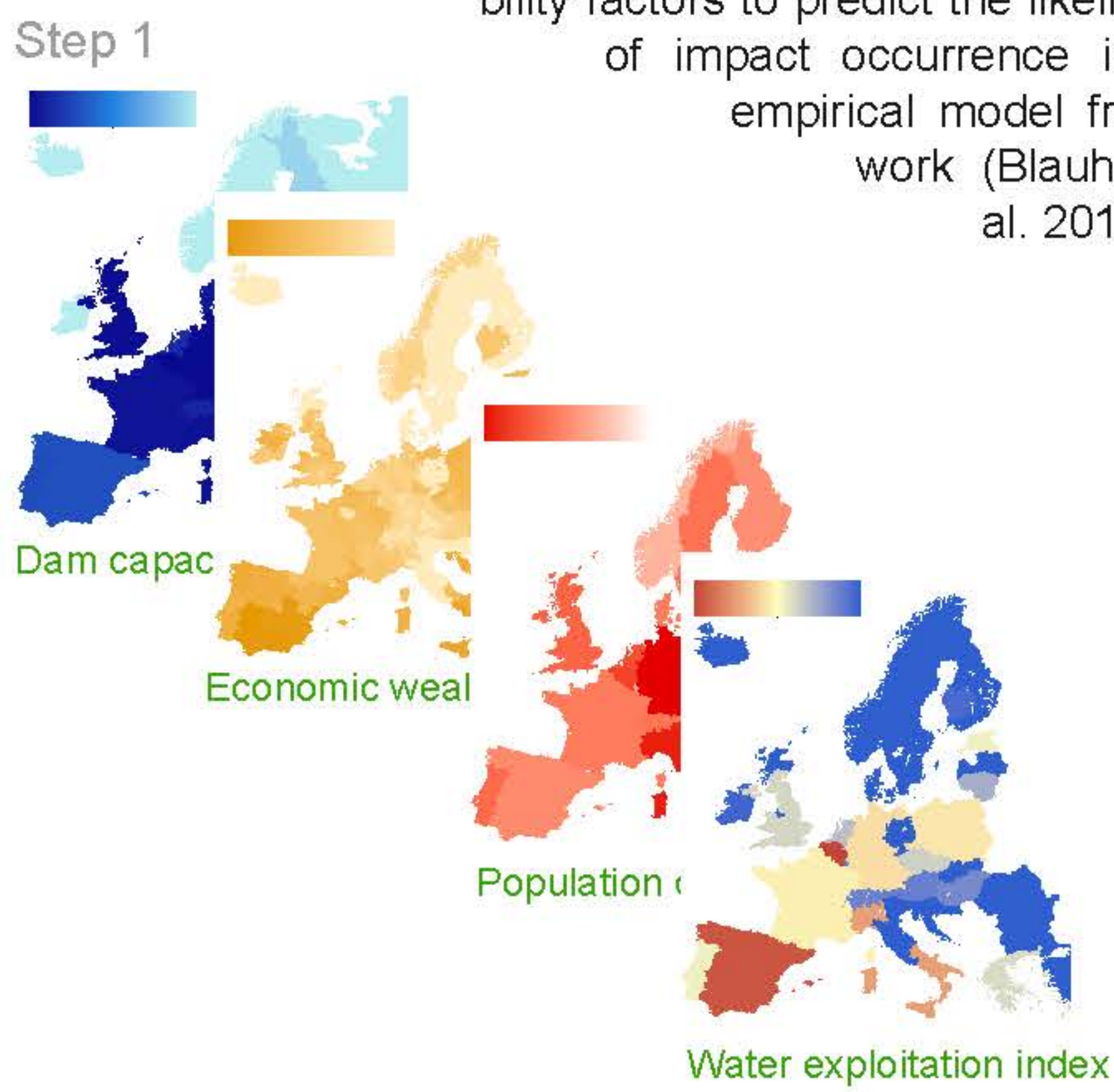


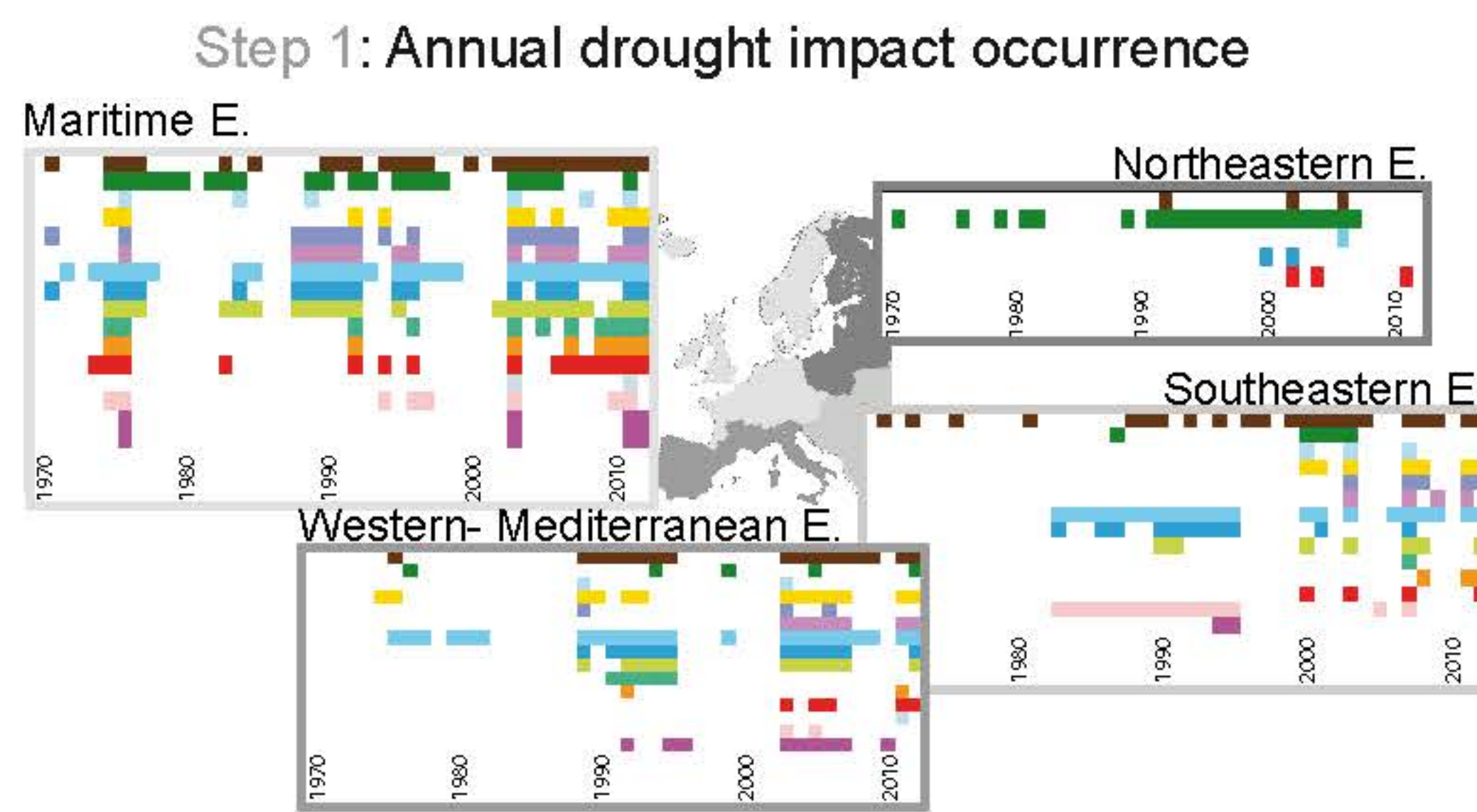
Introduction

Drought risk in general describes the probability of socio-economic and environmental systems to suffer negative consequences. In the framework of risk assessment, drought risk can be estimated from the risk analysis or vulnerability assessment perspective, combining hazard information either with (I) a quantification of impacts (damage) as a proxy for vulnerability: the impact approach, or with (II) a combination of vulnerability factors: the factor approach. Impact approaches mainly focus on specific sectors, whereas the majority of factor approaches estimates risk for entire systems. For both approaches, criteria for indices and factor selection applied are rather based on expert knowledge than empirical context.

