A review of drought indices: predominance of drivers over impacts and the importance of local context

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Abstract. Drought monitoring and Early Warning Systems (DEWS) are seen as helpful tools to tackle drought at an early stage and reduce the possibility of harm or loss. They usually include indices attributed to meteorological, agricultural and/or hydrological drought: physically based drought drivers. These indices are used to determine the onset, end and severity of a 10 drought event. Drought impacts are less monitored or even not included in DEWS. Therefore, the likelihood of experiencing drought impacts is often simply linearly linked to drivers of drought. The aim of this study is to evaluate the validity of the assumed direct linkage between drivers of drought and drought impact. We reviewed scientific literature on both drivers and impacts of drought. We conducted a bibliometric analysis based on 5000+ scientific studies in which selected drought indices (drivers) and drought impacts were mentioned in relation to a geographic area. Our review shows that there is a tendency in 15 scientific literature to focus on drivers of drought, with the preferred use of meteorological and remotely sensed drought indices. Studies reporting drought impacts are more localised, with relatively many studies focusing on Sub-Saharan Africa and Australasia for impacts with regard to food security and water security, respectively. Our review further suggests that drought-impacts studies are dependent on both the physical and human processes occurring in the geographic area, i.e. the local context. With the aim of increasing the relevance and utility of the information provided by DEWS, we argue in favour 20 of additional consideration of drought impact indices oriented towards sustainable development and human welfare.

1 Introduction

Drought is a threat to a wide range of human activities in virtually all climate zones and countries (Van Loon et al., 2016;Bachmair et al., 2016;Van Lanen et al., 2017). It is an elusive phenomenon without a clear onset and demise. In contrast to other hazards such as floods, landslides or earthquakes, drought has a creeping nature causing impacts to persist for many 25 years (Kim et al., 2019). Consequently, impacts can be cumulative for consecutive periods of droughts, devastating both ecosystems and societies (Bachmair et al., 2016;Van Lanen et al., 2017).

Many concepts exist for defining a drought (Santos Pereira et al., 2009;Lloyd-Hughes, 2014). Definitions of drought are either conceptual or operational. Conceptual definitions of drought are descriptive and highlight the natural hazard element: for example, precipitation below what is expected or normal (Knutson et al., 1998). Operational definitions of drought highlight

30   practical implications in an attempt to identify the onset, severity, and cessation of drought periods (Mishra and Singh, 2010).
For example, the UN Convention to Combat Drought and Desertification (UN Secretariat General, 1994) defines drought as
"*when precipitation has been significantly below normal recorded levels, causing serious hydrological imbalances that
adversely affect land resource production systems*"

The numerical value of hydro-climatic variables is associated to three main types of drought: meteorological, agricultural (or

35   soil moisture) and hydrological droughts. These variables are in fact drivers, which refer to the contributing or counteracting
factors that affect the development of droughts (Seneviratne, 2012). Those drivers are used by many drought studies as the
framework to represent drought propagation. The temporal propagation of drought is often considered to be a sequence
occurring in an almost linear order (Wilhite and Glantz, 1985;Zargar et al., 2011;Bachmair et al., 2016), and in which humans
have no direct influence. This is a simplification of a complex process, where it is considered that an anomaly (e.g. lower

40   precipitation, higher temperature than average) or a standardised normalisation of the values of those drivers will lead to a
cascade reaction influencing the magnitude of other physical variables and leading in turn to the subsequent type of drought.
As such, hydrological drought results from persistence in duration of agricultural (soil moisture) drought, which itself is due
to persistence of meteorological drought.

Drought monitoring and Early Warning Systems (DEWS) aim to monitor the drivers of drought to predict drought. They aim

45   to tackle drought at an early stage to reduce the possibility of harm or loss. For assessing the severity of a drought, physical
variables are usually translated into indices of drought. The difference between their values and the threshold used to define
the level of dryness is considered to depict the severity of a drought (Vogt et al., 2018). Drought impacts, such as water- and
food security, are rarely continuously monitored or even included in DEWS. This is understandable as there is already a
plethora of definitions for drought and drought types, and there are at least as many possibilities for defining impacts (Mishra

50   and Singh, 2010;Wilhite, 2000;Santos Pereira et al., 2009). Drought impacts are non-structural, difficult to quantify or
monetise, and can be direct or indirect due to the extended nature, in time and area, of drought (Wilhite et al., 2007;Logar and
Van den Bergh, 2011;Bachmair et al., 2016). But in the current configuration of DEWS, the presumed likelihood of
experiencing impacts is mainly linked to the severity of climatic features only (e.g. :(US National Drought Mitigation
Center;Princeton Flood and Drought Monitors;Brazilian Drought Monitor).

55   The aim of this study is to review scientific reporting on drought drivers and drought impacts for affected regions and analyse
how these two compare. This research aims to improve understanding on the linkage and separation between drought drivers
and drought impacts, and to provide directions to further improve the accuracy of the information provided by DEWS. We
retrieved scientific studies from categorised geographic areas in which selected drivers of drought and impacts of drought are
mentioned. The components of drought drivers and impacts on which the literature focused were explored and compared for

60   different areas of the world.

2 Data and Methods

2.1 Methodological approach

The methodological approach comprises three steps:

Step 1. Exploring which drought drivers are the most recurrent in the scientific literature. We investigated which indices of
65 drought drivers are most frequently used in scientific drought-related studies and to what drought type they were linked. For each of these scientific studies we also retrieved the country of focus. This allowed us to identify: the most frequently mentioned type of drought for different geographic regions, and the prevalent drought indices used in scientific studies.

Step 2. Exploring which drought impacts are the most recurrent in the scientific literature. In contrast with drought drivers, for drought impacts there are no established indices commonly used in DEWS and in scientific studies. We thus retrieved from
70 scientific articles, keywords associated to drought impacts related to water security and food security. This allowed the identification of the most frequently mentioned water- and food-related drought impacts.

Step 3. Comparing the findings of Steps 1 and 2. This enabled evaluation of the alignment between reported drought types and impacts, with regard to the number of publications and differences in geographic focus.

2.2 Data

75 We considered the number of studies about drought indices and drought impacts, respectively, and their geographical distribution as our metrics. We selected commonly used indices to depict operational types of droughts (Svoboda and Fuchs, 2016) and the indices commonly used by water managers (Bachmair et al. (2016). This resulted in 32 indices that we linked to three main drought types (Table 1): meteorological (9 indices), soil moisture/agricultural (15) and hydrological (8) drought.

Meteorological Drought indices studies	Total number of studies of drought indices : 5567		Total number of studies mentioning a country: 4023		Studies not mentioning a country : 27.7%	Top 3 subject area
"Meteorological drought" Indices mentioned in the study	Acronym	Input data	Number of studies	Studies mentioning a country	Portion of studies not mentioning a country (%)	
Standardized Precipitation Index	SPI	Precipitation	2451	1812	26.1	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Standardized Precipitation	SPEI	Precipitation, temperature	1059	751	29	1) Environmental Science 2) Earth and Planetary Sciences

Evapotranspiration Index						3) Agricultural and Biological Sciences
Aridity Index	AI	Precipitation, temperature	247	182	26.3	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Precipitation Deciles	Deciles	Precipitation	12	9	25	1) Earth and Planetary Sciences 2) Environmental Science 3) Engineering
Keetch-Byram Drought Index	KBDI	Precipitation, temperature	84	66	21.4	1) Environmental Science 2) Agricultural and Biological Sciences 3) Earth and Planetary Sciences
Palmer Drought Severity Index	PDSI	precipitation, temperature, available water content	1279	867	32.2	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Percent of Normal Precipitation (Index)	PNPI	Precipitation	23	18	21.7	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Rainfall Anomaly Index	RAI	Precipitation	304	244	19.7	1) Earth and Planetary Sciences 2) Environmental Science 3) Agricultural and Biological Sciences
Self-Calibrated Palmer Drought Severity Index	scPDSI	Precipitation, temperature, available water content	108	74	31.5	1) Earth and Planetary Sciences 2) Environmental Science 3) Agricultural and Biological Sciences
Agricultural and Soil Moisture Drought indices studies	**Total number of studies of drought indices : 5085**		**Total number of studies mentioning a country: 3137**		**Studies not mentioning a country : 38.3%**	**Top 3 subject area**
"Agricultural drought" Indices mentioned in the study	**Input data**		**Number of studies**	**Studies mentioning a country**	**Portion of studies not mentioning a country (%)**	
Crop Moisture Index	CMI	precipitation, temperature	43	20	53.5	1) Earth and Planetary Sciences

						2) Agricultural and Biological Sciences
						3) Environmental Science
Evaporative Stress Index	ESI	Remotely sensed potential evapotranspiration	88	42	53.3	1) Agricultural and Biological Sciences
						2) Earth and Planetary Sciences
						3) Environmental Science
Evapotranspiration Deficit Index	ETDI	soil water in the root zone on a weekly basis, which is computed from SWAT model	17	13	23.5	1) Environmental Science
						2) Earth and Planetary Sciences
						3) Agricultural and Biological Sciences
Enhanced Vegetation Index	EVI	NIR/red/blue surface reflectances, canopy background adjustment, coefficients of the aerosol resistance for correction for aerosol influences in the red band.	305	206	32.2	1) Earth and Planetary Sciences
						2) Environmental Science
						3) Agricultural and Biological Sciences
Normalized Difference Vegetation Index	NDVI	Spectral reflectance measurements acquired in the red and near-infrared regions	2041	1288	36.9	1) Earth and Planetary Sciences
						2) Environmental Science
						3) Agricultural and Biological Sciences
Leaf Area Index	LAI	Leaf and ground area	1152	583	49.4	1) Agricultural and Biological Sciences
						2) Environmental Science
						3) Earth and Planetary Sciences
Palmer Moisture Anomaly Index – known as the Palmer Z index	PZI	Derivative of the PDSI calculation precipitation, temperature, available water content	47	30	36.2	1) Earth and Planetary Sciences
						2) Environmental Science
						3) Agricultural and Biological Sciences
Soil Adjusted Vegetation Index	SAVI	Spectral reflectance measurements acquired in the red and near-infrared regions, with the addition of a soil brightness correction factor	68	37	45.6	1) Agricultural and Biological Sciences
						2) Environmental Science
						3) Earth and Planetary Sciences
Soil Moisture Anomaly	SMA	precipitation, temperature, available water content	138	87	37.0	1) Earth and Planetary Sciences
						2) Environmental Science
						3) Agricultural and Biological Sciences

