

Review Article

Agricultural Drought Severity Assessment using Remotely Sensed Data: A Review

Sandeep V. Gaikwad¹, Karbhari V. Kale¹, Sonali B. Kulkarni¹, Amarsinh B. Varpe² and Ganesh N. Pathare²

Department of CS & IT, Dr. Babasaheb Ambedkar Marathwada University, Aurangabad, Maharashtra, India Department of CS, Vinayakrao Patil Mahavidhyalay, Vaijapur, Aurangabad, Maharashtra, India

Publication Date: 28 August 2015

Article Link: http://technical.cloud-journals.com/index.php/IJARSG/article/view/Tech-440



Copyright © 2015 Sandeep V. Gaikwad, Karbhari V. Kale, Sonali B. Kulkarni, Amarsinh B. Varpe and Ganesh N. Pathare. This is an open access article distributed under the **Creative Commons Attribution License**, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Abstract Drought is natural hazard which is caused due to shortage of rainfall. Among the natural hazards, drought is hard to find out because it grows gradually and have huge impact on nature, human habitat and economy. Many satellite based drought indices have so far been suggested for regional and national levels. Meteorological and satellite based indices are used to detect different types of drought, including meteorological, agricultural and hydrological drought. NOAA-AVHRR, MODIS data are used in worldwide for vegetation analysis and drought monitoring and drought assessment. The several meteorological variables (indicators) such as precipitation, temperature, humidity and evapotranspiration are required to calculate drought severity level. The nature of drought indices shows different climate dryness, precipitation deficit or correspond to delayed hydrological impacts such as lowered water level in reservoir, lake, river streams, soil moisture level and agriculture crop health. The long term historical records of satellite imagery and climatic data are essential to calculate drought severity level and to determine drought risk prone area. The agriculture sector is vulnerable to the drought. Now day's satellite imagery has been used in agriculture drought assessment. The government agencies and district based municipal department can create drought mitigation plan based on drought monitoring model. This review paper has discussed the use of remotely sensed data for agriculture drought assessment.

Keywords Drought; Meteorological Drought; Vegetation Indices; SPI; PDSI

1. Introduction

Drought is an interval of time, generally of the order of month of the year in duration during which the actual moisture supply at a given place rather consistently fall short of the climatically expected or climatically appropriate moisture supply (Palmar, 1965). Drought occurs due to insufficient moisture level of crop production so that crop production highly affected due to the drought. Drought has a high impact on economy of the country, because it is very hard to balance between food demand and food supply. This issue has attracted the attention of scientific community, government planner and society.

Drought is a natural disaster which is hard to predict, and it is complex to study (Mishra and Desai, 2005). Scanty or irregular rainfall reduces soil moisture level (Bhuiyan, 2008). Various meteorological parameters like temperature, moisture, humidity, evaporation of water, rainfall are helpful for defining drought.

Drought is difficult to detect & monitor because of 3 reasons:

- 1) It developed slowly and the onset and end are indistinct;
- 2) It is precisely and universally defined and
- 3) Its impact is non-structural and often spreads over a very large area (Wilhite, 1993).

Drought can be assessed using meteorological based index and satellite based index. Several drought indices have been proposed based on vegetation indices, Normalized Difference Vegetation Indices (NDVI), Soil Adjusted Vegetation Index (SAVI), Land Surface Temperature (LST), Albedo, Temperature Condition Index (TCI), and Vegetation Condition Index (VCI) are also used for drought study.

2. Drought Characterization

Drought characterization is essential for drought management operations and preparedness of drought mitigation plan. Using drought indices is a realistic way to adapt large amounts of data into quantitative information that can be used in applications such as drought monitoring, mitigation planning and drought assessment (Wilhite, 2004). There are four types of the drought such as Meteorological, Agrometeorological or agricultural, Hydrological, Socioeconomic drought (Dalezios, 2012).

