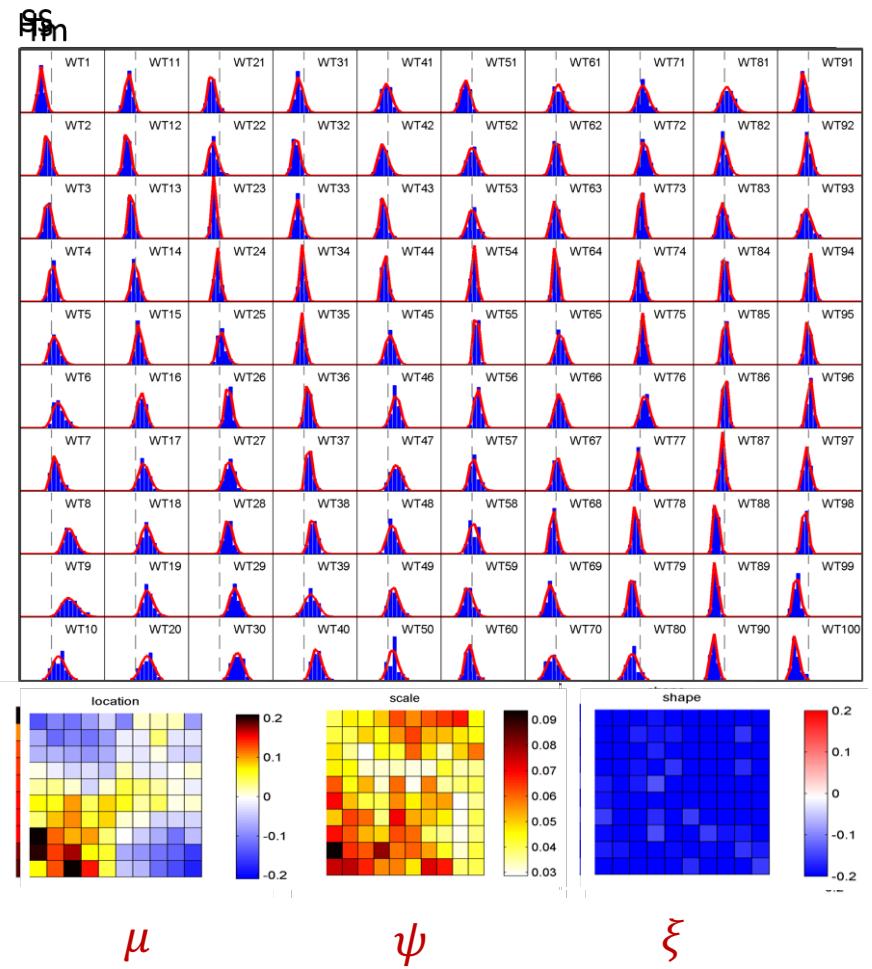
Seasonal probabilities



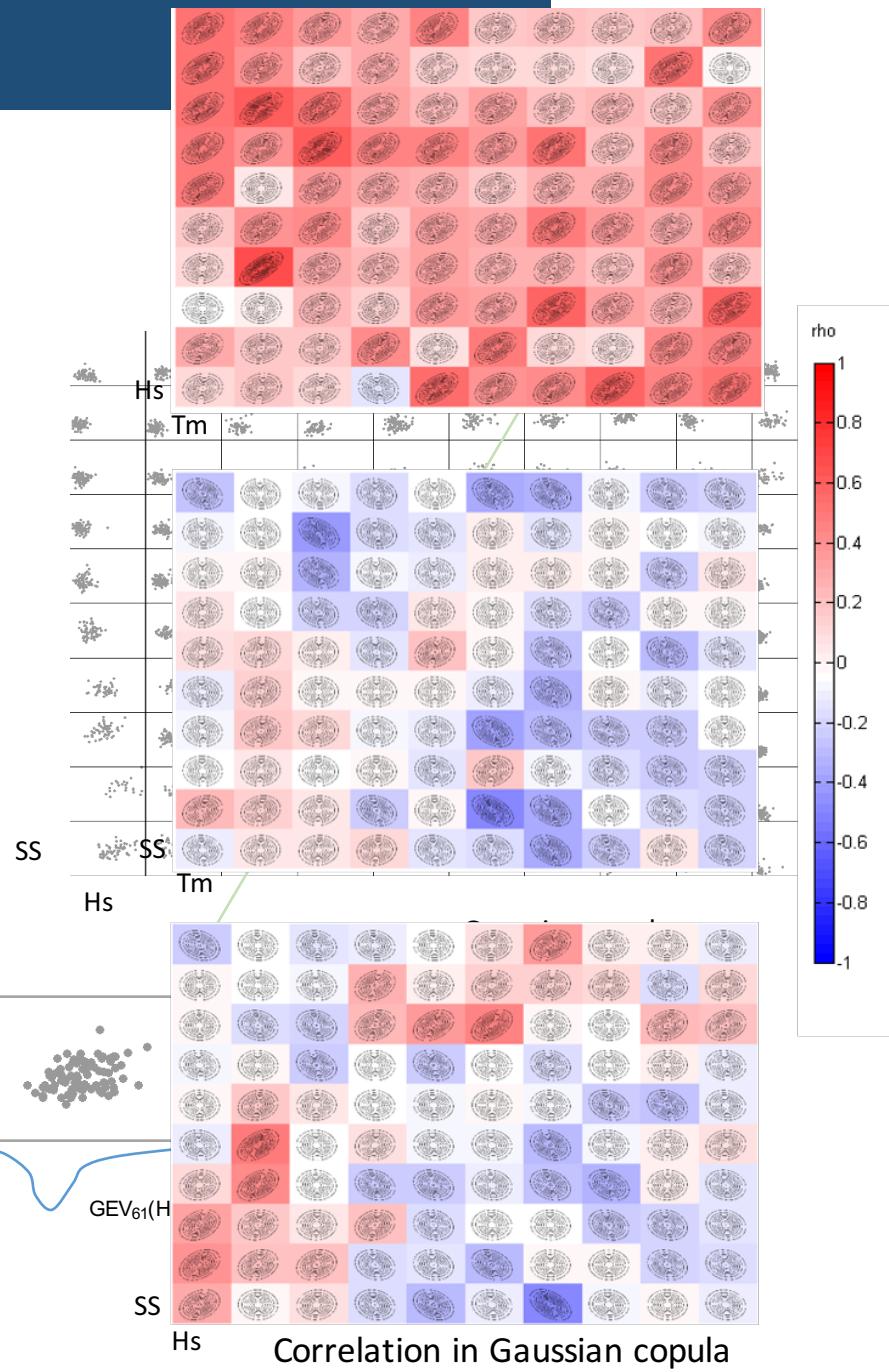
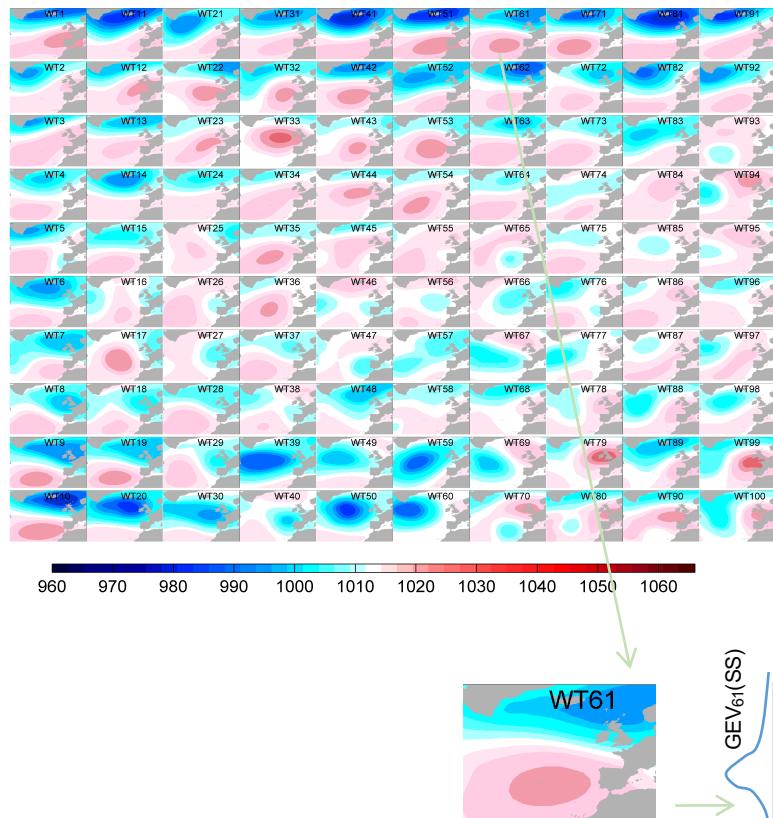
Marginal distributions associated to each WT



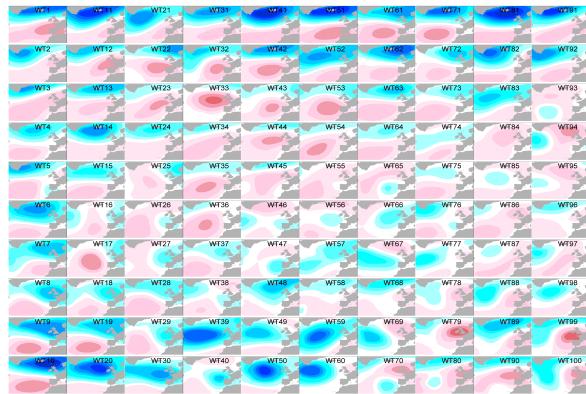
$$F(y) = \exp \left\{ - \left[1 + \xi \left(\frac{y-\mu}{\psi} \right) \right]^{-\frac{1}{\xi}} \right\};$$



