# A Spatially Transferable Drought Hazard and Drought Risk Modeling Approach Based on Remote Sensing Data Maximilian Schwarz, Tobias Landmann, Natalie Cornish, Karl-Friedrich Wetzel, Stefan Siebert and Jonas Franke

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#### Introduction

As a result of climate change, an increased frequency of extreme weather events including droughts is predicted (IPCC 2013). Droughts adversely affect vegetation conditions and agricultural production and consequently the food security and livelihood situation of the often most vulnerable communities. In spite of recent advances in modeling drought risk and impact, coherent and explicit information on drought hazard, vulnerability and risk is still lacking over wider areas. The aim of this study was to develop a spatially transferable drought hazard, vulnerability and risk modelling framework reflecting regional conditions, that is based on remote sensing data and time series crop yields data from the Food and Agriculture Organization (FAO).

# Globe Drought

## Methods

A logistic regression model was developed to predict drought hazard for rangelands and croplands in the USA. The cross-verified model was transferred and calibrated for South Africa and Zimbabwe, where the plausibility of the model was evaluated by using regional climate patterns, published drought reports and through visual comparison to a global drought risk model and food security classification data. The drought hazard model used time series crop yields data from the Food and Agriculture Organization Corporate Statistical Database (FAOSTAT) and biophysical predictors from satellite remote sensing (SPI, NDII, NDVI, LST, albedo).



Modeled drought hazard in the Missouri Basin (USA) compared to the U.S. Drought Monitor (dotted polygons) for agricultural, grass- and shrubland in a drought (2012, left) and non-drought year (2016, right).

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### **Results and Discussion**

The model results in the USA showed a good spatiotemporal agreement within the crossverification with the United States Drought Monitor (USDM), using visual interpretation, while the model in Southern Africa also performed well according to the evaluation of the results. Additionally, the McFadden's Pseudo R<sup>2</sup> value of 0.17 indicated a good model fit for South Africa. Drought risk and vulnerability were assessed for Southern Africa and could be mapped in a spatially explicit manner, showing, for example, lower drought risk and vulnerability over irrigated areas. This developed modeling framework can be applied globally, since it uses globally available datasets and therefore can be easily modified to account for country-specific conditions.

#### Conclusion

This study presented a satellite data-driven logistic regression model that can model drought hazard for agricultural areas, grass- and shrubland biomes while being spatially transferable. The model addressed the gap between global drought models, that cannot accurately capture regional droughts, and sub-regional models that may be spatially explicit but not spatially coherent. The approach of this study can potentially be used to identify risk and priority areas and possibly in an early warning capacity while enhancing existing drought monitoring routines, drought intervention strategies and the implementation of preparedness measures.



(center) and the Global Drought Observatory (https://edo.jrc.ec.europa.eu/gdo/php/index.php ?id=2001) (bottom) for the month February in 2016.



urban areas and drought risk is presented for crop-, grass- and shrubland additionally excluding urban areas.