			Number of studies	Studies mentioning a country	Portion	Top 3 subject area
Soil Moisture Deficit Index	SMDI	soil water in the root zone on a weekly basis, which is computed from SWAT model	13	10	23.1	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Soil Water Deficit Index	SWDI		33	26	21.2	1) Earth and Planetary Sciences 2) Environmental Science 3) Agricultural and Biological Sciences
Soil Water Storage	SWS	available water content, reservoir, soil type, soil water deficit	717	494	31.1	1) Agricultural and Biological Sciences 2) Environmental Science 3) Earth and Planetary Sciences
Vegetation Condition Index	VCI	(same as) NDVI	271	187	30.1	1) Earth and Planetary Sciences 2) Environmental Science 3) Computer Science
Vegetation Drought Response Index	VegDRI	SPI, PDSI, percentage annual seasonal greenness, start of season anomaly, land cover, soil available water capacity, irrigated agriculture and defined ecological regions	14	13	7.1	1) Earth and Planetary Sciences 2) Environmental Science 3) Agricultural and Biological Sciences
Vegetation Health Index	VHI	NDVI and brightness temperature, both from thermal bands	138	101	26.8	1) Earth and Planetary Sciences 2) Environmental Science 3) Computer Science
Hydrological Drought indices studies	**Total number of studies of drought indices : 550**		**Total number of studies mentioning a country: 344**		**Studies not mentioning a country : 37.5%**	**Top 3 subject area**
"Hydrological drought" Indices mentioned in the study		**Input data**	**Number of studies**	**Studies mentioning a country**	**Portion of studies not mentioning a country (%)**	
Reservoir Level		Water levels in reservoirs	72	35	51.4	1) Environmental Science 2) Engineering 3) Earth and Planetary Sciences
Palmer Hydrological Drought Index (PHDI)	PHDI	precipitation, temperature, available water content	58	34	41.4	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences

			Number of studies	Studies mentioning a country	Portion of studies not mentioning a country (%)	
Streamflow Drought Index	SDI	Streamflow values	180	117	35	1) Environmental Science 2) Agricultural and Biological Sciences 3) Earth and Planetary Sciences
Standardized Runoff Index	SRI	*"Runoff"*	106	69	34.9	1) Environmental Science 2) Earth and Planetary Sciences 3) Engineering
Standardized Streamflow Index	SSFI	Streamflow data	85	56	34.1	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Streamflow anomaly		Streamflow data	9	8	11.1	1) Environmental Science 2) Earth and Planetary Sciences 3) Agricultural and Biological Sciences
Standardized Water-level Index	SWI	Groundwater well levels	17	13	23.5	1) Environmental Science 2) Earth and Planetary Sciences 3) Social Sciences
Surface Water Supply Index	SWSI	Reservoir storage, streamflow, snowpack and precipitation	23	12	47.8	1) Environmental Science 2) Engineering 3) Social Sciences
Drought impacts studies	**Input data**		**Number of studies**	**Studies mentioning a country**	**Portion of studies not mentioning a country (%)**	
Food security	Food security, famine, hunger, malnourishment, malnutrition, agricultural loss.		4764	2601	45.4	1) Agricultural and Biological Sciences 2) Environmental Science 3) Social Sciences
Water security	Water security, water access, water availability, water crisis		805	506	37.1	1) Environmental Science 2) Social Sciences Engineering 3) Earth and Planetary Sciences

80 **Table 1: Table of the drought indices and impacts sought in studies retrieved from Scopus. Their acronym, input data when applicable, total number of studies and number of studies mentioning a country, are detailed.**

We opted for Scopus to retrieve the scientific publications of interest as it is the database covering the largest range of both, peer-reviewed literature type (scientific journals, books and conference proceedings), and disciplinary fields (science,

85   technology, medicine, social sciences, and arts and humanities) (Scopus, 2021). We then searched in the Scopus database for
queries strictly including "drought" AND "[the indicator]" in the title, abstract and authors' keywords of the studies. We
repeated the queries for each indicator individually as we were interested in knowing country-based preferences. The sum of
the individual indices linked to drought queries returned 4137 articles for the "meteorological" drought type of indices, 2799
articles linked to "agricultural" drought and 393 articles linked to "hydrological" drought. The title, authors, author's keywords,

90   year of publication, journal name and abstract were retrieved using the Bibliometrix package (Aria and Cuccurullo, 2017)
executed on R (version 4.0.0) following Addor and Melsen (2019). In the title, keywords and abstract of each paper, names of
countries were identified, corresponding to the area of application of the study. The same approach was followed for the
drought impacts. We grouped drought impacts into two focus categories: food security and water security. Their keywords are
indicated in Table 1. The queries included "drought" AND selected "[drought impact]". This resulted in 4764 articles linking

95   drought to food security and 805 articles linking drought to water security.

All articles were published between 1960 and March 2021 and the exact queries for both drought indices and impacts are
included in Table A1. Even though we recognise drought can impact ecosystems, this topic was excluded from the analysis
for reasons of brevity. The dataset and the script used for its analysis are both available for consultation (Kchouk et al., 2021).

Many scientific studies are methodological; their goal can be the validation, calibration or improvement of the indices, thus,

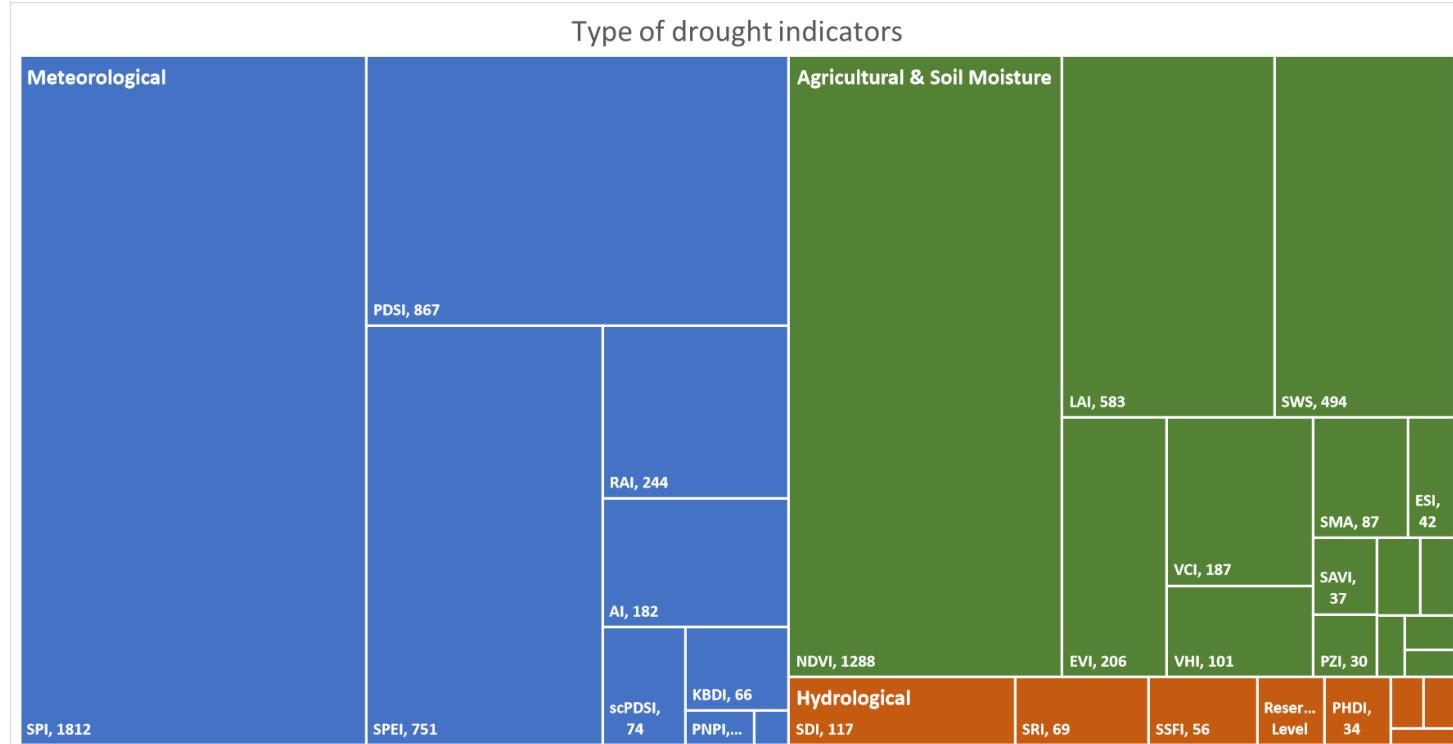
100   not all studies have a focus country. We only considered studies mentioning a country in their title, abstract and keywords;
this being the only criteria of inclusion or rejection of papers in our analysis. This reduced the number of studies including a
name of a country in their title, abstract and keywords by 28% for drought indices and by 44% for drought impacts. We also
did a manual verification on some of the scientific studies to see if the association with a country was valid. This allowed us
to bring some corrections to the metadata to avoid incorrect associations (e.g. removing mentions of the "Indian Ocean" that

105   led to the incorrect association of the studies to India ; removing the copyrights, generally in the end of the abstract, referring
to another country than the one of the study).

3 Results

3.1 Drought types and indices

The indices mentioned in the drought-related studies were classified according to the categories used in Table 1; their frequency

110   of occurrence is shown in Fig. 1. Meteorological drought (MD) indices are reported most frequently, followed by agricultural
or soil moisture drought indices (AD), and hydrological drought indices (HD). The most frequently mentioned indicator is the
Standardised Precipitation Index (SPI), followed by the Normalised Difference Vegetation Index (NDVI). HD indices are less
frequently utilised in comparison to the two other categories.

115 **Figure 01: Treemap showing the proportion of indices for different drought types (blue is meteorological, green is agricultural and soil moisture drought, and orange is hydrological drought) employed in the title, abstract and keywords of drought-related studies on Scopus. The number indicates the number of studies including a country in their title, abstract or authors' keywords.**

For the regions of Australia-Oceania, Middle-East and North Africa (MENA) and Sub-Saharan Africa (SSA), there are fewer

120 studies utilising HD indices than for the other regions (Fig. 2). Further geographical differences are observed from Fig. 2. Most areas resemble the overall pattern shown in Fig. 1; exceptions are Australia-Oceania and Sub-Saharan Africa, where AD indices are most frequently reported.