This work introduces a novel hybrid approach combining hazard information and vulnerability factors to predict the likelihood of impact occurrence in an empirical model framework (Blauhut et al. 2015).



- Impact categories**
- Agriculture & Livestock f.
 - Forestry
 - Aquacultures & Fisheries
 - Energy & Industry
 - Waterborne transport.
 - Tourism & Recreation
 - Public Water Supply
 - Water quality
 - Freshwater ecosystems
 - Terrestrial ecosystems
 - Soil systems
 - Wildfires
 - Air quality
 - Human Health & Public S.
 - Conflicts

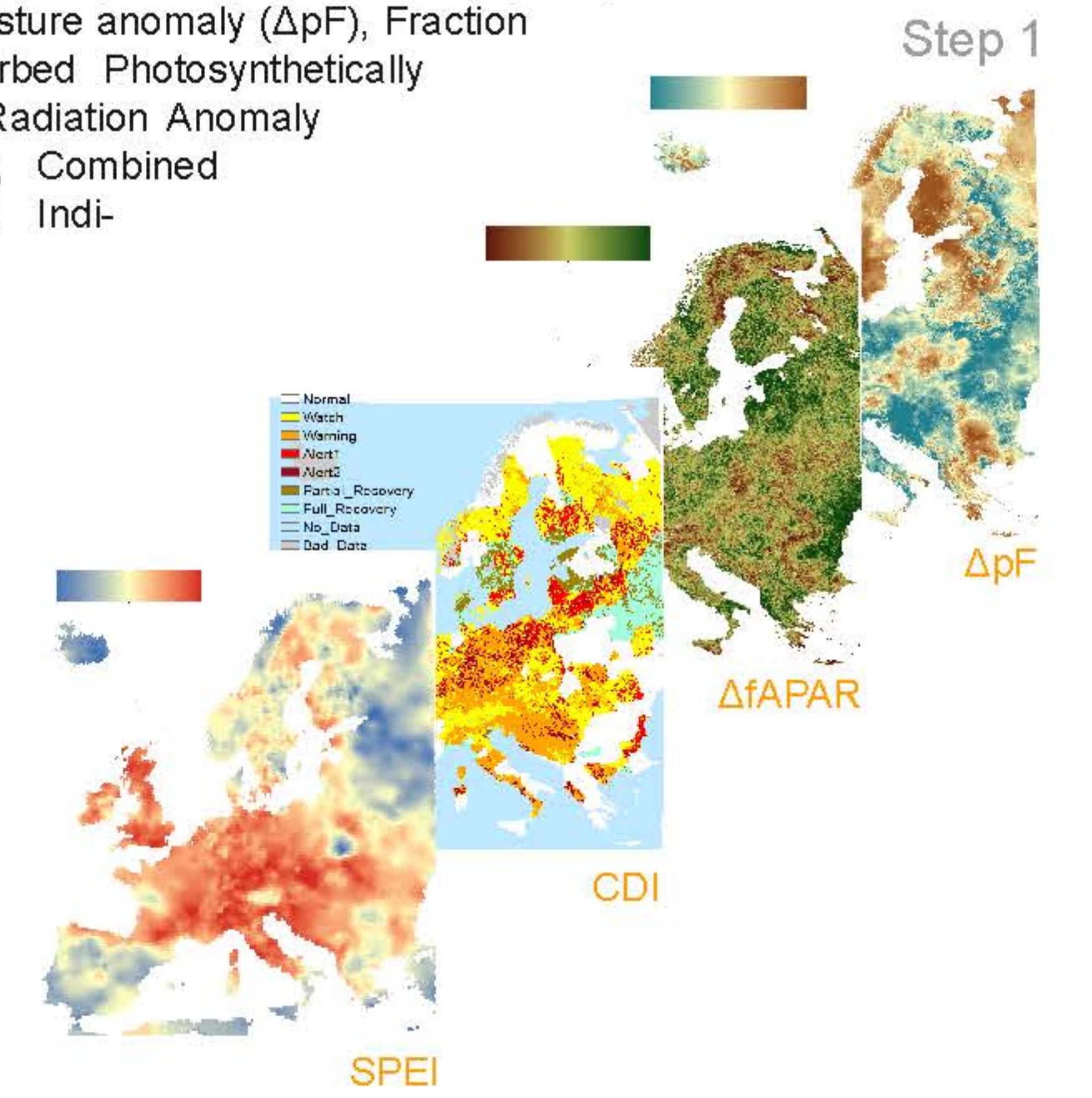


Data

Impact information: The EDII compiles reported information on the negative impacts of past drought events from a variety of information sources. All Reports are: spatially referenced, time stamped to at least the year of occurrence, assigned to one of fifteen impact categories and a number of impact types.

Vulnerability information: The collection of vulnerability data builds on the experience gained by De Stefano et al. (2015) and was complemented by additional data (e.g. landcover). Furthermore, combined vulnerability factors are analysed (e.g. adaptive capacity). In summary, 69 vulnerability factors were compiled.

Hazard information: The focus of this study is on drought indices that are most common, readily available, monitored, and used operationally for drought monitoring in Europe: Standardized Precipitation Index (SPI), Standardized Precipitation Evapotranspiration Index (SPEI), Soil moisture anomaly (ΔpF), Fraction of Absorbed Photosynthetically Active Radiation Anomaly (fAPAR), Combined Drought Indicator