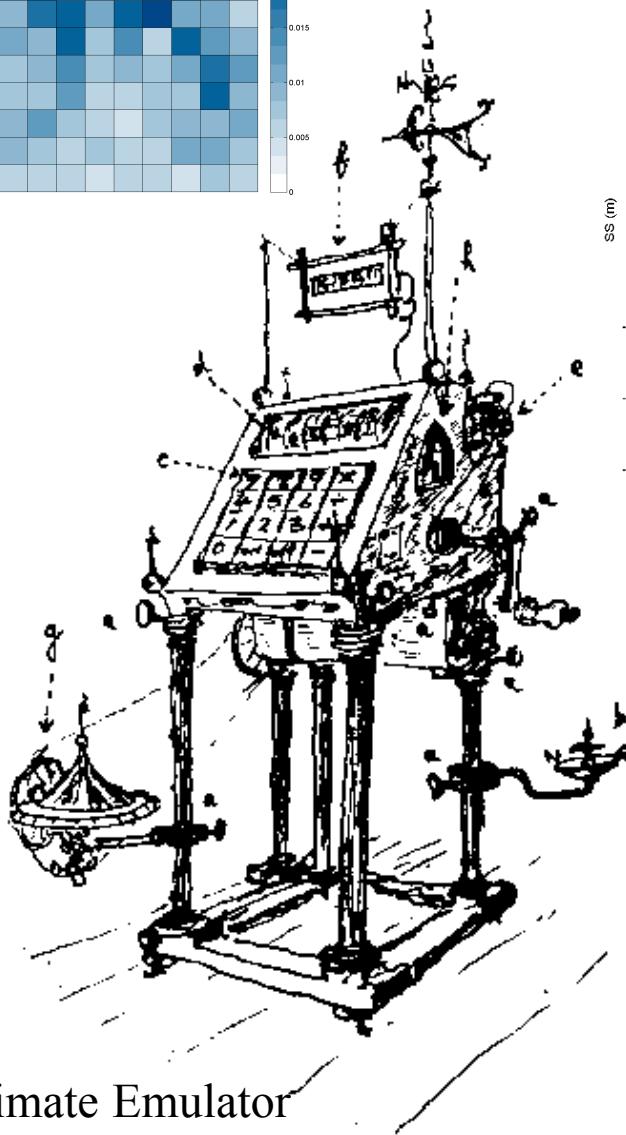
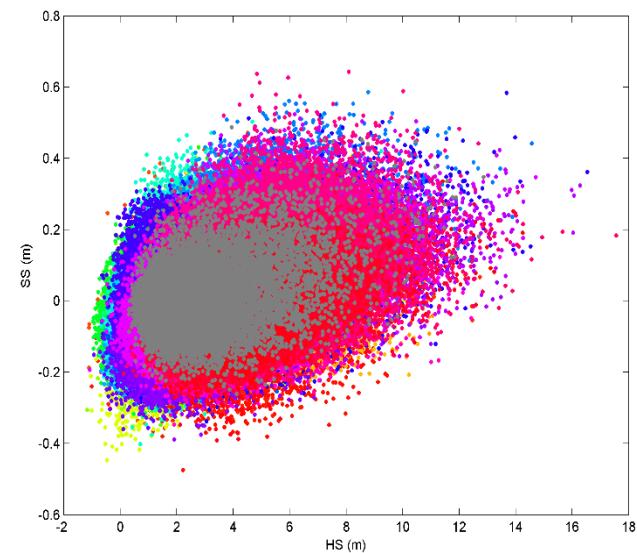
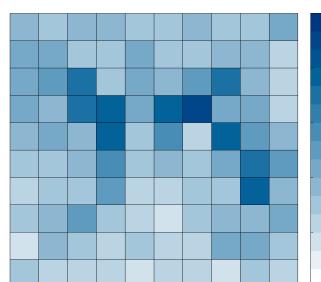
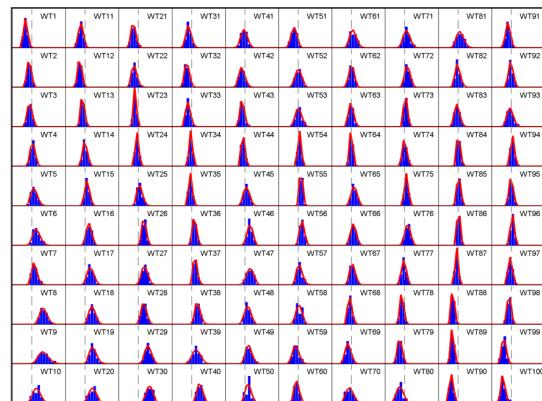
Dependence structure