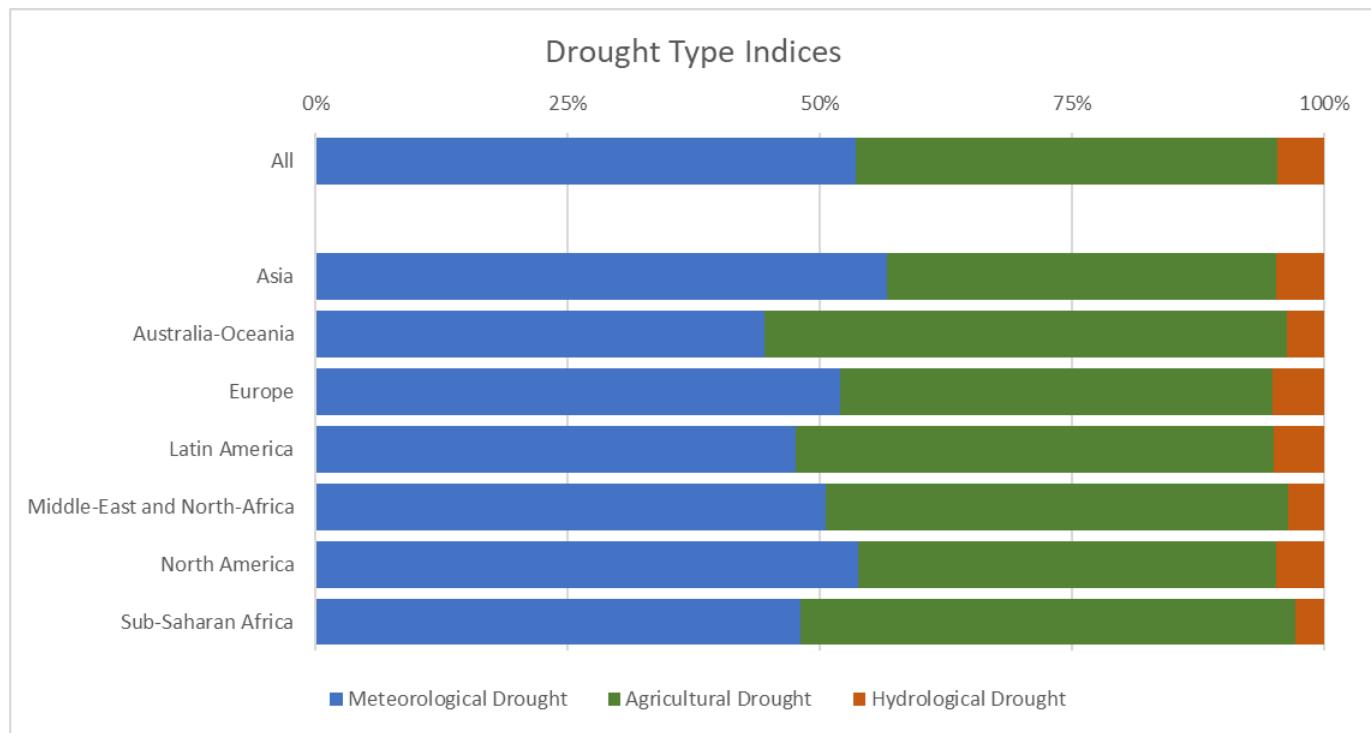



Figure 02: Barplot showing the proportion of drought type studies per region of the world, according to the drought indices referred
125   **to in the title, abstract and keywords of drought-related studies on Scopus.**

In addition, not only are MD indices the most investigated, they are also the most associated with a country in studies, in

comparison to AD, HD and impacts (Table 1). MD indices represents 53 % of the scientific studies while AD represents 42 %

and HD, only 5 %. This indicates that in most of the studies, rainfall and the temperature are the dominant criteria utilised to

report the occurrence of drought. Such a result is expected because of the ease of use of MD indices. We further develop this

130   point in Sect. 4.3.

3.2 Drought-related impacts: food security and water security

Globally, there were five times more studies linking drought to food-security than drought to water-security (Fig. 3). This

pattern is the same for most areas of the world. For Sub-Saharan Africa the predominance of food security indices is most

pronounced (93%), followed by Asia and Europe (84%). Australia-Oceania is the only region where drought-related water

135   security studies predominate over food security studies (52%), while Sub-Saharan Africa is the region where it is reported the

least (6.6%).

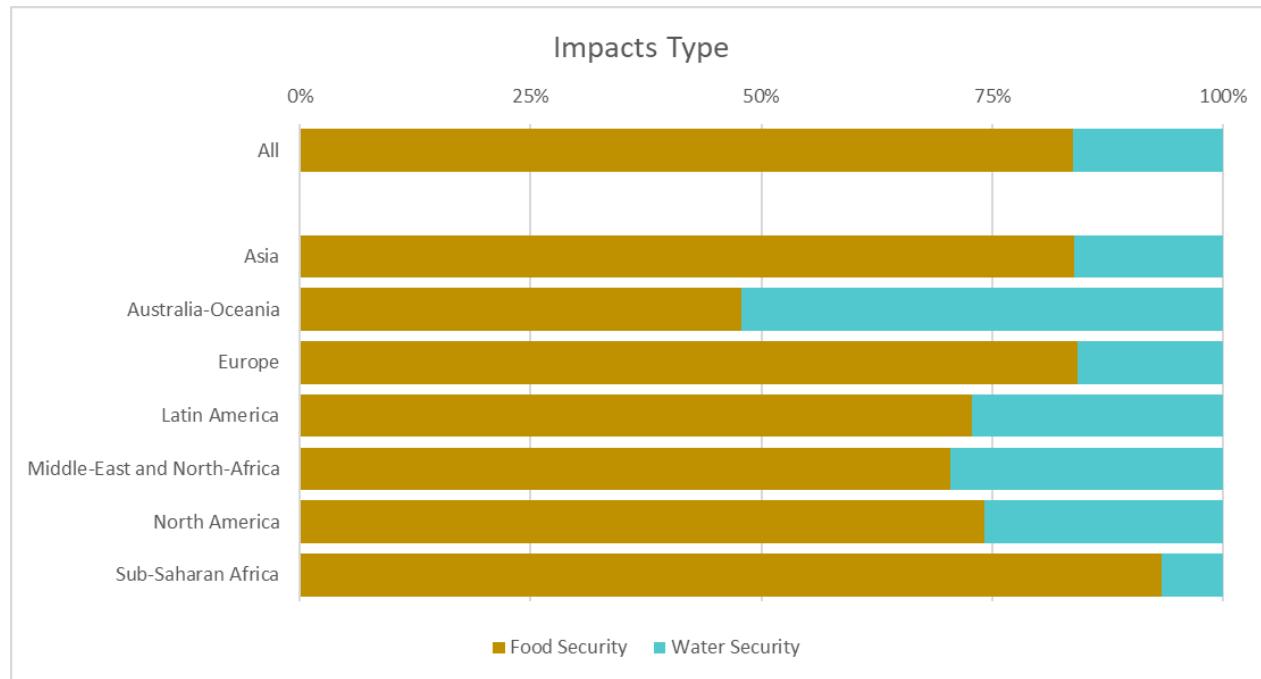



Figure 03: Barplot showing the proportion of food and water security studies related to drought per region of the world on Scopus.

3.3 Geographic patterns for indices of drivers and impacts

140 Figure 4 shows that drought-drivers studies are quite evenly distributed across the regions except for SSA. The height of the dark blue boxes is substantially smaller than the others, suggesting that the share of SSA in drought-drivers studies is minor.

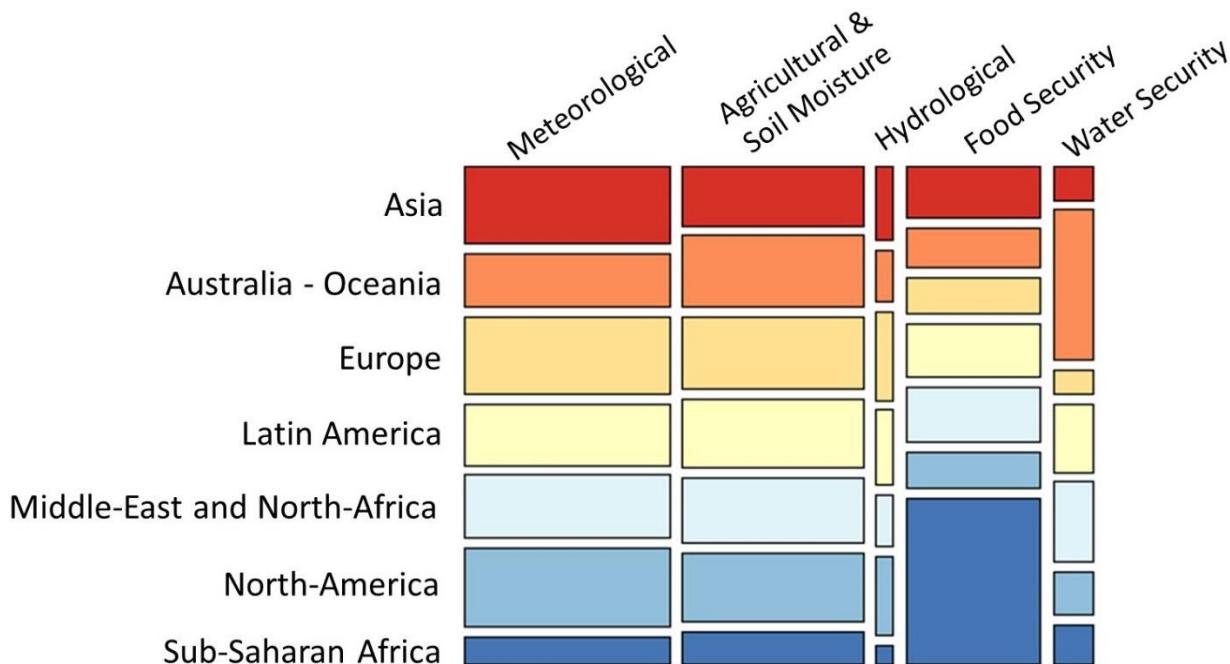



Figure 04: Mosaic plot showing how frequently keywords, being the types of drought and impacts, were mentioned in the titles, abstracts, and keywords in drought-related studies on Scopus. The height (vertical) of each box indicates how frequently the keyword is used for each region (the frequency was scaled by the number of papers for each region, that is, the plots show the keyword frequency if all the regions had an equal number of papers). The width (horizontal) of each box indicates the relative frequency of each keyword.

In the same way, two geographical patterns appear in the share of drought-related impacts studies. The height of the boxes of
150   SSA and Australia-Oceania for food and water securities, respectively, related to drought is significantly superior to those of
the other regions for the same indicator category. This means that food security related to drought is most frequently reported
for SSA and that water security related to drought is most frequently reported for Australia-Oceania. Similarly, drought-related
water security is least reported for Europe.

The geographical pattern of drought drivers and impact studies seen in Fig.4 is also present in the cartogram representations
155   in Fig. 5. First, the three drought drivers categories appear to have the same pattern of investigation, all mostly focused on
northern high-income countries. The United States and Mexico, North-Mediterranean countries and Australia-Oceania are
strongly focusing on drivers in drought-related studies. Middle-income countries with high demographic and economic growth
such as China, India and Iran also see a focus on drought-related drivers. They stand out from their geographic neighbours that
are almost disappearing from the map.