2.1. Meteorological or Climatological Drought

It is identifying based on precipitation data. If rainfall below the threshold then it causes to meteorological drought. Meteorologist makes distinction between absolute and partial drought. Absolute drought is said to be a period of 15 consecutive days to none of which is credited with 0.2mm or more of rainfall, whereas as partial is a period of at least 29 consecutive days of which its mean rainfall does not exceed 0.2mm (Ayoade, 2004).

2.2. Agro-meteorological or Agricultural Drought

It is described in terms of crop failure and exists when soil moisture is depleted so that crop yield is reduced considerably. The Agriculturalist perspective of drought is when moisture storage unavailable through rainfall or soil is insufficient to ensure optimal crop growth as in, (Ayoade, 2004). A precipitation deficit has impact on agricultural drought, meteorological and hydrological drought.

2.3. Hydrological Drought

It is occurred due to scarcity of the surface water or ground water for normal operation in a particular region. To hydrologist, drought is as a result of low flow in rivers below a critical threshold discharge. Hydrological drought has been defined in various studies done by many researchers and the scientific community as significant decrease in availability of water in all its forms, i.e. ground water, surface water, stream flow, lake reservoir levels and ground water level (Dalezios, 2012).

2.4. Socioeconomic

The impact of drought is defined in terms of loss from an average or expected return and can be measured by both social and economic indicators. The socio economic drought as observed in the

case of Wilhite and Glantz (1985) is said to occur as a result of physical water shortage that ends up affecting people at individual scale. The greater demand on commodities than the supply of economic good can best describe this situation. The socio economic droughts reflects the elements meteorological, agricultural and hydrological is drought as it results from the low precipitation, less vegetation content reduction for forage, stream flow reduction.



Figure 1: Shows the Relationship between Meteorological, Agricultural, and Hydrological Drought Source (National Drought Mitigation Center)

3. Meteorological Index

There are several drought indices which is based on meteorological data such as Standardized Precipitation Index (SPI), Palmer Drought Severity Index (PDSI), Crop Moisture Index (CMI), Reclamation Drought Index (RDI) etc.

3.1. Palmer Drought Severity Index

PDSI is sensitive to the weather condition, like dry, and wet (Palmer, 1965). PDSI is sensitive to the weather condition, like dry, and wet. The objective of the PDSI index was to identify the arid and semiarid region. PDSI use historical meteorological data for prediction of drought (McKee et al., 1995). But it cannot provide accurate result in various countries (Kogan, 1990). To solve this problem McKee et al developed the Standard Precipitation Index (SPI), which is based on long term record of precipitation.

3.2. Standard Precipitation Index

The Standard Precipitation Index is designed to quantify the precipitation anomaly for a specific time period (e.g., previous 1, 3, 5, or 12 months) based on the long-term rainfall record over that same time period (McKee et al., 1995). The SPI is computed by using the long-term precipitation records (minimum 30 years) over a specific time step to a probability distribution, which is then transformed to a gamma distribution function. Then, the mean SPI value for a specific location and time period is set to zero. The positive and negative SPI values represent more and less precipitation compared to historical mean precipitation, respectively (Edwards and McKee, 1997). The SPI was used as a

International Journal of Advanced Remote Sensing and GIS

measure of dryness in VegDRI and a single SPI interval was selected for each seasonal VegDRI model based on statistical testing of SPI intervals ranging from 1 to 52 weeks. Drought event occur any time the SPI is continuously negative and reaches intensity of -1.0 or less. The event ends when the SPI value becomes positive value. The following table shows SPI Values:

SPI Values	Assumptions
2.0+	Extremely wet
1.5 to 1.99	Very wet
1.0 to 1.49	Moderately wet
99 to .99	Near normal
-1.0 to -1.49	Moderately dry
-1.5 to -1.99	Severely dry
-2 and less	Extremely dry

Table 1: SPI Values (Source: National Drought Mitigation Center)