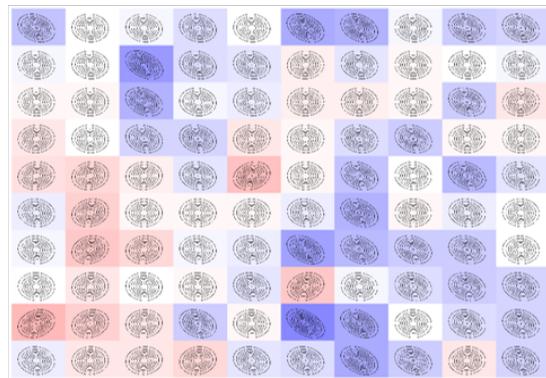
Multivariate Simulation



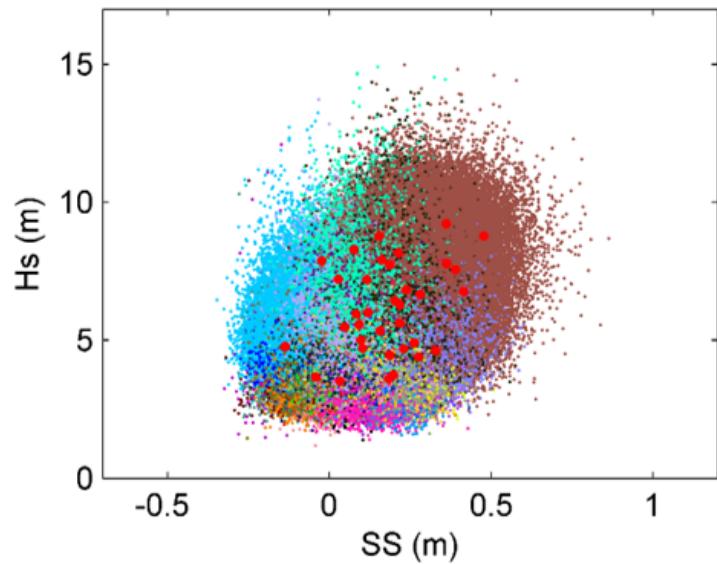
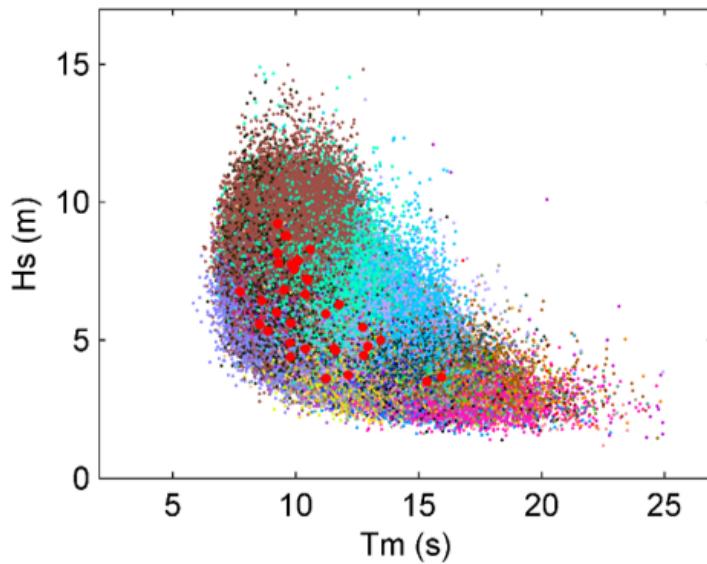
960 970 980 990 1000 1010 1020 1030 1040 1050 1060



Climate Emulator



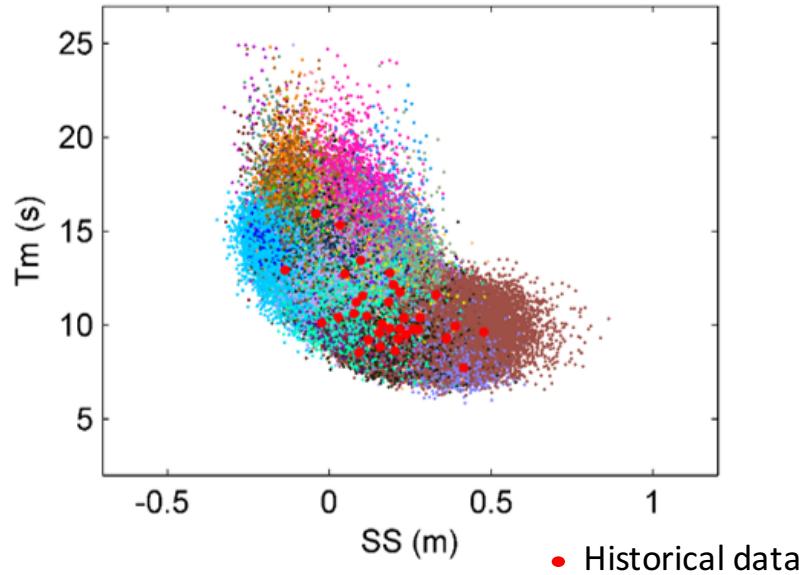
Multivariate Simulation



450.000 simulated years

WT of origin

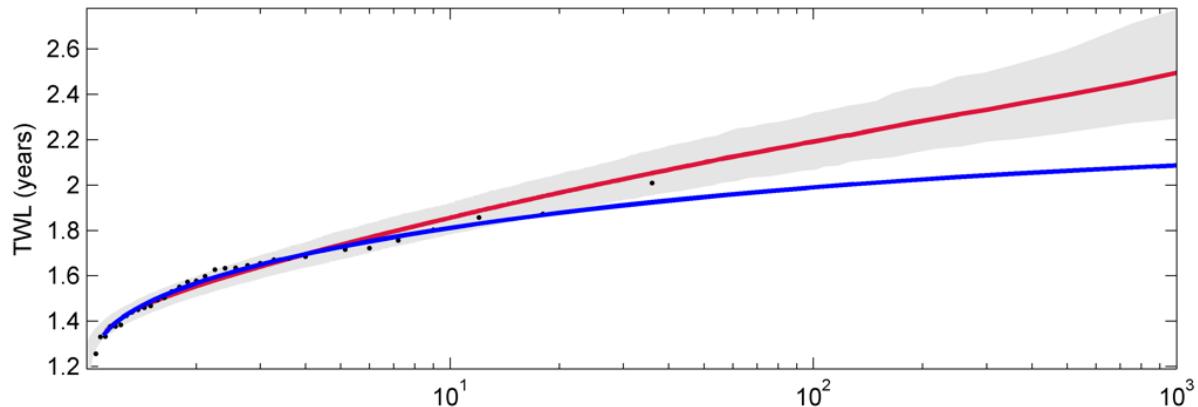
WT1	WT11	WT21	WT31	WT41	WT51	WT61	WT71	WT81	WT91
WT2	WT12	WT22	WT32	WT42	WT52	WT62	WT72	WT82	WT92
WT3	WT13	WT23	WT33	WT43	WT53	WT63	WT73	WT83	WT93
WT4	WT14	WT24	WT34	WT44	WT54	WT64	WT74	WT84	WT94
WT5	WT15	WT25	WT35	WT45	WT55	WT65	WT75	WT85	WT95
WT6	WT16	WT26	WT36	WT46	WT56	WT66	WT76	WT86	WT96
WT7	WT17	WT27	WT37	WT47	WT57	WT67	WT77	WT87	WT97
WT8	WT18	WT28	WT38	WT48	WT58	WT68	WT78	WT88	WT98
WT9	WT19	WT29	WT39	WT49	WT59	WT69	WT79	WT89	WT99
WT10	WT20	WT30	WT40	WT50	WT60	WT70	WT80	WT90	WT100