DRIVERS

IMPACTS

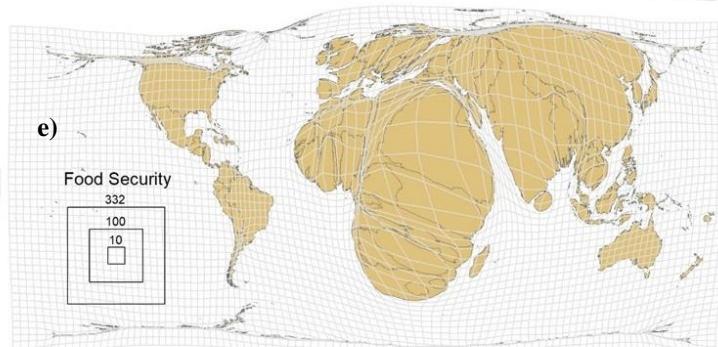
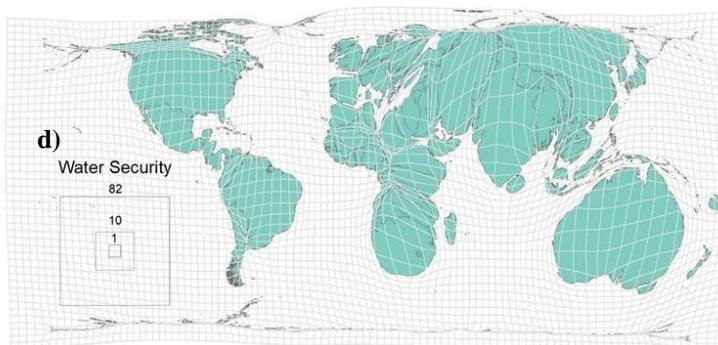
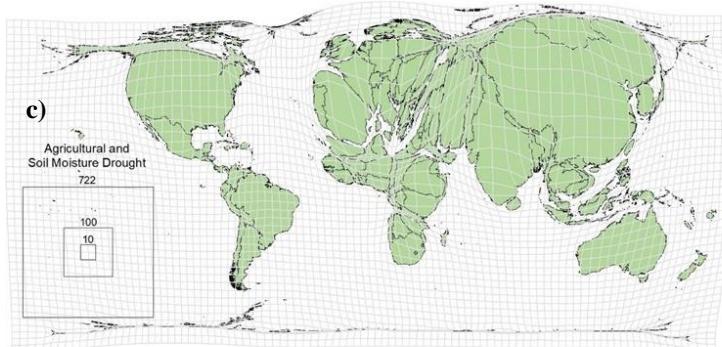
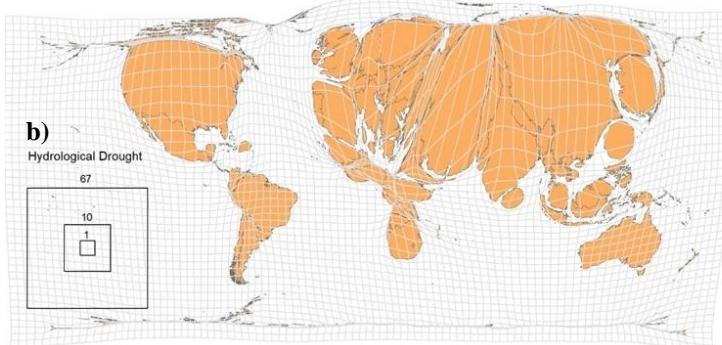
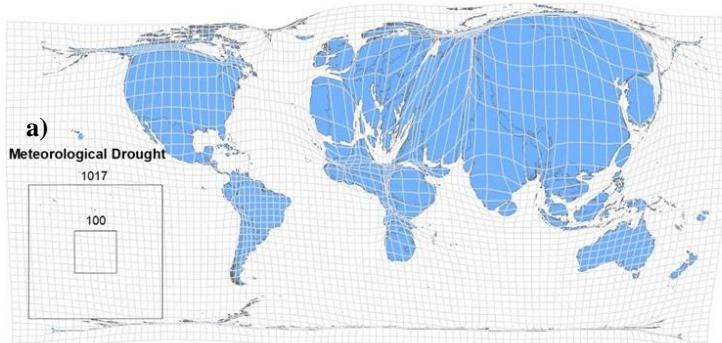



Figure 05 : Contiguous cartograms (Gastner-Newman) of the world with each country rescaled in proportion to the number of studies on Scopus related to drought and a) Meteorological drought indices b) Hydrological drought indices c) Agricultural and Soil Moisture drought indices d) Food security e) Water security

In contrast, the African continent is strongly under-represented in terms of drought drivers studies, particularly with regard to meteorological and hydrological drought indices, with notable exceptions for Ethiopia, Kenya and South Africa. However, the

distribution of agricultural and soil moisture drought studies appears to be more even in African countries, and higher in Sahelian countries.

Looking at the geographical repartition of drought-related impacts studies (Fig. 5d and 5e), two main observations are notable.
170 First, the repartition of the impacts studies differs from the drivers studies. Second, both impacts, food and water security, show a different geographic pattern. Water security related to drought is most frequently investigated for Australia, the USA and Mexico, Brazil, the Middle East and South Africa. In contrast, food security is most commonly investigated for India, Ethiopia, Kenya and other African countries.

4 Discussion

175 This bibliometric study shows that unbalanced attention is given to drought drivers and impacts across the world. In this discussion section, we start by raising four hypotheses to explain why some features of drought are more frequently reported for some regions or countries than for others. The four hypotheses relate to: physical conditions (Sect. 4.1), socio-economic conditions (Sect. 4.2), data availability (Sect. 4.3), and scientific interests and orientation (Sect. 4.4). We continue by discussing potential limitations in our methodological approach (Sect. 4.5). We posit that these four hypotheses are also the four
180 dimensions that are inherent to the local context of a geographic area. Drought monitoring is influenced by these to accurately predict droughts, their severity and impacts. In that sense, we end by formulating recommendations (Sect. 4.6) about shifting the scope of drought metrics to match the local context of a specific drought events.

4.1 Physical conditions

185 The most notable result from Sect. 3 is the more abundant investigation of MD over AD and HD (except in SSA and Australia-Oceania), with the SPI being the most used indicator in drought-related studies.

By focusing on MD, it is mainly the deficit of precipitation that is investigated. In humid areas, tropical, continental or temperate climates, a deficit of precipitation is less likely to affect the overall physical water scarcity and cause water shortage. In that sense, the occurrence of a drought is only statistically-based and not reflecting a true water deficit for the demand, only
190 a below average situation (which is, however, in line with formal definitions of drought). In arid and semi-arid climates with lower levels of precipitation, it is recommended to use SPI cautiously because it can fail to indicate drought occurrence (Wu et al., 2007) and opt instead for indices that include evapotranspiration like the SPEI (Salimi et al., 2021). In such areas where evapotranspiration plays a larger role with regard to evaporative demand, water shortage is more common. For arid and semi-arid areas with low average rainfall and a higher risk of water scarcity, it may be more appropriate to determine water deficit
195 at the crop, field or farm scale. This could explain the more frequent use of AD indices in the more arid Australian-Oceanian and Sub-Saharan regions (Fig. 2 & 4) that mainly monitor vegetation (NDVI, LAI) and soil water content (SWS) (Fig.1).

For some AD indices, there is both an upper and a lower limit that is independent of whether the climate of the area is arid or humid: vegetation health or soil water content are or are not frequently deteriorated or in deficit, respectively. In that sense, AD drought indices are relevant for any type of climate. However, SPI and most MD and HD indices, are statistical values showing a deviation from average and standardised for all climates. Even if they remain meaningful, drought is more challenging in dryer climates rather than wet climates. This key point is dismissed because of the statistical and standardising propensity of MD and HD indices, in contrast to the values of AD indices that are a practical interpretation of hydro-climatic features (e.g. of the reflectance, in the case of NDVI and LAI).

4.2 Socio-economic conditions

SSA combines the lowest number of studies about drought indices with the highest proportion in terms of drought impacts (Fig. 4). Even though SSA is known to experience a rise of temperatures and an increase of aridity in the past, present and future by observation and model projections (Niang et al., 2014;Serdeczny et al., 2017) the reported impacts in the Emergency Database (EM-DAT) are scarce (Harrington and Otto, 2020). Yet, the International Disaster Database (EM-DAT) run by the Centre for Research on the Epidemiology of Disasters (CRED), has the most complete and global records of past natural and human-made disasters events (Guha-Sapir et al., 2012).

Most of SSA is in a situation of economic water scarcity (Molden, 2013), implying a lack of human, institutional and financial capital to satisfy the demand for water, even in areas where the physical availability of water is not limited. The symptoms described by Molden (2013) associated to economic water scarcity include scant infrastructure development, either small or large scale, meaning that populations experience difficulties obtaining sufficient water to meet agricultural or domestic needs. Applying the same reasoning, drought mitigation or monitoring bodies and scientific publications are a product of human, institutional and financial capital. Thus, it is likely that drought drivers are under-investigated in SSA, leading to the same effects of economic water scarcity: water and food insecurities. Also, the report of impacts of extreme weather in SSA to disaster databases as EM-DATA are predominantly conducted by non-governmental organisations rather than governments, often as a side product of their main task to identify the location with the greatest need for humanitarian aid (Harrington and Otto, 2020).

In some areas, food insecurity can be a cumulative result of a dry climate and high pressure on natural resources enhanced by rapid demographic growth. Countries such as Bangladesh, China, Ethiopia, India, Indonesia and Pakistan, have some of the highest number of drought-related food security publications (Fig. 5). Most of these countries have high fertility rates and rapid population growth (United Nations, 2019;Vollset et al., 2020). According to the Food and Agriculture Organization (FAO (2010)), the majority of the world's undernourished people live in these six countries and over 40% live in China and India alone. The same applies for the countries of SSA, presenting the highest population growth rate in the world (World Bank, 2019), the highest number of drought-related food security publications (Fig. 5), and 22% of the population being undernourished (FAO, 2019). A rapid population growth increases the challenge of adequately meeting nutritional needs as

food production depends on croplands and water supply, which are under strain as human populations increase. This suggests
230   that countries with arid climates and a high demography are more exposed to food security impacts.

Moreover, populations of low income countries are the most exposed to drought-related food insecurity. In the world's poorest countries, around 30 percent of GDP comes from agriculture; those countries are mostly concentrated around the Sahelian region: Mali (37.4% of GDP), Niger (35.4%), Chad (46.1%), Central African Republic (31.9%), Sudan (31.2%), Kenya (31.1%) and Ethiopia (34.7%) (World Bank, 2016). As we can see from Fig.5 FS, those countries are most commonly reporting
235   food security impacts related to drought. In contrast, in OECD economies - regarded as developed and high-income countries – agriculture accounts for less than 1.5 percent of GDP (World Bank, 2016). In the same way, we note the fewest amount of publications related to food security in those OECD countries. Also, in these Sahelian countries, agriculture accounts for more than 80% of the livelihoods (FAO, 2021). As more people rely on agriculture for their livelihood, they are more exposed to natural hazards like drought and thus vulnerable to food-insecurity and the poverty trap.