4. Remote Sensing for Drought Monitoring

Remote sensing is extremely useful for understanding the spatiotemporal land cover change in relation to the basic physical properties in terms of the surface radiance and emissivity data (Orhan, 2014). A major consideration for development of remote sensing for drought assessment and disaster reduction is the extended to which operational user can rely on a continued supply of data (Dalezios et al., 2012; Colwell, 1984). There are two types of remote sensing systems for drought assessment: meteorological and environmental (or resource) satellites. Meteorological satellites have also two types, namely geostationary such as METEOSAT and geosynchronous such as NOAA/AVHRR, and can contribute to operational monitoring and assessment of drought (Dalezios et al., 2012; Caccamo et al., 2011; Zhou et al., 2012). Similarly, environmental satellites such as LANDSAT series, SPOT, IKONOS, WORLD VIEW are used for study of land cover, disaster, vegetation etc., but it has low frequency of coverage, can contribute to land-use classification and qualitative features of drought and less to quantitative assessments (Peled et al., 2010). New sensors have higher spatial resolution, a current shortcoming in drought indices products (Niemeyer, 2008). Pre-processing of satellite image can be done by using geometric correction, haze removal algorithms and other atmosphere correction algorithm. NDVI has remained popular, other indices such as VegDRI, Vegetation Condition Index (VCI) (Kogan, 1990), Temperature Condition Index (TCI), and Vegetation Health Index (VHI) (Kogan, 1995) are currently operationally used (NDMC, 2011; NOAA, 2011). Other satellite image band nearinfrared (NIR), red and short-wavelength infrared (SWIR) are used to compute drought index. The ratio of Land Surface Temperature (LST) and Normalized Difference Vegetation Index has been used to improve drought characterization accuracy (Cai et al., 2011; Lambin and Ehrlich, 1995; Rhee et al., 2010; Wan et al., 2004; Wang et al., 2001).

5. Literature Survey

No.	Author/Year	Country	Sensor	Study Period	Technique
1.	D. Nithya et	Srivilliputhur	Landsat	1990, 2000	This paper is focused on SPI, NDVI and NDWI
	al., 2014	Taluk Of	ETM+, LISS	and 2011	are very useful for early detection of agricultural
		Virudhunagar	III.		vulnerability and hence should be a better
		District, Tamil			methodology for remote sensing based
		Nadu			vulnerability assessment studies.
2.	Sashikkumar	Chittar sub basin,		1982,	Drought is assessed on the basis of Percentage
	et al., 2013	Thamiravaruni,		1986, 1989,	Deviation of rainfall from long term annual mean
		Tamilnadu		1999, and	precipitation. This method is useful to detect

Table 2: Literature Survey of Study of Drought Indices

IJARSG– An Open Access Journal (ISSN 2320 – 0243)