● Historical data

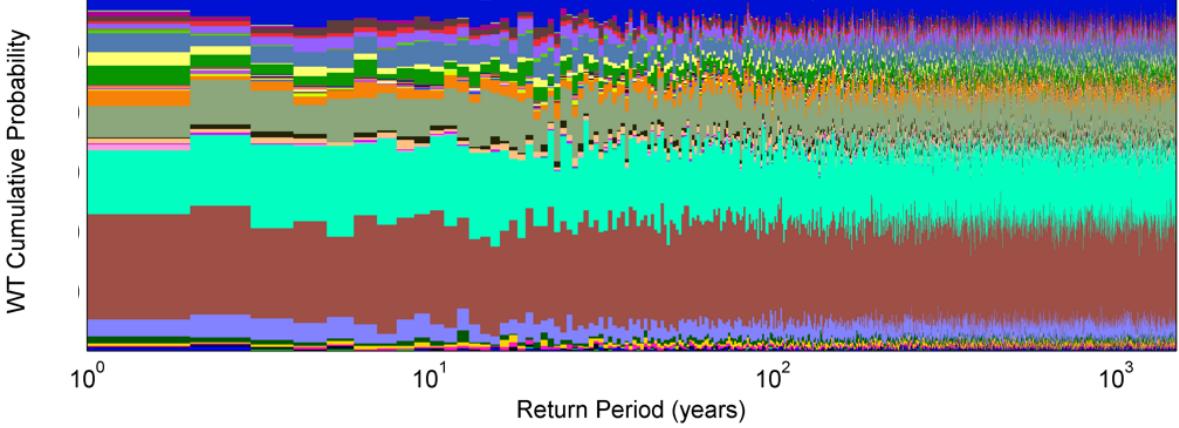
Multivariate Simulation

- Univariate Stationary Gev
- Non-stationary Gev
- Multivariate simulation

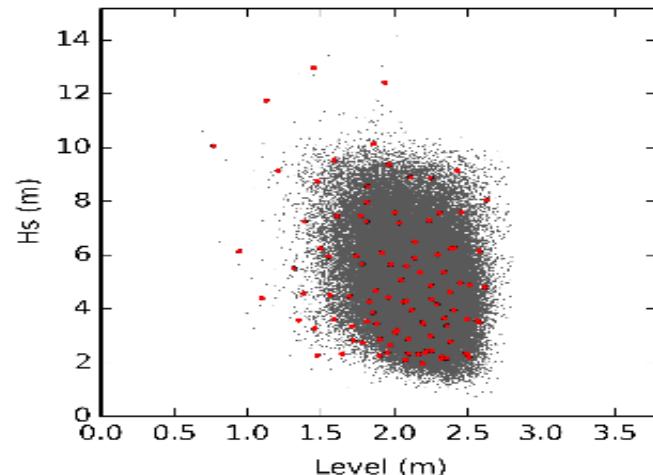
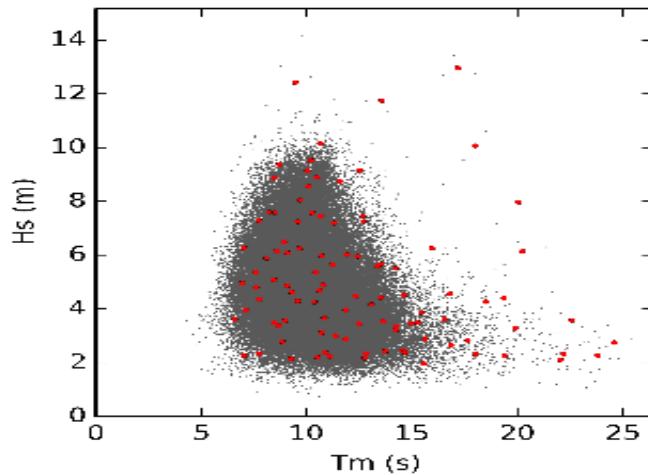