240   **4.3 Data availability**

The SPI is the most widely used index in drought-related studies (Table 1 and Fig. 1). This can be explained by its ease of use: First, it only requires (monthly) precipitation data, easy to monitor by use of rainfall gauge networks or satellite estimation. Second, SPI reference values exist so they can be compared and are applicable in all climate regimes. Finally, SPI can be computed for different periods of time including periods of record containing missing-data, even though it ideally needs at
245   least 30 years of monthly precipitation data (WMO, 2012).

However, all these strengths are at the same time weaknesses. The SPI will provide in all cases an output whatever inputs are used (Svoboda and Fuchs, 2016). As an example, a significant quantity of zero precipitation values at short time scales may lead to biased values of the SPI, because the rainfall might not fit for the recommended gamma distribution, which is a fundamental first step of the SPI calculation (Wu et al., 2007). This scenario is applicable to dry climates with a distinct dry
250   season when calculated for periods shorter than 12 months. As mentioned in section 4.1, an index including an additional temperature parameter to account for evapotranspiration is more suitable for such areas. As we can see in Figure 6, many countries with dry climates (Iran, Australia and Pakistan) commonly use the SPI in their drought-related studies. In those dry contexts, it has been proposed to focus on the duration of the drought rather than only its severity (Wu et al., 2007). However, even short-lived dry spells often combined with heatwaves of a few days, characteristic of dry climates, when occurring during
255   the reproductive stage of crop development can be enough to ravage an entire harvest leading to food insecurity (Hatfield and Prueger, 2015).

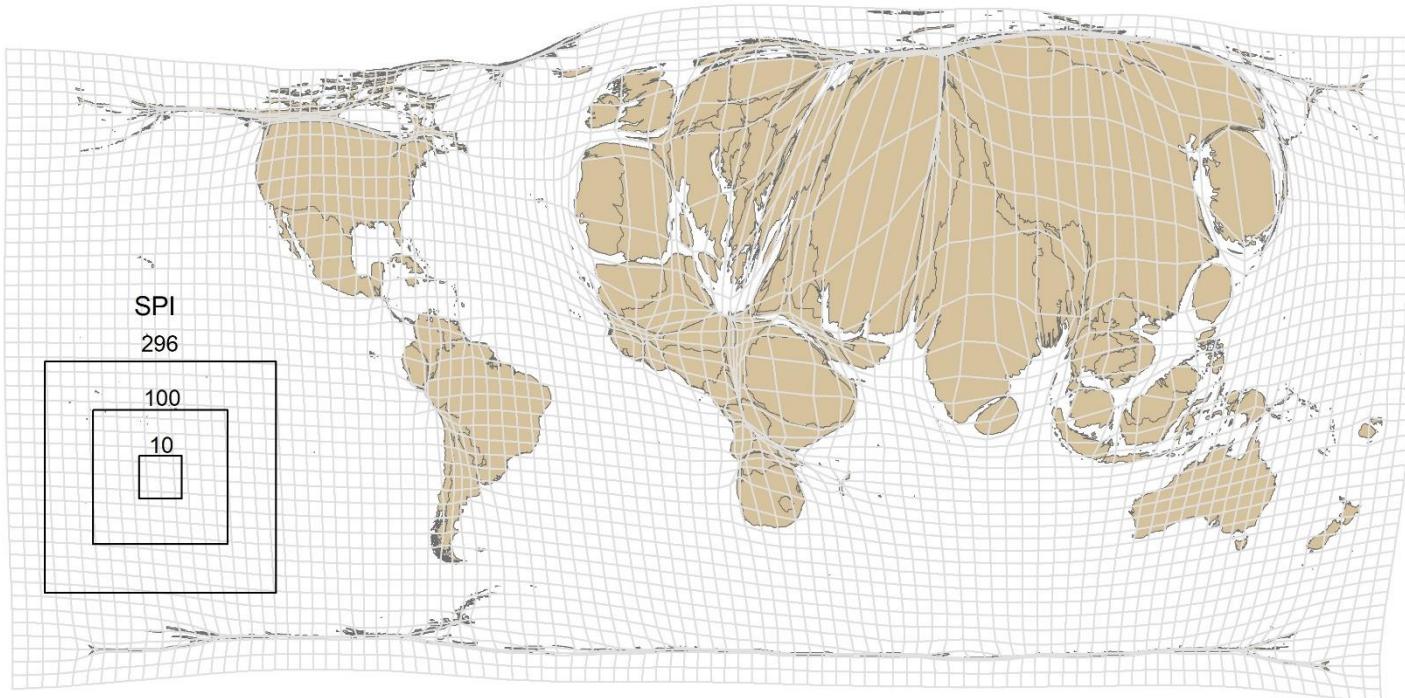



Figure 6: Contiguous cartograms (Gastner-Newman) of the world with each country rescaled in proportion to the number of studies on Scopus related to drought and the SPI

260   Most of the MD indices, beyond the SPI, are sensitive to the quantity and reliability of the data to fit the distribution. Their calibration requires a recommended 30 to 50 years of data. However, only very few regions of the world possess such an abundant historical hydrometeorological database. This is particularly challenging for developing countries. According to the World Bank (2018), two thirds of the hydrological observation networks in developing countries are reported to be in poor or declining condition. The distribution of rain gauges across SSA is eight times lower than the WMO minimum recommended

265   level, and while coastal West and Southern Africa, and the East Africa Highlands of Kenya and Uganda are relatively well represented, areas of greater aridity are severely underrepresented (Walker et al., 2016). Consequently, reanalysis rainfall products are also less reliable for these more arid regions due to a lack of ground truthing data (Walker et al., 2016). The availability of data seems to be closely tied with the socio-economic condition of a country. As mentioned in Section 4.2, countries exposed to economic water scarcity generally experience a lack of capital to satisfy the demand for water and a lack

270   of an extensive and well-maintained hydro-climatic monitoring network. Therefore, most of the countries of SSA are underrepresented or absent from publications related to drought indices, while high-income countries commonly report them (Fig.5).

The same applies for HD indices studies that are under-reported in SSA (Fig 3, 4 & 5). River flow monitoring networks in SSA are experiencing a similar decline to meteorological monitoring networks (Walker et al., 2016). However, globally, little

275   attention seems to be given to the monitoring of HD indices (Fig. 1 &2). One reason could be that a "hydrological" drought is

seen by many as a drought impact, and there is a demonstrable lack of extensive monitoring of drought impacts (Lackstrom et al., 2013;Pozzi et al., 2013;Wilhite et al., 2007).

As Table 1 shows, NDVI – a remotely sensed index – is the most commonly used in agricultural drought-related studies. Only 3 out of the 15 agricultural drought indices are not remotely sensed. Just like the HD indices, this can reflect (i) the lack of
280 hydrometric (field) observations or (ii) if they exist, a lack of sharing and access to them (Bachmair et al., 2016). Bachmair et al. (2016) highlight how "*the scarcity of water status observations, especially for groundwater, reflects the common focus on drought seen through the lens of rainfall and soil moisture that can be easily (remotely) monitored and/or modelled*". Indeed, the data needed to calculate AD indices seem more accessible. The most used index is the NDVI and requires land surface imagery containing both red and infrared bands and processing software; global NDVI datasets are available open source at
285 relatively high spatiotemporal distributions. As there are no requirements for historical data for calibration or a monitoring network, this could explain why the African continent more prominently reports AD than MD and HD (Fig. 5).

It is important to realise that data availability may be closely tied to the year of implementation of the drought indices. Indeed, hydro-climatic databases have different ages and dataset quality according to the country, but it can also be possible that the implementation of drought indices is a precursor of hydro-climatic data monitoring.

290 **4.4 Scientific interest and orientation**

As mentioned previously, in DEWS, the indices linked to the three categories of drought are seen as drivers as they are used to determine the occurrence and severity of a drought. However, as shown in Sections 3 and 4.3, the distinction between drought drivers and impacts, based on hydro-climatic variables, is not always clear. First, the linear representation of drought implies that AD and HD are an impact of MD. Yet the indices used for MD have a different scope to those used for AD and
295 HD. Taking the example of the most used indices, the SPI has a temporal focus with a strong statistical perspective on drought. Whereas for AD, the NDVI has a "spatial distribution" focus as it uses remote sensing to indirectly determine water-limitation in the vegetation at a specific time, like a snapshot of the vegetation health. In that sense, the NDVI measures a drought impact.

Moreover, water security is often confounded with hydrological drought. However, as we can see from Fig. 5d and Fig. 5e, the areas where each HD and WS are reported in scientific studies are not the same, suggesting that the occurrence of the first
300 does not imply the other. In that sense, the literature seemingly indicates that HD is not the only driver of WS.

The scientific reporting about drought suggests its risk of occurrence in an area and potentially an initiative of preparation for related damages. Though for each country, it is likely that drought is investigated according to: (i) a determined scientific approach, more physical or social; (ii) a purpose, in the sense of what is at greatest risk of being impacted by drought.

As shown in Table 1, most of the drought-drivers indices are investigated under the domain of environmental, Earth and
305 agricultural sciences, suggesting a more physically-based approach. Food and water securities related to drought, respectively more reported in SSA and in Australia-Oceania (Fig. 5), are also studied through the scope of physical sciences but unlike the drivers, also through the lens of social sciences (Table 1).

Food security is a complex concept that is looked at in a holistic way. Food systems underpin food security and they are the result of the production, processing, distribution, preparation and consumption of food. These steps are themselves the results
310 of dynamic interactions between and within the bio-geophysical and human environments (Gregory et al., 2005). Thus, its study requires the intervention of different specialists. Food systems encompass three main components : *"(i) food availability (with elements related to production, distribution and exchange); (ii) food access (with elements related to affordability, allocation and preference) and (iii) food utilisation (with elements related to nutritional value, social value and food safety)"* (Gregory et al., 2005). Hence, when food systems are stressed, food security is affected. As food security depends on many
315 components, it stands vulnerable to the disturbance of any of them. These components can be disturbed by a range of factors that can be environmental, like droughts, but also circumstantial like conflict, changes in international trade agreements and policies, HIV/AIDS (Gregory et al., 2005). Food insecurity can be enhanced when these factors are combined. SSA is an area particularly prone to extreme heat-related impacts heatwaves, as we mentioned in Sect. 4.2, but also to these circumstances. SSA holds : (i) more than 95% of farmed land relying on rainfed agriculture (Wani et al., 2009) ; (ii) about 75% of the world
320 HIV/AIDS prevalence as of 2016 (Odugbesan and Rjoub, 2019); (iii) 19 of the 43 economies with the highest poverty rate, all classified as in fragile and conflict-affected situations (Corral et al., 2020). Thus, food security related to drought studies in SSA may also be related to the implication of these social processes.