				2001	drought condition in the region.
3.	Sumanta Das,	Bankura District,	Landsat		It is found that the temporal variations of NDVI
	Malini Roy et	West Bengal	ETM+		anomaly, VCI, TCI and MSI are closely linked
	al.,		(2000),		with SPI and a strong linear relationship exists
	2013		Landsat TM		between them. Satellite derived drought-
			(2005),		monitoring indices have also been correlated
			Landsat TM		with precipitation index to see how vegetation
			(2010).		stress condition and consequently agricultural
					production yield is changing with the variability of
					rainfall.
4.	Kipterer John	Nakuru, Rift	NOAA-	2000,	The use of temperature and vegetation index
	Kapoi, et al.,	Valley of Keniya	AVHRR	2010,	provides adequate means for mapping drought
	2012			2011	extended over agricultural field. LST, NDVI,
					WSVI. Precipitation data of 10 year used for area
					of study.
5.	Chaudhary,	Bhopalgarh	Landsat-7	2000-2001,	This paper has presented drought indices like
	Garg et al.,	Tehsil, Jhodpur,	ETM+	2001-2002,	NDVI, VCI, SAVI, VCI, LST, and TCI. The
	2012	India		2009-2010	analysis of Landsat Image Data of Pre and Post
					monsoon of Year 2000, 2002, 2010 was used to
					detect drought affected area.
6.	Dalezios, et	Thessaly,	NOAA-	1981-2001	Reconnaissance Drought Index (RDI) is used for
	al.,	Greece	AVHRR		the quantification of drought based on remote
	2012.				sensing technology. RDI is used for Hydrological
					drought estimation, which is only based on
_				1000 0000	precipitation data.
7.	Kundu and	Churu, Thar		1983-2003	A VILDE data NEVI time trend is long torm
	Dutta,	Deseart,	AVHRR		AVHRR data, NDVI time trend + Long term
	2011	Rajastnan, India			rainfail data. According to this research spatial
					pattern changes due to change in vegetation
					conditions. The crop growth is entirely depending
					definit rainfall
8	Hasan Murad	North-West	MODIS	2000-2008	This paper has presented SPL NDVI and NDVI-
0.	et al 2011	Region of	TERRA	2000 2000	Anomaly indices For drought assessment study
	ot all, 2011	Bangladesh	Sensor.(MO		The 30 year's rainfall data was used to calculate
		Langladoon	D09		SPI index.
			Product)		
9.	Ebrahimi, et	Shirkooh Basin,	Landsat-7	1999-2002	In this research study, the Run-Test method was
	al., 2010	Iran.	ETM+		used to derive rainfall pattern over the study
					region. Meteorological Data was used to
					calculate PDI and MPDI indices. The satellite
					based indicators are SAVI2 and NDVI were used
					for drought area study.
10.	Renza, et al.,	Madrid, Spain	Landsat-7	2001-2009.	This paper has studied the various indices like
	2010.		ETM+	(June Month)	NDVI, NDDI, NDVIDev, NDWI and VCI. The
					NDDI index can be calculate by using
					composition of NDVI time series data. Landsat
					satellite provide high resolution image data, than
					MODIS, AVHRR sensor. This will be helpful to
					understand drought condition at small
					administrative area.
11.	Orhan, et al.,	Salt Lake Basin,	Landsat-5	1984, 1989,	This research paper has presented NDVI, VCI,
	2014.	Turkey.	TM	1998, 2003,	TVX indices using spatiotemporal Landsat
				2007, 2011.	imagery. This research study has investigated
				(Aug Month)	the relationship between thermal infrared band of
					Landsat-5 TM and in-situ Infrared temperature
4.0	<u> </u>			4004 0000	data tor agricultural drought.
12.	Rahman, et al.,	Bangladesh	NOAA-	1991-2005	Author has calculated vegetation indices like

