



1

2

3

4

5

6 7

8

9

10

12

14

15

International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx INTERNATIONAL JOURNAL OF APPLIED EARTH OBSERVATION AND GEOINFORMATION

www.elsevier.com/locate/jag

# Monitoring drought dynamics in the Aravalli region (India) using different indices based on ground and remote sensing data

C. Bhuiyan<sup>a</sup>, R.P. Singh<sup>a,b,\*</sup>, F.N. Kogan<sup>c</sup>

<sup>a</sup> Department of Civil Engineering, Indian Institute of Technology, Kanpur 208016, India

<sup>b</sup> Centre for Earth Observing and Space Research, School of Computational Sciences, George Mason University,

4400 University Drive, MS 5C3, Fairfax, VA 22030-4444, USA

<sup>c</sup> National Environmental Satellite Data and Information Service, National Oceanic and Atmospheric

Administration, Camp Springs, MD, USA

Received 30 September 2005; accepted 18 March 2006

### Abstract

The hard-rock hilly Aravalli terrain of Rajasthan province of India suffers with frequent drought due to poor and delayed 16 monsoon, abnormally high summer-temperature and insufficient water resources. In the present study, detailed analysis of 17 meteorological and hydrological data of the Aravalli region has been carried out for the years 1984-2003. Standardised 18 Precipitation Index (SPI) has been used to quantify the precipitation deficit. Standardised Water-Level Index (SWI) has been 10 20 developed to assess ground-water recharge-deficit. Vegetative drought indices like Vegetation Condition Index (VCI) and 21 Temperature Condition Index (TCI) and Vegetation Health Index (VHI) have been computed using NDVI values obtained from Global Vegetation Index (GVI) and thermal channel data of NOAA AVHRR satellite. Detailed analyses of spatial and temporal 22 23 drought dynamics during monsoon and non-monsoon seasons have been carried out through drought index maps generated in 24 Geographic Information Systems (GIS) environment. Analysis and interpretation of these maps reveal that negative SPI anomalies 25 not always correspond to drought. In the Aravalli region, aquifer-stress shifts its position time to time, and in certain pockets it is 26 more frequent. In comparison to hydrological stress, vegetative stress in the Aravalli region is found to be slower to begin but 27 quicker to withdraw.

<sup>28</sup> © 2006 Elsevier B.V. All rights reserved.

<sup>29</sup> Keywords: Drought; Monsoon; GIS; SPI; SWI; AVHRR; GVI; NDVI; VCI; TCI; VHI

30

#### 1. Introduction

32

31

Drought has significant adverse effect on the socio economic, agricultural, and environmental conditions.
 During drought, severe water-scarcity results in a region
 due to insufficient precipitation, high evapotranspira tion, and over-exploitation of water resources and/or

\* Corresponding author. Tel.: +91 512 259 7295;

fax: +91 512 259 7395.

combination of these parameters. Various methods and 38 indices have been developed by many scientists 39 (Palmer, 1965, 1968; Gibbs and Maher, 1967; Shafer 40 and Dezman, 1982; Kogan, 1990, 2002; McKee et al., 41 1993; Keyantash and Dracup, 2004) for drought 42 analysis using different drought-causative and 43 drought-responsive parameters such as rainfall, soil 44 moisture, potential evapotranspiration, vegetation con-45 dition, ground-water and surface-water levels. The 46 drought measuring parameters are not linearly related to 47 one another, these drought indices often have little 48 correlation among themselves. Therefore, it is quite 49

E-mail address: ramesh@iitk.ac.in (R.P. Singh).

<sup>0303-2434/\$ –</sup> see front matter 0 2006 Elsevier B.V. All rights reserved. doi:10.1016/j.jag.2006.03.002

2

## **ARTICLE IN PRESS**

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

common that when one drought index identifies drought 50 at a particular place, another drought index indicates a 51 normal condition at the same place and time (Bhuiyan, 52 53 2004). The drought perception varies significantly among regions of different climates (Dracup et al., 54 1980), while rainfall is the chief causative parameter, 55 soil moisture, streamflow, reservoir storage and ground-56 water level are the main parameters reflecting drought 57 58 impacts. While soil moisture responds to precipitation anomalies on a relatively short time scale, ground-59 water, streamflow, and reservoir storage reflect longer-60 term precipitation anomalies (Komuscu, 1999). Agri-61 cultural and vegetative drought is a manifestation of 62 meteorological and hydrological droughts. 63

64 The Asian south-west monsoon is a complex phenomena and the monsoon-rainfall is the only 65 possible means for ground-water recharge particularly 66 in the hard-rock hilly Aravalli region of semi-arid 67 western India. Scarcity of surface-water bodies in this 68 69 region has made people dependent entirely on groundwater resources for every purpose. A continuous spell of 70 poor rainfall in combination with high temperature in 71 72 successive years hinders ground-water recharge and imparts stress on ground-water resources leading to 73 74 severe drought in many parts during both the monsoon 75 and the non-monsoon seasons. The meteorological and hydrological droughts in turn affect the growth of the 76 77 natural vegetation and crop production.

Water budget is in deficit in most of the basins of 78 Indian Peninsula, where ground-water resources sustain 79 agricultural practices (Brown, 2001). Major parts of the 80 study area experience year-round water deficit. Drought 81 is frequent in the Aravalli region due to poor, limited 82 and untimely rainfall. The summer Indian monsoon is a 83 complex phenomenon and complexity is increasing due 84 to change in numerous atmospheric and land-cover 85 parameters, in recent years, the forecast of onset of 86 monsoon has become more difficult. Again, rainfall 87 88 occurs in this western region in the final lap of the sinuous path of the monsoon from the Arabian Sea 89 through southern India, the Bay of Bengal, eastern and 90 91 northern India, therefore, drought in this region is 92 unpredictable. Even commencement of rainfall at the right time cannot guaranty a drought-free season since 93 frequency, intensity, amount and duration of rainfall too 94 95 play crucial roles in the occurrence of drought.