Australia, known to be the driest inhabited continent (Hill, 2004), has a "*National Plan for Water Security"*(Government of Australia, 2007) that comprises a variety of mechanisms addressed by national and state governments (Cook and Bakker,
325 2012). Water security is also aimed to be addressed in an integrative and multi-scale way by "*taking action on climate change, using water wisely, securing water supplies and supporting healthy rivers and wetlands"*(Government of Australia, 2007).

Besides Australia, the fact that water security is reported for countries with extreme differences in socio-economics, such as countries in the Sahel and the USA (Fig. 5), suggests the experience of different types of water security. The definition of "water security" by UN Water (2013) is quite holistic. A population's access to adequate quantities of acceptable quality water
330 has the goal to sustain three areas: livelihoods, human well-being, and socio-economic development (Montanari et al., 2013). Countries at different stages of development are more likely to focus on one of those three areas. Human well-being related to water-security can have many different understandings (Jepson et al., 2017;Hoekstra et al., 2018). Those can vary from one extreme to the other, as enough water for sanitary purposes, e.g. sanitation and showers, to indulgent leisure (E.g. swimming pools and gardens (Savelli et al., 2021;Bradley and Bartram, 2013;Willis et al., 2010)). In South Africa, experiences of Cape
335 Town Day Zero's water crisis were diametrically different amongst the wealthy elite and the township dwellers. The first went through restrictions to water their garden and fill up their swimming pools while the second had insufficient water to take showers and go to the toilet (Savelli et al., 2021). Livelihoods and socio-economic development can also be understood and applied in different ways: from subsistence farming (Makurira et al., 2011) to agrobusiness and irrigation of crops meant for export (e.g. California (Morris and Bucini, 2016)). The same can apply to food security: from malnutrition (Belesova et al.,
340 2019) to the genetic adaptation of fruits and vegetable strains to droughts (Belesova et al., 2019;Basu et al., 2016).

Therefore, not only can areas be exposed to food and/or water insecurities, but they can be exposed to different declinations and severity within each. Water and food insecurities are very context specific, not even attributable to the country scale but to smaller areas. They are the result of complex and multi-disciplinary mechanisms, including social processes in addition to the physical ones. Thus, to be accurately monitored, drought-related water and food insecurities also need multi-disciplinary
345 metrics. This comes in contradiction with drought indices that measure drought severity by looking only at the hydro-climatic component. Consequently, by eluding (the monitoring of) social processes that can trigger and enhance drought impacts, drought indices seem to be formulating an incomplete forecast of the severity of droughts.

4.5 Limitations

The inability to deduce a cause-and-effect relationship between two variables, solely on the basis of an observed association
350 or correlation between them is common to all disciplines. The same applies for drought drivers and drought impacts even in drought prone areas. It is difficult to state if droughts are the cause of impacts, aggravator of existing impacts, or if those "impacts" were pre-existing conditions and not linked to the occurrence of drought events. Without continuous and widespread monitoring of drought impacts, the societal pattern enabling understanding of how drought is experienced differently and why, will not be identified. Therefore, the attempt of explaining the geographical repartition of drought-related
355 impact studies by linking some features of drought to one or many of the four hypotheses detailed above, as per this study, remains then purely hypothetical.

Our approach separated studies by geography, principally at sub-continental scale. Other divisions on which to base our analysis could have been applied, like climatic or income levels, and may have led to additional insights. However, separating studies by geographical region allowed highlighting of: (i) both physical and socio-economic similarities expected in
360 homogenous geographic areas; (ii) countries standing out. This enabled the investigation of potential justifications.

Disparities exist inside countries, where, for example, areas are wealthier than others or experience different climates. This applies particularly to larger countries such as the United States, China, Brazil and India. Therefore, it is possible that in some large countries, more prosperous areas might be centralising the background work and the studies on drought indices. It is also possible that physical, socio-economic, data availability and interest disparities may also exist inside countries. However,
365 because our drought metrics investigation and analysis is at the country level, our discussion is also generalised to that scale. Getting rid of that aggregative propensity and grasping those regional disparities would have required an investigation at the scale of within-country regions (e.g.: California Central Valley, Brazilian semi-arid). Yet, it is mostly the name of the countries that are used in publications on Scopus. Moreover, that level of detail and analysis would be more appropriate for comparative studies between chosen semi-arid regions of the world rather than a broader study, like this one, where similar focus on drought
370 and drought impacts indices are examined.

The studies we obtained and analysed were a result of using Scopus, rather than another abstract and citation database, and of how we formulated our queries. Our search was constrained to articles having their title, abstract and keywords in English,

potentially excluding important articles written in other languages. Additionally, the queries of the drought drivers were per indices, individually, while the queries of the impacts were regrouped by two themes. We justified the approach of grouping

375 drought impacts keywords due to the lack of metrics existing for water and food insecurities related to drought, as is the case for drought drivers indices.

4.6 Recommendations

It has to be recognised and highlighted that DEWS have achieved the goal of providing timely and reliable information to decision makers for drought management and mitigation. The value of this study being to increase the relevance and utility of

380 drought-related variables, we also acknowledge that the metrics they rely on are mostly conceptual and descriptive which contradicts their operational purposes. Their structure also tends to exclude the human influence on drought and drought influence on humans. The emphasis is on the natural effects on the hydrological system. Subsequently, the accuracy and efficiency of drought mitigation measures can be sub-optimal if it is based only on information lacking consideration of observed (local) drought impacts.

385 A recommendation would be to also consider a drought mitigation focus shifted on the optimal human welfare that drought is obstructing, rather than only measuring on which hydrosystem compartment there is a deficit. In humanitarian approaches, a human welfare approach makes sense as the addressed disaster damages, in the short and long-term, can adversely affect basic human safety through malnutrition, displacement, livestock or even human mortality. But this can also be applicable in drought management. Indeed, there is a lack of consensus in defining a drought and its impacts resulting in difficulty on agreeing on

390 coherent and accurate drought metrics. Therefore, shifting the focus of drought mitigation to observable, graspable and quantifiable goals, such as human welfare, could overcome the uncertainty around drought and drought impacts definition.

In a drought mitigation perspective, the human welfare proxy could be considered as an optimal situation without water shortage, e.g. zero hunger, poverty, conflicts and water insecurity. Thus, it could be aligned with the Sustainable Development Goals (SDG) as they (i) represent the development priorities of both low- or high- income countries; (ii) benefit from existing

395 and improvable metrics. Also, similarly to drought indices, SDGs have a global nature inclined to overlook the local context. By taking into account local particularities, the SDGs could be reached at the local level even it is through a drought mitigation scope. Instead of the linear and still conceptual driver-focused "meteorological-agricultural-hydrological" droughts, the disaster scope could shift to more societally relevant goals linked to "poverty, water security, and food security". Thus, operational approaches of drought management would be the equivalent of determining the extent to which drought is

400 hampering the achievement of one or many of these defined goals.

Some studies have already been arguing in favour of considering other approaches than the two main top-down and bottom-up approaches for climate change adaptation strategies (Ludwig et al., 2014;Conway et al., 2019). Both approaches come with their strengths and weaknesses and conciliating them represents a challenge and many complexities, often unsuitable for integrating into water management (Ludwig et al., 2014). The issues complicating the decision-making are well known: the

405 top-down approach is too broad and presents too much uncertainty; the bottom-up approach focuses too much on socio-economic vulnerability and too little on developing (technical) solutions (Ludwig et al., 2014). Thus, a risk-oriented approach that focuses more on "*systems of receptors rather than conventional sectors*"(Warren et al., 2018), where research identifies vulnerability to different extreme events rather than only analysing their probabilities of occurence (Bliss and Bowe, 2011), is an alternative.

410 **5 Conclusions**

We conducted a bibliometric analysis on 5000+ scientific studies in which drought was associated to an index and water and food securities, with the aim of comparing how drought drivers (e.g. precipitation, temperature, evaporative demand) and drought impacts (food and water insecurities) were reflected in the literature. Our results revealed that drought is mainly depicted through a conceptual lens, focusing on precipitation-based and remotely sensed indices. It is the SPI, a single-variable

415 index, that is the most broadly used in different climatic and geographic contexts, despite being the one including the least local contextual information. Drought is regularly approached merely as a rainfall statistical anomaly and equated to meteorological drought.

Drought drivers studies tend to focus on particular geographical regions, especially northern countries, whereas studies reporting impacts related to food and water securities are more commonly located in Sub-Saharan Africa and Australia-Oceania

420 respectively. Moreover, the areas where drought drivers are reported in scientific studies are different from the drought impacts ones. There is also a difference in the geographic repartition of drought-related food security and water security scientific studies. This suggests that drought-impacts studies are certainly dependent on both the physical and human processes occurring in the geographic area, i.e. the local context.

Because "local context" can have different meanings, we raised four hypotheses that can be attributed to local context and that

425 can contribute to drought drivers resulting in drought impacts. First, the physical availability of water; drought drivers indices measure the water deficit in one or several of the components of the hydrological cycle, implying that the severity of drought is the same in arid or humid climates. Second, the socio-economic conditions in the countries, as the income per capita and the demography that affect, respectively, the capital involved in research and the vulnerability to hazards. Third, the data availability, related to the second point concerning socio-economic conditions, affects the selection and accuracy of an index,

430 especially if the chosen index is unsuitable for the particular climate. Fourth, the scientific approach and the interest in the country that determines from which physical and/or social sciences scope drought will be looked at and for what purpose. It seems that drought impacts are considered more through social sciences lenses than drought drivers. Drought drivers indices seem to remain conceptual metrics depicting climate features and do not seem to be linked to human-centered solutions. Also, both water and food securities are scientific concerns mostly in arid and semi-arid regions, from high to low income and

435 whether drought drivers are investigated or not. This suggests many variants of the same type of impact according to what or who is likely to be most impacted by drought in the area.

Thus, more research is needed where the scope of drought mitigation is widened to the vulnerability to drought events rather than only their probability of occurrence. DEWS would then more accurately predict the severity of a drought by also including drought indices that are people-centered. In this way, drought metrics would also better align with SDSs. These drought metrics
440 could become more useful in monitoring the negative role of drought in achieving human welfare, and with that, the SDGs.