International Journal of Advanced Remote Sensing and GIS

	2009		AVHRR		VH,VCI, and VHI, derived from Advanced Very
					High Resolution Radiometer (AVHRR) data
					covering a period of 15 years (1991–2005). A
					strong correlation was found between Aus rice
					yield and VCI and VHI during the critical period
					of Aus rice development that occurs during
					March-April (weeks 8–13 of the year), several
					months in advance of the rice harvest.
13.	Liu, et al.,	China	MODIS	2005-2006	In this paper, author has derived RDRI, VCI, and
	2008				LST indices from MODIS data which are used for
					drought severity study.
14.	C. Bhuiyan,	Great Indian	NOAA	1984–2003	Spatial and temporal variations in rainfall,
	2008	Desert contains	AVHRR		temperature, and vegetation indices in the Thar
		extensive region			Desert have been analyzed and correlated for
		of sandy			monsoon and non- monsoon seasons. The
		landscape, and is			mean seasonal NDVI, the index representing
		located in the			greenness of vegetation was found to strongly
		north-western			correlate with seasonal rainfall. The time series
		part of India and			of VCI and TCI shows that in certain years they
		eastern part of			correspond to each other. Dense vegetation is
		Pakistan			responsible to reduce the heat in area.
15.	C.S. Murthy, et	Mahaboobnagar	IRS 1C/1D	2002, 2004,	The use of moderate resolution satellite data like
	al., 2007	district, Andhra	WiFS (180	2005	AWiFS/WiFS captures the spatial variability of
		Pradesh, India	m) and IRS		drought impact on crops and it provides the
			P6 AWiFS		information at disaggregated level within a
					district. Ground Truth point of the crop field,
					cropping pattern, and soil type was used to
					assess the drought situation. In this research
					paper author has used AWiFS dataset to
					investigate drought impact over the region.
16.	Bayarjargal, et	Mangolia	NOAA-	1982-1999	The author has used NOAA- AVHRR sensor
	al., 2006.		AVHRR		data to compute various vegetation indices like
					NDVI, Derived NDVI and VCI. It is found that,
					these indices have produced almost similar
					result.
17.					
	Thenkabail,	Afghanistan,	NOAA-	1982-2001	Author has used NOAA- AVHRR and MODIS
	Thenkabail, et.al. 2004.	Afghanistan, Pakistan and	NOAA- AVHRR and	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to
	Thenkabail, et.al. 2004.	Afghanistan, Pakistan and western parts of	NOAA- AVHRR and MODIS-	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive
	Thenkabail, et.al. 2004.	Afghanistan, Pakistan and western parts of India.	NOAA- AVHRR and MODIS- Terra-aqua	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions.
18.	Thenkabail, et.al. 2004. Steven M, et	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al,	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al.
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (a g diagage pacts diagage
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003.	Afghanistan, Pakistan and western parts of India. Canada	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm damage, and soil characteristics).
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003. Prathumchai, et al. 2001	Afghanistan, Pakistan and western parts of India. Canada Thailand	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999 1995, 1997	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm damage, and soil characteristics). The research study has shown that, The NDVI
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003. Prathumchai, et al., 2001.	Afghanistan, Pakistan and western parts of India. Canada Thailand	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999 1995, 1997	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm damage, and soil characteristics). The research study has shown that, The NDVI can be used as indicators for Drought study.
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003. Prathumchai, et al., 2001.	Afghanistan, Pakistan and western parts of India. Canada Thailand	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999 1995, 1997	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm damage, and soil characteristics). The research study has shown that, The NDVI can be used as indicators for Drought study. Author has derived NDVI composite from bistorical records of the scatellite impaces
18.	Thenkabail, et.al. 2004. Steven M, et al., 2003. Prathumchai, et al., 2001.	Afghanistan, Pakistan and western parts of India. Canada Thailand	NOAA- AVHRR and MODIS- Terra-aqua Meteorologic al, temperature and precipitation.	1982-2001 1961–1999 1995, 1997	Author has used NOAA- AVHRR and MODIS data to investigate drought hazard. According to author, The DEVNDVI, and VCI are sensitive indicators of drought conditions. In the research study, it is also found that Palmer's Z-index is the most appropriate index for measuring agricultural drought in the Canadian prairies. The evaluation model has indicated that, Z-index was the best suited for predicting crop yield when there is significant moisture stress. According to Steven M. et. al. 2003, there is a statistically significant relationship between the Z-index and Red Spring wheat yield in all crop districts, but the strength of the relationship varies significantly by crop district due to the influence of factors other than moisture availability (e.g. disease, pests, storm damage, and soil characteristics). The research study has shown that, The NDVI can be used as indicators for Drought study. Author has derived NDVI composite from historical records of the satellite images.

International Journal of Advanced Remote Sensing and GIS

al., 2000.	AVHRR	1997.	between VCI and TCI index. Author has used
			NOAA-AVHRR data to derive VCI and TCI index.

Note: *TCI- Temperature Condition Index, VCI- Vegetation Condition Index, NDVI- Normalized Difference Vegetation Index, VHI- Vegetation Health Index, LST- Land Surface Temperature, RDRI- Remote Sensing Drought Risk Index, VH- Vegetation* Health, VHI- Vegetation Health Index, PDI-Perpendicular Drought Index, MPDI- Modified Perpendicular Drought Index, RDI- Reconnaissance Drought Index, WSVI- Water Supplying Vegetation Index.

According to the literature survey the satellite based drought indicators are most useful for drought monitoring and assessment purpose. Various satellite sensor data like Landsat, NOAA-AVHRR and MODIS satellite are used to monitor drought prone area. Meteorological parameters like precipitation, temperature are important to understand drought severity level.