WT of origin

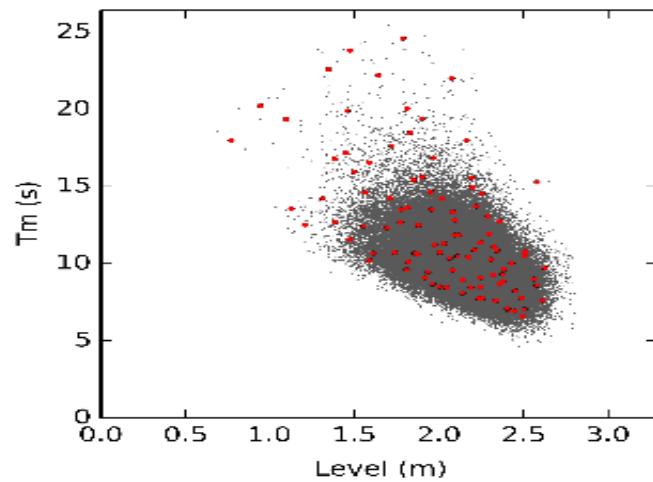
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WT9	WT19	WT29	WT39	WT49	WT59	WT69	WT79	WT89	WT99
WT10	WT20	WT30	WT40	WT50	WT60	WT70	WT80	WT90	WT100