Appendices

"M/A/H drought" Indices mentioned in the study	Acronym	Query
Standardized Precipitation Index	SPI	TITLE-ABS-KEY (("Drought") AND ("SPI" OR "Standardized Precipitation Index"))
Standardized Precipitation Evapotranspiration Index	SPEI	TITLE-ABS-KEY (("Drought") AND ("SPEI" OR "Standardized Evapotranspiration Precipitation Index"))
Aridity Index	AI	TITLE-ABS-KEY (("Drought") AND ("Aridity Index"))
Precipitation Deciles	Deciles	TITLE-ABS-KEY (("Drought") AND ("Precipitation Decile*" OR "Rain decile*" OR "rainfall decile*"))
Keetch-Byram Drought Index	KBDI	TITLE-ABS-KEY (("Drought") AND ("Keetch-Byram Drought Index" OR "KBDI"))
Palmer Drought Severity Index	PDSI	TITLE-ABS-KEY (("Drought") AND ("Palmer Drought Severity Index" OR "PDSI"))
Percent of Normal Precipitation (Index)	PNPI	TITLE-ABS-KEY (("Drought") AND ("Percent of Normal Precipitation" OR "Percent of Normal Precipitation Index" OR "PNPI"))
Rainfall Anomaly Index	RAI	TITLE-ABS-KEY (("Drought") AND ("Rainfall Anomaly Index" OR "Rainfall Anomaly" OR "RAI"))
Self-Calibrated Palmer Drought Severity Index	scPDSI	TITLE-ABS-KEY (("Drought") AND ("Self-Calibrated Palmer Drought Severity Index" OR "sc-PDSI"))
Crop Moisture Index	CMI	TITLE-ABS-KEY (("Drought")AND ("Crop Moisture index" OR "CMI"))
Evaporative Stress Index	ESI	TITLE-ABS-KEY (("Drought") AND ("Evaporative Stress Index" OR "ESI"))
Evapotranspiration Deficit Index	ETDI	TITLE-ABS-KEY (("Drought") AND ("Evapotranspiration Deficit Index" OR "ETDI"))

Enhanced Vegetation Index	EVI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Enhanced Vegetation Index"* OR *"EVI"*))
Normalized Difference Vegetation Index	NDVI	TITLE-ABS-KEY (("Drought") AND ("Normalized Difference Vegetation Index" OR "NDVI"))
Leaf Area Index	LAI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Leaf Area Index"* OR *"LAI"*))
Palmer Moisture Anomaly Index – known as the Palmer Z index	PZI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Palmer Z Index"* OR *"Palmer Moisture Anomaly Index"* OR *"PZI"*))
Soil Adjusted Vegetation Index	SAVI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Soil Adjusted Vegetation Index"* OR *"SAVI"*))
Soil Moisture Anomaly	SMA	TITLE-ABS-KEY ((*"Drought"*) AND (*"Soil Moisture Anomaly"* OR *"SMA"*))
Soil Moisture Deficit Index	SMDI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Soil Moisture Deficit Index"* OR *"SMDI"*))
Soil Water Deficit Index	SWDI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Soil Water Deficit Index"* OR *"SWDI"*))
Soil Water Storage	SWS	TITLE-ABS-KEY ((*"Drought"*) AND (*"Soil Water Storage"* OR *"SWS"*))
Vegetation Condition Index	VCI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Vegetation Condition Index"* OR *"VCI"*))
Vegetation Drought Response Index	VegDRI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Vegetation Drought Response Index"* OR *"VegDRI"* OR *"Veg DRI"*))
Vegetation Health Index	VHI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Vegetation Health Index"* OR *"VHI"*))
Reservoir Level		TITLE-ABS-KEY ((*"Drought"*) AND (*"Reservoir level*"* OR *"water level in reservoir"* OR *"water levels in reservoirs"*))
Palmer Hydrological Drought Index (PHDI)	PHDI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Palmer Hydrological Drought Index"* OR *"PHDI"*))
Streamflow Drought Index	SDI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Streamflow Drought Index"* OR *"SDI"*))
Standardized Runoff Index	SRI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Standardized Runoff Index"*))
Standardized Streamflow Index	SSFI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Standardized Streamflow Index"* OR *"SSFI"*))
Streamflow anomaly		TITLE-ABS-KEY ((*"Drought"*) AND (*"streamflow anomaly"*))
Standardized Water-level Index	SWI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Standardized Water Level Index"* OR *"SWLI"*))

Surface Water Supply Index	SWSI	TITLE-ABS-KEY ((*"Drought"*) AND (*"Surface Water Supply Index"* OR *"SWSI"*))
Drought impacts studies		
Food security		TITLE-ABS-KEY("drought" AND ("food secur*" OR "food insecur*" OR "famine" OR "hunger" OR "hidden hunger" OR "malnourish*" OR "undernourish*" OR "malnutrition" OR "undernutrition" OR "crop loss*" OR "yield loss*" OR "agricultural loss*" OR "agricultural product* loss*" OR "loss of agricultural land*"))
Water security		TITLE-ABS-KEY ((*"drought"*) AND (((*"safe"*) AND (*"water access"* OR *"drinking water"*)) OR ((*"clean"*) AND (*"drinking water"* OR *"drinking source"*)) OR *"freshwater availability"* OR *"water secur*"* OR *"water insecur*"* OR *"water crisis"*))

TABLE A 1: Table of queries used in the advanced search of Scopus to retrieve the scientific studies of the drought indices and impacts.

Code and data availability

445

Both code and data are available in the 4tu.ResearchData platform.

The link of access is https://figshare.com/s/dd10a23059dd637464bf

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Author contribution

450   SK has designed and conducted the research in collaboration with DWW, supervised by LAM and PRvO. SK has written the manuscript with input from all co-authors. The final version has been approved by all co-authors.

Competing interests.

Authors have declared no competing interests.

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References

Addor, N., and Melsen, L. A.: Legacy, Rather Than Adequacy, Drives the Selection of Hydrological Models, Water Resources Research, 55, 378-390, https://doi.org/10.1029/2018WR022958, 2019.
Aria, M., and Cuccurullo, C.: bibliometrix: An R-tool for comprehensive science mapping analysis, Journal of informetrics, 11, 959-975,
465 2017.
Bachmair, S., Stahl, K., Collins, K., Hannaford, J., Acreman, M., Svoboda, M., Knutson, C., Smith, K. H., Wall, N., Fuchs, B., Crossman, N. D., and Overton, I. C.: Drought indicators revisited: the need for a wider consideration of environment and society, Wiley Interdisciplinary Reviews: Water, 3, 516-536, 10.1002/wat2.1154, 2016.
Basu, S., Ramegowda, V., Kumar, A., and Pereira, A.: Plant adaptation to drought stress, F1000Res, 5, F1000 Faculty Rev-1554,
470 10.12688/f1000research.7678.1, 2016.
Belesova, K., Agabiirwe, C. N., Zou, M., Phalkey, R., and Wilkinson, P.: Drought exposure as a risk factor for child undernutrition in low- and middle-income countries: A systematic review and assessment of empirical evidence, Environment international, 131, 104973, 2019.
Bliss, K. E., and Bowe, K. F.: Bridging Knowledge Gaps in Water Management: Integrating Approaches to Food, Water, Energy, and the Environment, Center for Strategic and International Studies, 2011.
475 Bradley, D. J., and Bartram, J. K.: Domestic water and sanitation as water security: monitoring, concepts and strategy, Philosophical Transactions of the Royal Society A: Mathematical, Physical and Engineering Sciences, 371, 20120420, 2013.
Brazilian Drought Monitor: http://monitordesecas.ana.gov.br/mapa?mes=3&ano=2021, access: 26th of April 2021, 2021.
Conway, D., Nicholls, R. J., Brown, S., Tebboth, M. G. L., Adger, W. N., Ahmad, B., Biemans, H., Crick, F., Lutz, A. F., De Campos, R. S., Said, M., Singh, C., Zaroug, M. A. H., Ludi, E., New, M., and Wester, P.: The need for bottom-up assessments of climate risks and
480 adaptation in climate-sensitive regions, Nature Climate Change, 9, 503-511, 10.1038/s41558-019-0502-0, 2019.
Cook, C., and Bakker, K.: Water security: Debating an emerging paradigm, Global Environmental Change, 22, 94-102, https://doi.org/10.1016/j.gloenvcha.2011.10.011, 2012.
Corral, P., Irwin, A., Krishnan, N., Mahler, D. G., and Vishwanath, T.: Fragility and Conflict: On the Front Lines of the Fight against Poverty, The World Bank, 2020.
485 The International Disaster Database: http://www.emdat.be/, access: 31 March 2020, 2021.
FAO: The state of food insecurity in the World 2010, Addressing food insecurity in protracted crises, WFP, FAO. Journal of Rural Studies, 29, 101-112, 2010.
Country fact sheet on food and agriculture policy trends.: http://www.fao.org/in-action/fapda/publications/country-fact-sheets/en/, access: 26th of April 2021, 2021.
490 FAO, I., UNICEF, WFP, WHO: The state of food security and nutrition in the world 2019: safeguarding against economic slowdowns and downturns. Rome, Italy: FAO, 2019.
Government of Australia: A national plan for water security, Canberra, 2007.
Gregory, P. J., Ingram, J. S. I., and Brklacich, M.: Climate change and food security, Philos. Trans. R. Soc. B Biol. Sci., 360, 2139-2148, 10.1098/rstb.2005.1745, 2005.
495 Guha-Sapir, D., Vos, F., Below, R., and Ponserre, S.: Annual disaster statistical review 2011: the numbers and trends, 2012.
Harrington, L. J., and Otto, F. E. L.: Reconciling theory with the reality of African heatwaves, Nature Climate Change, 10.1038/s41558-020-0851-8, 2020.
Hatfield, J. L., and Prueger, J. H.: Temperature extremes: Effect on plant growth and development, Weather and Climate Extremes, 10, 4-10, https://doi.org/10.1016/j.wace.2015.08.001, 2015.
500 Hill, R. S.: Origins of the southeastern Australian vegetation, Philosophical Transactions of the Royal Society of London. Series B: Biological Sciences, 359, 1537-1549, 2004.
Hoekstra, A. Y., Buurman, J., and van Ginkel, K. C. H.: Urban water security: A review, Environmental Research Letters, 13, 053002, 10.1088/1748-9326/aaba52, 2018.
Jepson, W., Budds, J., Eichelberger, L., Harris, L., Norman, E., O'Reilly, K., Pearson, A., Shah, S., Shinn, J., and Staddon, C.: Advancing
505 human capabilities for water security: A relational approach, Water Security, 1, 46-52, 2017.
Kchouk, S., Melsen, L. A., and Van Oel, P. R.: Data underlying the publication : "A review of drought indices: predominance of drivers over impacts and the importance of local context". Water Resources Management Group, W. U. R. (Ed.), 2021.