6. Conclusion

The historical satellite imagery data and meteorological data are important to investigate drought phenomena. The cited paper has suggested that, the methods and techniques for continuous drought monitoring can be improved by linking historical AVHRR sensor data with MODIS sensor data. The advantage of Landsat imagery is that it provides high resolution data of 30m so that it is helpful to understand drought impact on small administrative area. This paper have studied various drought indices such as Normalized Difference Vegetation Index (NDVI), Drought Severity Index (DEVNDVI), Vegetation Condition Index (VCI), Temperature Condition Index (TCI), are useful to determine drought severity level.

Several meteorological variables such as precipitation, temperature, humidity and evapotranspiration are useful to understand drought and its impact on land cover. The deficit rainfall is responsible for desertification process. The long-term historical data of rainfall is used to calculate SPI index. The integration of geospatial technology in drought monitoring and decision support system can deliver better result of drought assessment in agricultural sector.

Acknowledgement

Authors would like to acknowledge and thanks to University Grants Commission (UGC), India for granting UGC SAP (II) DRS Phase-I & Phase-II F. No. 3-42/2009 & 4-15/2015/DRS-II for Laboratory facility to Department of Computer Science and Information Technology, Dr. Babasaheb Ambedkar Marathwada University, Aurangabad, Maharashtra, India and financial assistance under UGC -BSR Fellowship for this work.

References

Ayoade, J., 2004: *Introduction to Climatology for Tropics*, (Eds.) first published by John Wiley in 1983: Reprinted by Sam Adex Printers Felele Rab, Ibadan.

Colwell, N.R., 1984: *Remote Sensing Research for Agricultural Applications (USA)*. California University, Berkeley, Space Sciences Laboratory.

Dalezios, N.R., Bampzelis D., and Domenikiotis, C. *An Integrated Methodological Procedure for Alternative Drought Mitigation in Greece*, European Water. 2009. 27/28; 53-73.

Dash, P., 2005: *Land Surface Temperature and Emissivity Retrieval from Satellite Measurements*. A PhD Dissertation Submitted to Institute of Meteorology and Climate Research Forschungszentrum, Karlsruhe, University of Karlsruhe, Germany.

Ebrahimi, M., Matkan, A.A., Darvishzadeh, R. *Remote Sensing for Drought Assessment in Arid Regions- A Case Study of Central Part of Iran, "Shirkooh-yazd"*. Wagner W., Székely, B. (eds.): ISPRS TC VII Symposium – 100 Years ISPRS, Vienna, Austria. IAPRS. 2010. XXXVIII; 7B.

Edwards, D.C. and McKee, T.B., 1997: *Characteristics of 20th Century Drought in the United States at Multiple Time Scales*. Climatology Report Number 97-2, Colorado State University, Fort Collins, Colorado.

Ghulam, A., Qin, Q. and Zhan, Z. *Designing of the Perpendicular Drought Index.* Environmental Geology. 2007. 52 (6) 1045-1052.

Kanellou, E., Spyropoulos, N. and Dalezios, N.R. *Geoinformatic Intelligence Methodologies for Drought Spatiotemporal Variability in Greece.* Water Resource. Manage. 2011. 26; 1089-1106.

Kogan, F.N. *Application of Vegetation Index and Brightness Temperature for Drought Detection.* Advances in Space Research. 1995. 11; 91-100.

Kogan, F.N. *Global Drought Watch from Space*. Bulletin of the American Meteorological Society. 1997. 78; 621-636.

Kogan, F.N. *Remote Sensing of Weather Impacts on Vegetation in Non-Homogeneous Areas.* International Journal of Remote Sensing. 1990. 11 (8) 1405-1419.

Lambin, E. and Ehrlich, D. Combining Vegetation Indices and Surface Temperature for Land-Cover Mapping at Broad Spatial Scales. Intentional Journal Remote Sensing. 1995. 16 (3) 573-579.

Liu, L., Xiang, D., Zhou, Z., and Dong, X. Analyses the Modification Functions of the Drought Monitoring Model Based on the Cloud Parameters Method. In: 2008 Congress on Image and Signal Processing, IEEE. 687-691.

Mishra, A.K. and Desai, V.R. *Spatial and Temporal Drought Analysis in Kansabati River Basin India.* International River Basin Management. 2005. 3 (1) 31-41.