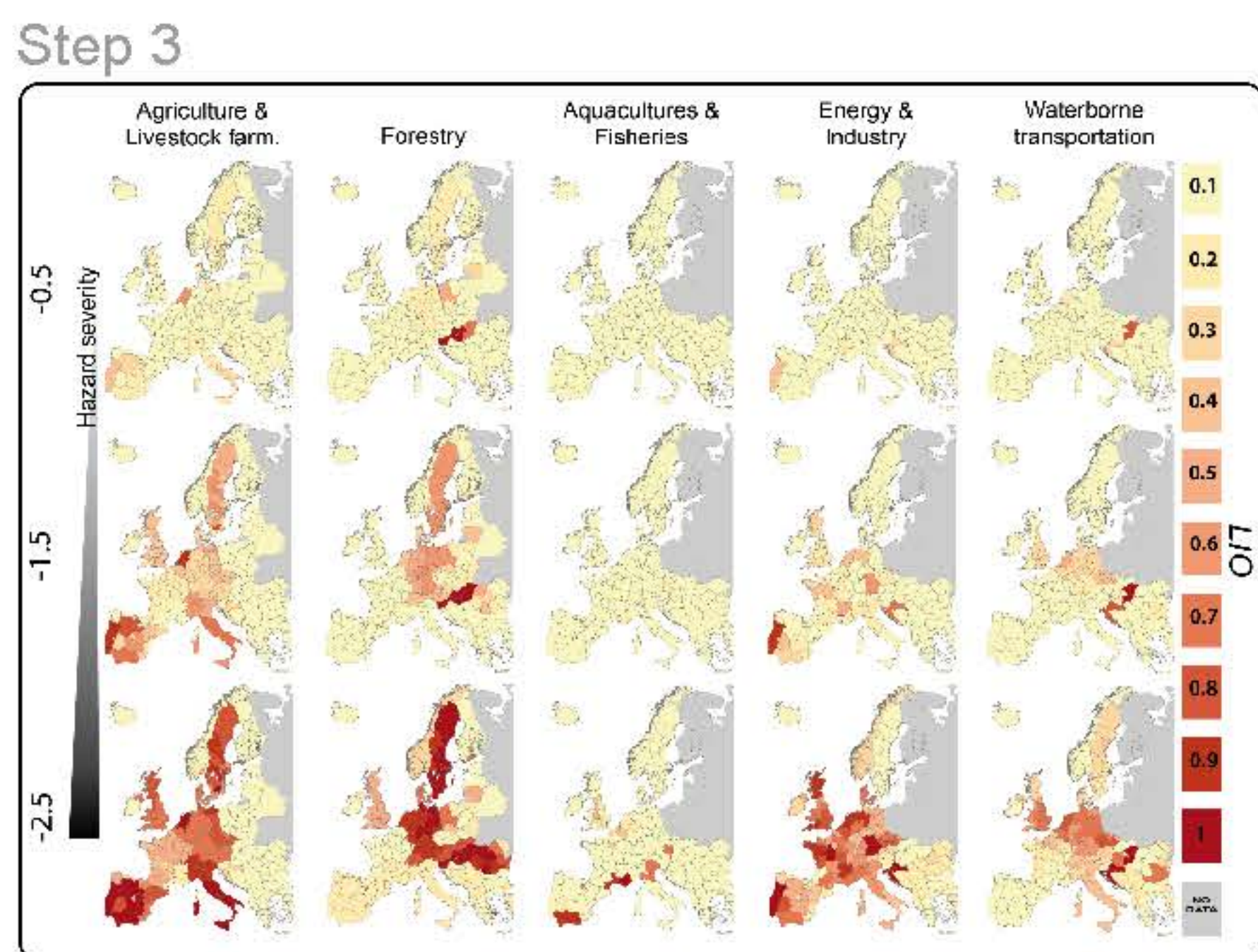
Methodology

Steps to pan-European drought risk maps:

Step 1: Aggregation of all input data to NUTS-combo level (climatologically comparable region across Europe, Blauhut et al. 2015), Hazard information: aggregation to monthly and annual information; vulnerability information: transformation to annual information, impacts: aggregation to binary & annual signal, due to a lack of comprehensive data, Europe was split into four climatological comparable macro regions for modelling (center)

Step 2: Analysis of the best combination of one or two hazard indices and up to three vulnerability factors by impact category and macro region based on stepwise multivariable logistic regression models (MLRMs). Starting with hazard indices, the best performing hazard index was selected by predictor significance (p-values) and model performance (AROC). Subsequently, not correlated predictors were selected by model improvement, measured by AROC and the Bayesian Information Criterion (BIC). Accordingly, further predictors were only chosen for the final MLRM if AROC increases or remains constant and BIC decreases.

Step 3: Application of MLRMs to construct drought risk maps for fifteen impact categories and for three hazard levels. For countries with a lack of sufficient vulnerability data, LIO was estimated using the best hazard-only model.



$$LIO = \log\left(\frac{LIO_N}{1 - LIO_N}\right) = \alpha_M + \sum (\beta_{j,M} \cdot V_N) + \sum (\beta_{l,M} \cdot H_N)$$

LIO = likelihood of impact occurrence
V_N = selection of vulnerability factors by NUTS-combo region
H_N = selection of hazard indicators by NUTS-combo region

Selected of best performing predictors, yellow: hazard indicator with short temporal aggregation, light yellow to brown: SPEI with increasing temporal aggregation (short-, medium-, with long temporal aggregation), light green: vulnerability factors associated with sensitivity, dark green: vulnerability factors associated with adaptive capacity, A = Area of, GW = Groundwater, norm = normalised, NC = NUTS-combo region, N2 = NUTS-2 region, SR = Socioeconomic relevance, WR = Water