Kim, S., Shao, W., and Kam, J.: Spatiotemporal patterns of US drought awareness, Palgrave Communications, 5, 107, 10.1057/s41599-019-0317-7, 2019.

510 Knutson, C., Hayes, M., and Phillips, T.: How to reduce drought risk, 1998.

Lackstrom, K., Brennan, A., Ferguson, D., Crimmins, M., Darby, L., Dow, K., Ingram, K., Meadow, A., Reges, H., and Shafer, M.: The Missing Piece: Drought Impacts Monitoring Report from a Workshop in Tucson, AZ MARCH 5-6, 2013, 2013.

Lloyd-Hughes, B.: The impracticality of a universal drought definition, Theoretical and Applied Climatology, 117, 607-611, 2014.

Logar, I., and Van den Bergh, J.: Methods to assess costs of drought damages and policies for drought mitigation and adaptation: review and

515 recommendations., Water Resources Management, 27, 1707-1720, 10.1007/s11269-012-0119-9, 2011.

Ludwig, F., van Slobbe, E., and Cofino, W.: Climate change adaptation and Integrated Water Resource Management in the water sector, Journal of Hydrology, 518, 235-242, https://doi.org/10.1016/j.jhydrol.2013.08.010, 2014.

Makurira, H., Savenije, H. H. G., Uhlenbrook, S., Rockström, J., and Senzanje, A.: The effect of system innovations on water productivity in subsistence rainfed agricultural systems in semi-arid Tanzania, Agricultural Water Management, 98, 1696-1703,

520 https://doi.org/10.1016/j.agwat.2011.05.003, 2011.

Mishra, A. K., and Singh, V. P.: A review of drought concepts, Journal of hydrology, 391, 202-216, 2010.

Molden, D.: Water for food water for life: A comprehensive assessment of water management in agriculture, Routledge, 2013.

Montanari, A., Young, G., Savenije, H. H. G., Hughes, D., Wagener, T., Ren, L. L., Koutsoyiannis, D., Cudennec, C., Toth, E., Grimaldi, S., Blöschl, G., Sivapalan, M., Beven, K., Gupta, H., Hipsey, M., Schaefli, B., Arheimer, B., Boegh, E., Schymanski, S. J., Di Baldassarre,

525 G., Yu, B., Hubert, P., Huang, Y., Schumann, A., Post, D. A., Srinivasan, V., Harman, C., Thompson, S., Rogger, M., Viglione, A., McMillan, H., Characklis, G., Pang, Z., and Belyaev, V.: "Panta Rhei—Everything Flows": Change in hydrology and society—The IAHS Scientific Decade 2013–2022, Hydrological Sciences Journal, 58, 1256-1275, 10.1080/02626667.2013.809088, 2013.

Morris, K. S., and Bucini, G.: California's drought as opportunity: Redesigning U.S. agriculture for a changing climate, Elementa: Science of the Anthropocene, 4, 10.12952/journal.elementa.000142, 2016.

530 Niang, I., Ruppel, O. C., Abdrabo, M. A., Essel, C., Lennard, C., Padgham, J., Urquhart, P., and Descheemaeker, K. K. E.: Africa, in: Climate Change 2014 – Impacts, Adaptation and Vulnerability: Part B: Regional Aspects: Working Group II Contribution to the IPCC Fifth Assessment Report: Volume 2: Regional Aspects, edited by: Intergovernmental Panel on Climate, C., Cambridge University Press, Cambridge, 1199-1266, 2014.

Odugbesan, J. A., and Rjoub, H.: Relationship among HIV/AIDS Prevalence, Human Capital, Good Governance, and Sustainable

535 Development: Empirical Evidence from Sub-Saharan Africa, Sustainability, 11, 1348, 2019.

Pozzi, W., Sheffield, J., Stefanski, R., Cripe, D., Pulwarty, R., Vogt, J. V., Heim, R. R., Jr., Brewer, M. J., Svoboda, M., Westerhoff, R., van Dijk, A. I. J. M., Lloyd-Hughes, B., Pappenberger, F., Werner, M., Dutra, E., Wetterhall, F., Wagner, W., Schubert, S., Mo, K., Nicholson, M., Bettio, L., Nunez, L., van Beek, R., Bierkens, M., de Goncalves, L. G. G., de Mattos, J. G. Z., and Lawford, R.: Toward Global Drought Early Warning Capability: Expanding International Cooperation for the Development of a Framework for Monitoring and Forecasting,

540 Bulletin of the American Meteorological Society, 94, 776-785, 10.1175/bams-d-11-00176.1, 2013.

Princeton Flood and Drought Monitors: http://stream.princeton.edu/, access: 26th of April 2021, 2021.

Salimi, H., Asadi, E., and Darbandi, S.: Meteorological and hydrological drought monitoring using several drought indices, Applied Water Science, 11, 11, 10.1007/s13201-020-01345-6, 2021.

Santos Pereira, L., Cordery, I., and Iacovides, I.: Water Scarcity Concepts, in: Coping with Water Scarcity: Addressing the Challenges,

545 Springer Netherlands, Dordrecht, 7-24, 2009.

Savelli, E., Rusca, M., Cloke, H., and Di Baldassarre, G.: Don't blame the rain: Social power and the 2015–2017 drought in Cape Town, Journal of Hydrology, 594, 125953, https://doi.org/10.1016/j.jhydrol.2020.125953, 2021.

Scopus: Access and use Support Center: https://service.elsevier.com/app/answers/detail/a_id/15100/supporthub/scopus/, access: 20 April 2021, 2021.

550 Seneviratne, S. I.: Climate science: Historical drought trends revisited, Nature, 491, 338-339, 2012.

Serdeczny, O., Adams, S., Baarsch, F., Coumou, D., Robinson, A., Hare, W., Schaeffer, M., Perrette, M., and Reinhardt, J.: Climate change impacts in Sub-Saharan Africa: from physical changes to their social repercussions, Regional Environmental Change, 17, 1585-1600, 2017.

Svoboda, M., and Fuchs, B.: Handbook of drought indicators and indices. Integrated drought management programme (IDMP), integrated drought management tools and guidelines series 2, World Meteorological Organization and Global Water Partnership, Geneva, Switzerland,

555 52, 2016.

UN Secretariat General: United Nations convention to combat drought and desertification in countries experiencing serious droughts and/or desertification, particularly in Africa, Particularly in Africa, 1994.

What is Water Security? Infographic: https://www.unwater.org/publications/water-security-infographic/, access: 4th of March, 2013.

United Nations: World Population Prospects 2019: Highlights, United Nations, 2019.

560 US National Drought Mitigation Center: https://drought.unl.edu/, access: 26th of April 2021, 2021.

Van Lanen, H., Vogt, J., Andreu, J., Carrão, H., De Stefano, L., Dutra, E., Feyen, L., Forzieri, G., Hayes, M., and Iglesias, A.: Climatological risk: droughts, Science for disaster risk management, 271-293, 2017.

Van Loon, A. F., Gleeson, T., Clark, J., Van Dijk, A. I. J. M., Stahl, K., Hannaford, J., Di Baldassarre, G., Teuling, A. J., Tallaksen, L. M., Uijlenhoet, R., Hannah, D. M., Sheffield, J., Svoboda, M., Verbeiren, B., Wagener, T., Rangecroft, S., Wanders, N., and Van Lanen, H. A.
565   J.: Drought in the Anthropocene, Nature Geoscience, 9, 89-91, 10.1038/ngeo2646, 2016.
Vogt, J. V., Naumann, G., Masante, D., Spinoni, J., Cammalleri, C., Erian, W., Pischke, F., Pulwarty, R., and Barbosa, P.: Drought Risk Assessment and Management, 2018.
Vollset, S. E., Goren, E., Yuan, C.-W., Cao, J., Smith, A. E., Hsiao, T., Bisignano, C., Azhar, G. S., Castro, E., and Chalek, J.: Fertility, mortality, migration, and population scenarios for 195 countries and territories from 2017 to 2100: a forecasting analysis for the Global
570   Burden of Disease Study, The Lancet, 396, 1285-1306, 2020.
Walker, D., Forsythe, N., Parkin, G., and Gowing, J.: Filling the observational void: Scientific value and quantitative validation of hydrometeorological data from a community-based monitoring programme, Journal of Hydrology, 538, 713-725, https://doi.org/10.1016/j.jhydrol.2016.04.062, 2016.
Wani, S. P., Rockström, J., and Oweis, T. Y.: Rainfed agriculture: unlocking the potential, CABI, 2009.
575   Warren, R. F., Wilby, R. L., Brown, K., Watkiss, P., Betts, R. A., Murphy, J. M., and Lowe, J. A.: Advancing national climate change risk assessment to deliver national adaptation plans, Philosophical Transactions of the Royal Society A: Mathematical, Physical and Engineering Sciences, 376, 20170295, 2018.
Wilhite, D. A., and Glantz, M. H.: Understanding: the drought phenomenon: the role of definitions, Water international, 10, 111-120, 1985.
Wilhite, D. A.: Drought as a natural hazard: concepts and definitions, 2000.
580   Wilhite, D. A., Svoboda, M. D., and Hayes, M. J.: Understanding the complex impacts of drought: A key to enhancing drought mitigation and preparedness, Water Resources Management, 21, 763-774, 10.1007/s11269-006-9076-5, 2007.
Willis, R. M., Stewart, R. A., Panuwatwanich, K., Jones, S., and Kyriakides, A.: Alarming visual display monitors affecting shower end use water and energy conservation in Australian residential households, Resources, Conservation and Recycling, 54, 1117-1127, https://doi.org/10.1016/j.resconrec.2010.03.004, 2010.
585   WMO: Standardized Precipitation Index User Guide (M. Svoboda, M. Hayes and D. Wood), Geneva, Switzerlands, 2012.
Agriculture, forestry, and fishing, value added (% of GDP): https://data.worldbank.org/indicator/NV.AGR.TOTL.ZS?end=2019&name_desc=true&start=1960&type=shaded&view=map&year=2016, access: 12th of February, 2016.
World Bank: Assessment of the state of hydrological services in developing countries, International Bank for Reconstruction and
590   Development/The World Bank, Washington DC 2018.
Population growth (annual %) - World: https://data.worldbank.org/indicator/SP.POP.GROW?locations=1W&name_desc=false&view=map, access: 4th of March, 2019.
Wu, H., Svoboda, M. D., Hayes, M. J., Wilhite, D. A., and Wen, F.: Appropriate application of the standardized precipitation index in arid locations and dry seasons, International Journal of Climatology, 27, 65-79, 10.1002/joc.1371, 2007.
595   Zargar, A., Sadiq, R., Naser, B., and Khan, F. I.: A review of drought indices, Environmental Reviews, 19, 333-349, 10.1139/a11-013, 2011.