Coastal flood – Risk assessment



KMA
Algorithm

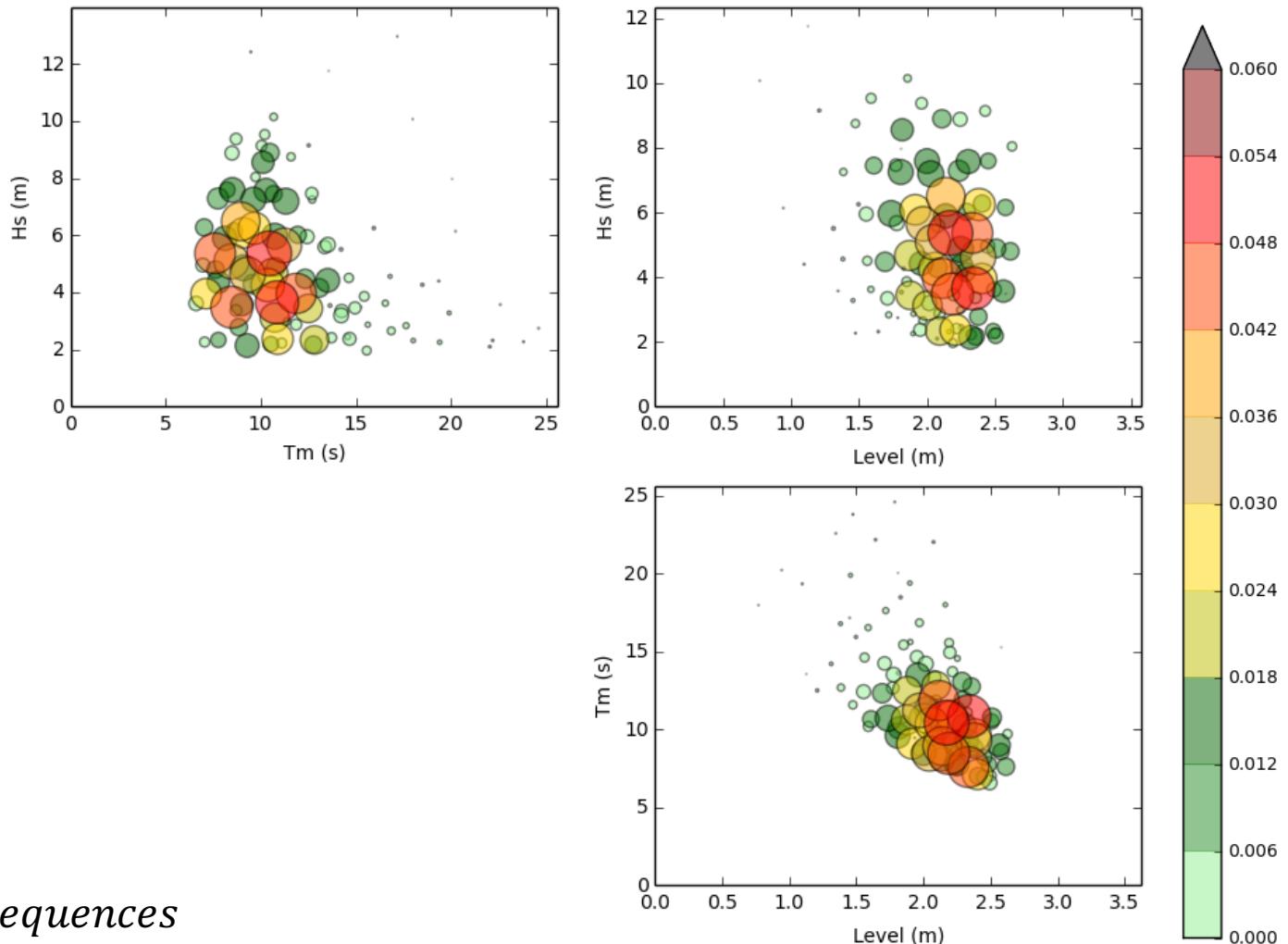


$$R = \int prob \cdot consequences$$

● Data points ● Selected points

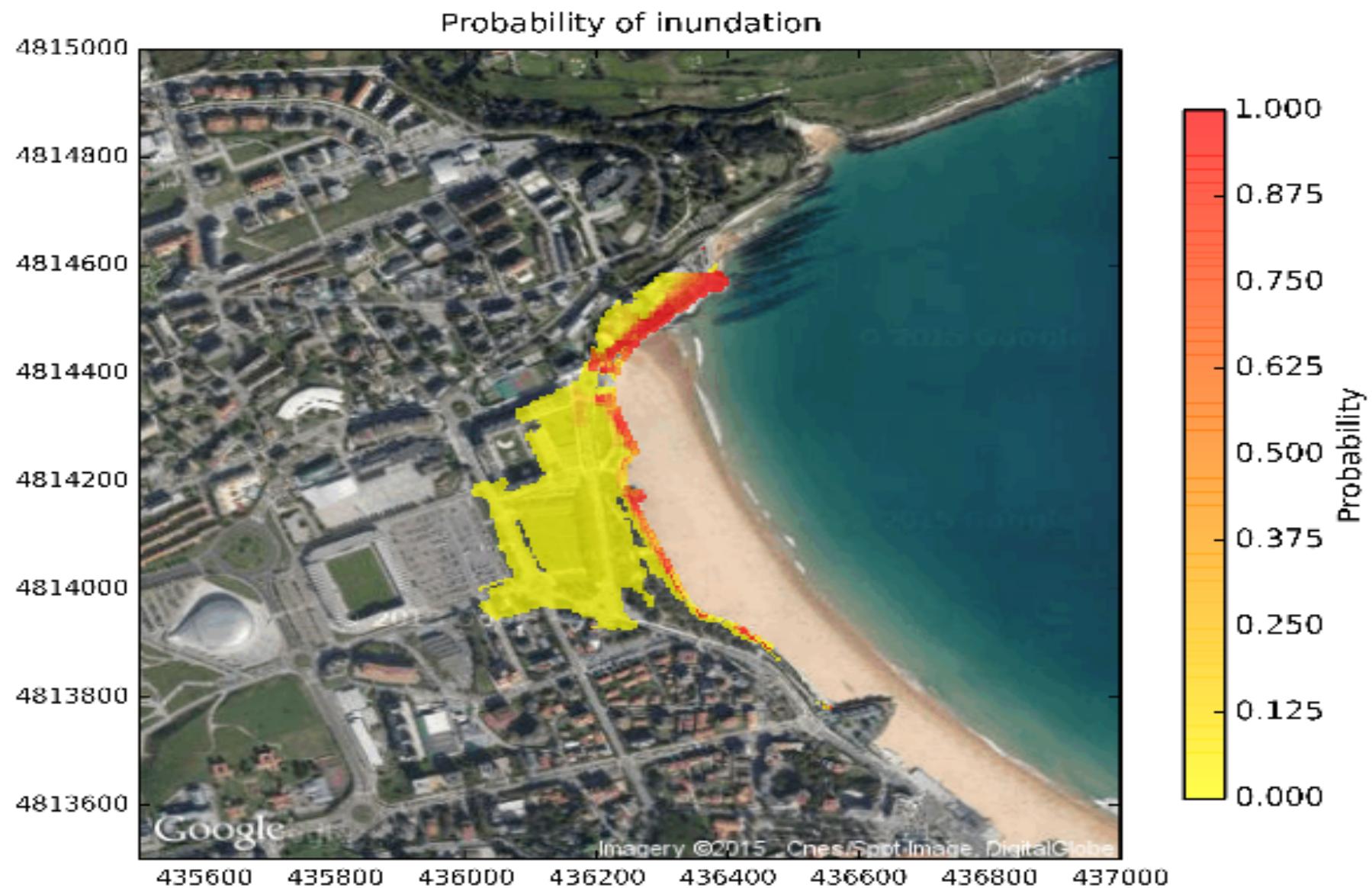
Coastal flood – Risk assessment

Ocurrence probability of each cluster of annual maxima, $p_i \quad \text{Sum}(p_i)=1$