McKee, T.B., Doesken, N.J. and Kleist, J., 1995, January 15-20: *Drought Monitoring with Multiple Time Scales*. Preprints, 9th Conference on Applied Climatology, Dallas, Texas. 233-236.

Niemeyer, S. *New Drought Indices*. Options Méditerranéennes. Série A: Séminaires Méditerranéens. 2008. 80; 267-274.

NDMC, 2011: *Vegetation Drought Response Index.* National Climatic Data Center, http://drought.unl.edu/MonitoringTools/VegDRI.aspx. Accessed on 6th May 2015.

NOAA. *STAR- Global Vegetation Health Products*. National Oceanic and Atmospheric Administration (NOAA), 2011. http://www.star.nesdis.noaa.gov/smcd/emb/vci/VH/vh_browse.php. Accessed on 7th May 2015.

International Journal of Advanced Remote Sensing and GIS

Orhan Osman, Semih Enkercin, and Fikiz Dadaser-Celik. Use if Landsat Surface Temperature and vegetation Indices for Monitoring Drought in the Salt Lake Basin Area, Turkey. The Scientific World Journal. 2014. Article ID 1429. 11.

Peled, E., Dutra, E., Viterbo, P. and Angert, A. *Technical Note: Comparing and Ranking Soil Drought Indices Performance over Europe, through Remote-Sensing of Vegetation*. Hydrology Earth System. Science. 2010. 14; 271-277.

Palmer, W.C. *Meteorological Drought*, Research, Paper No. 45, U.S. Department of Commerce Weather Bureau, Washington, D.C. 1965. 58.

Rhee, J., Im, J. and Carbone, G.J. *Monitoring Agricultural Drought for Arid and Humid Regions Using Multi-Sensor Remote Sensing Data*. Remote Sensing. Environment. 2010. 114 (12) 2875-2887.

Surendra Singh Chaudhary, Garg, P.K. and Ghosh S.K. *Mapping of Agriculture Drought Using Remote Sensing and GIS*. International Journal of Scientific Engineering and Technology. 2012. 1 (4) 149-157.

Sumanta Das, Malini Roy Choudhury and Sachikanta Nanda. *Geospatial Assessment of Agricultural Drought - A Case Study of Bankura District, West Bengal.* International Journal of Agricultural Science and Research (IJASR). 2013. 3 (1) 1-28.

Thenkabail, P.S., Gamage, M.S.D.N., Smakhtin, V.U. *The Use of Remote Sensing Data for Drought Assessment and Monitoring in South West Asia. Colombo, Sri Lanka.* International Water Management Institute. 2004. 1-23.

Tsegaye, T. Improving Drought Management and Planning Through Better Monitoring in Africa. Drought Network News (1994–2001), 1998. 81. http://digitalcommons.unl.edu/droughtnetnews/81.

Wilhite, D. and Glantz, M. Understanding the Drought Phenomenon: The Role of Definitions. Water International. 1985. 10 (3) 111-120.

Wilhite, D.A., 2004: *Drought as a Natural Hazard*. In: International Perspectives on Natural Disasters: Occurrence, Mitigation, and Consequences, edited by Stoltman, J.P., Lidstone, J. and Dechano, L.M. Kluwer Academic Publishers, Dordrecht, Netherlands. 147-162.

Wilhite, D.A., 1993: *The Enigma of Drought. Drought Assessment, Management and Planning: Theory and Case Studies.* Kluwer Academic Publishers, Boston, Ma. 3-15.

Wang, P., Li, X., Gong, J. and Song, C. *Vegetation Temperature Condition Index and Its Application for Drought Monitoring*. In: Geoscience and Remote Sensing Symposium. IGARSS'01. IEEE 2001 International, Institute of Electrical and Electronics Engineers (IEEE). 2001. 141-143.

Wang, L. and Qu, J.J. *NMDI: A Normalized Multi-Band Drought Index for Monitoring Soil and Vegetation Moisture with Satellite Remote Sensing.* Geophysics. Res. Letter. 2007. 34 (20) L20405.