Impact category	Hazard Predictor 1	Hazard Predictor 2	Hazard Predictor 3	Vulnerability Predictor 4	Vulnerability Predictor 5
Maritime	A&L	SPEI03 Jun	SPEI03 Jun	Groundwater resources	A inland water bodies, ratio of NC
	Fo	SPEI03 Jun	SPEI24 Nov	Population density and age	Water balance
	A&F	SPEI03 Jun	SPEI24 Nov	Dams & O&I resources	
	E&I	SPEI03 Jun	SPEI01 Jun	A agriculture	Water resources
	WT	SPEI03 Jun	SPEI24 Dec	Groundwater resources	Water body status
	T&R	SPEI03 Jun	SPEI24 Dec	Groundwater resources	A inland water bodies, ratio of NC
	PWS	SPEI24 Dec	SPEI04 Jun	Water use	A artificial surfaces
	WQ	SPEI03 Jun	SPEI03 Dec	Dams & O&I resources, norm	A agriculture, ratio of NC
	FE	SPEI03 Jun	SPEI03 Dec	Groundwater resources	A agriculture, ratio of NC
	TE	SPEI03 Jun	SPEI01 Feb	O&I resources, norm	WR industry
Southeastern	SS	SPEI03 Jun	SPEI03 Jun	Drought management tool	A inland water bodies, ratio of NC
	WF	SPEI03 Jun	SPEI03 Jun	Drought management tool	Economic wealth
	AD	SPEI03 Jun	SPEI03 Jun	Drought management tool	
	H&P	SPEI03 Jun	SPEI03 Jun	Groundwater resources	Water resources development
	Co	SPEI03 Jun	SPEI03 Jun	Groundwater resources	Economic wealth
	A&L	SPEI03 Jun	SPEI01 Dec	Population density+NZ	A artificial surface, ratio of NC
	Fo	SPEI03 Jun	SPEI01 Feb	A NUTS-combo region	Dams capacity
	A&F	SPEI03 Jun	SPEI03 Jun	Water use	
	E&I	SPEI03 Jun	SPEI03 Dec	WR services	A artificial surfaces, ratio of NC
	WT	SPEI03 Jun	SPEI01 Sep	Public participation	A agriculture, ratio of NC
Northern	T&R	SPEI03 Jun	SPEI03 Jun	Population density and age	A artificial surfaces, ratio of NC
	PWS	SPEI03 Jun	SPEI03 Sep	Population density and age	Water body status
	WQ	SPEI03 Jun	SPEI03 Sep	Aquatic ecosystem status	A of lakes within region
	FE	SPEI03 Jun	SPEI03 Sep	Aquatic ecosystem status	
	SS	SPEI03 Jun	SPEI01 Aug	Drought management tool	
	WF	SPEI03 Jun	SPEI01 Feb	Drought management tool	
	H&P	SPEI03 Jun	SPEI03 Oct	Aquatic ecosystem status	A forest, ratio of NC
	Co	SPEI03 Jun	SPEI03 Oct	Aquatic ecosystem status	
	A&L	SPEI03 Jun	SPEI03 Jun	A agriculture, ratio of NC	Groundwater resources
	Fo	SPEI03 Jun	SPEI03 Jun	A wetlands, ratio of NC	Population density and age
Western-Mediterranean	A&L	SPEI03 Jun	SPEI03 Jun	A agriculture	WR services
	Fo	SPEI03 Jun	SPEI03 Jun	A agriculture	Drought management tool
	A&F	SPEI03 Jun	SPEI04 Mar	A wetlands, ratio of NC	A lakes within region
	E&I	SPEI03 Jun	SPEI03 May	A inland water bodies	Water exploitation index
	WT	SPEI03 Jun	SPEI03 May	Population density and age	Water use
	T&R	SPEI03 Jun	SPEI03 Dec	Aquatic ecosystem status	
	PWS	SPEI03 Jun	SPEI03 Dec	Aquatic ecosystem status	Socioeconomic relevance agr
	WQ	SPEI03 Jun	SPEI03 Dec	Aquatic ecosystem status	A lake within region
	FE	SPEI03 Jun	SPEI03 May	A semi-natural areas	A agriculture, ratio of NC
	SS	SPEI03 Jun	SPEI03 Dec	Population density and age	A not impreg agr, ratio of NC
WF	SPEI03 Jun	SPEI03 Dec	Aquatic ecosystem status		
H&P	SPEI03 Jun	SPEI03 Dec	Aquatic ecosystem status	A wetlands, ratio of NC	
Co	SPEI03 Jun	SPEI03 Dec	A semi-natural areas	Population density and age	
Short	Medium	Long temporal aggregation	Sensitivity	Adaptive capacity	