$$R = \int prob \cdot consequences$$

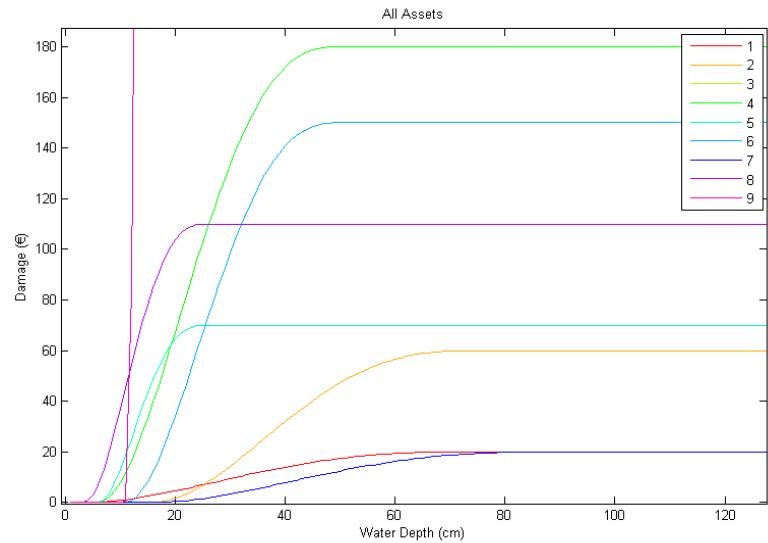
Coastal flood – Risk assessment



Damage Model

Based on local data and expert judgment
Beta CDF-type damage curve

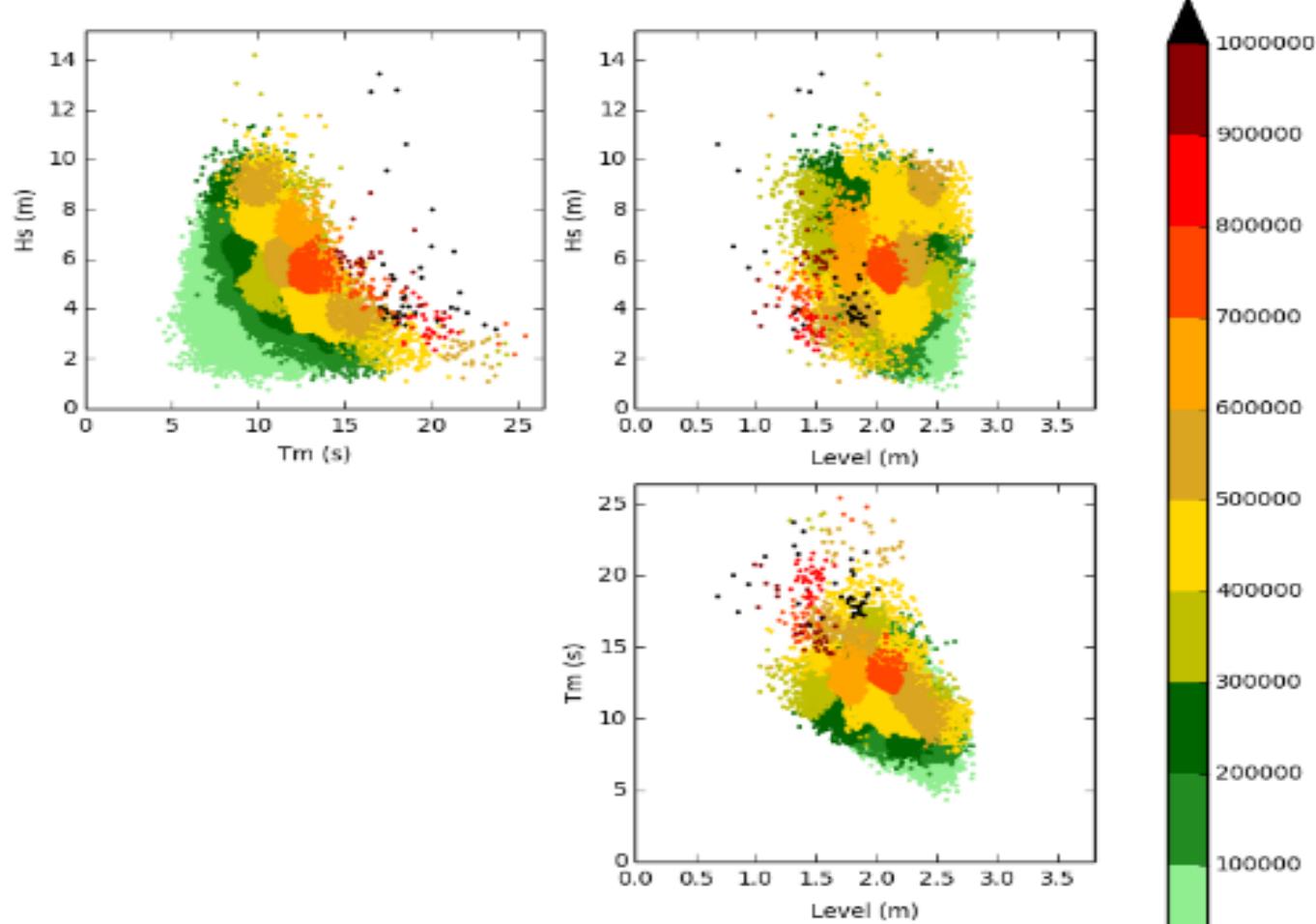
$$Damage_{unit\ i} = AssetValue_i * CDF((x-x_{mini})/(x_{maxi}-x_{mini}))$$



Code	Description	Uses	Thresholds (cm)	Maximum depth (cm)	Damage waves/depth	Indirect Damage	Asset Value (€/m²)
001	Urban Park-Garden	Recreational	5	150	(W) (D)	No	20
002	Urbanized pedestrian walk	Recreational	30	150	(W)	No	60
003	Business/Commercial	Economics/consumer Supply	20	100	(D)	Yes	150
004	Residential areas	Residence	10	100	(D)/(W)	Yes	180
005	Residential areas	Parking	10	50	D	Yes	70
006	Hotels	Touristic	20	100	D	Yes	150
007	Parking	Services	30	180	D	Yes	20
008	Sporting activities	Services	5	50	D	Yes	110
009	Electric infrastructure	Infrastructure	20	100	(D)	Yes	20,000

Coastal flood – Risk assessment

Associated damage to each simulated event (€)



$$R = \int prob \cdot consequences$$

Conclusions

- Coastal floods are **climate-related events of multivariate nature**. The combination of non-extreme conditions of different variables may produce an extreme impact.
- The **extrapolation of the joint density function** of the variables that influence coastal flooding **based on weather patterns** allows the analysis of extremes conditions in different time periods outside of the calibration one.
- Information of the probability of **the hazard must be combined with the consequence** information in order to obtain the potential losses due to flooding.
- The use of **metamodels and a simplified inundation model** allows to overcome computational constraints and therefore no assumptions on the joint probability density function are needed.

Acknowledgement



Thank you !

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