In the present study, detailed analysis of seasonal
drought dynamics has been carried out to identify
spatio-temporal drought patterns in meteorological,
hydrological, and vegetative spheres. Time-series
drought maps of the Aravalli region have been
generated in a Geographic Information Systems

(GIS) environment using various drought indices. Since 102 aquifer-recharge, agricultural activities, and ecological 103 changes are controlled by rainfall, the present analysis 104 has been focussed on drought during the monsoon and 105 the non-monsoon periods. Standardised Precipitation 106 Index (SPI) has been used to monitor meteorological 107 drought. Standardised Water-Level Index (SWI) has 108 been developed to analyse hydrological drought. 109 Normalised Difference Vegetation Index (NDVI). 110 Vegetation Condition Index (VCI), Temperature Con-111 dition Index (TCI) and Vegetation Health Index (VHI) 112 have been employed to assess vegetative drought. VHI 113 has been developed through VCI and TCI and is found 114 to be more effective compared to other indices in 115 monitoring vegetative drought (Kogan, 1990, 2001; 116 Singh et al., 2003). Finally, relative drought dynamics in 117 meteorological, hydrological, and vegetative spheres of 118 the Aravalli region has been compared. 119

101

120

### 2. Study area

Rajasthan, the largest state of India is situated in the 121 northwest of the country and exhibits diverse climates in 122 different parts (Fig. 1a). The Aravalli range, one of the 123 oldest mountain ranges of the world runs along the NE-124 SW direction for more than 700 km covering nearly 125  $40,000 \text{ km}^2$  area. The study area (latitude N23°30'-126  $N26^{\circ}18'$  and longitude  $E72^{\circ}24'-E74^{\circ}36'$ ) covers an 127 area of about 25,000 km<sup>2</sup> of the main block of the 128 Aravalli range (Fig. 1b). The region is dry for most of 129 the year except the rainy season, and exhibits a semi-130 arid climate. Rainfall in this region occurs mainly 131 during June-September through the monsoon wind; 132 non-monsoon rainfall is limited and irregular. Water 133 resources, vegetation, and agriculture are under control 134 of the monsoon. The aquifer condition and water 135 resources in this region vary from place to place due to 136 variations in soil, lithology, land-use, geomorphology, 137 topography, and climatic conditions. 138

The normal water-table depth also varies in different 139 lithologic domains. Gneiss and schist covers most parts 140 in the north, central and southeast where water table lies 141 in the depth range of 10-20 m below ground surface. In 142 phyllites and phyllitic-schists of the south, south-central 143 and eastern Aravalli, the depth of water normally lies 144 within 5-15 m range. Western part of the region is 145 composed mainly of granite and quartzite along with 146 calcite-schist as the subordinate rock type (DST, 1994). 147 In granitic aquifers, the average depth of water varies in 148 the range of 7–15 m while under calc-schist the water 149 level varies between 5 and 10 m below ground surface 150 (GWD, 2000). In the Aravalli region, agricultural 151

JAG 128 1-14

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

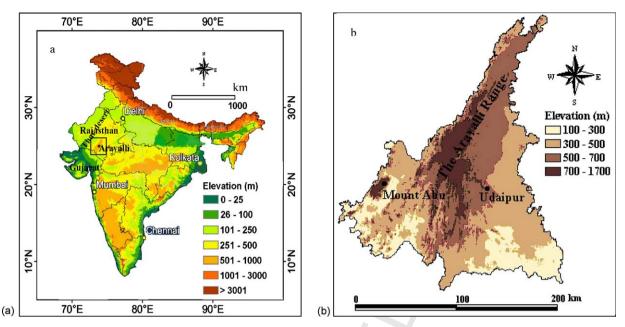


Fig. 1. (a) Location of the Aravalli region and (b) study area.

#### 151

152 activities are influenced and controlled directly by 153 rainfall and availability of water resources. Monsoon (Kharif) crop is the main crop and is cultivated during 154 155 June–September whereas winter (Rabi) crop is sown in mid October and harvested in March. In many parts of 156 the region, summer crop and vegetables are cultivated 157 158 during March-May depending upon the availability of irrigation-water. In some parts of the Aravalli region, 159 double cropping is practiced whereas many pockets 160 have uncultivated fallow land. 161

# Table 1SPI, SWI, and VHI classification schemes

Classification Schemes Drought Classes	SPI (McKee et al., 1993)	SWI (Bhuiyan, 2004)	VHI (Kogan, 2002)
Extreme drought	<-2.0	> 2.0	< 10
Severe drought	<-1.5	> 1.5	< 20
Moderate drought	<-1.0	> 1.0	< 30
Mild drought	< 0.0	> 0.0	< 40
No drought	> 0.0	< 0.0	>40

#### 3. Drought indices

#### 3.1. Standardised Precipitation Index

163

162

161

McKee et al. (1993, 1995) proposed Standardised Precipitation Index to assess anomalous and extreme precipitation. Monthly precipitation data are taken from Ground Water Department, Jodhpur, Rajasthan. Since precipitation data are mostly skewed, in order to compute SPI, precipitation data are normalised 169 4

181

186

## **ARTICLE IN PRESS**

169 using gamma function. SPI is based on the probability of 170 precipitation for any desired time scale. The SPI is based 171 on the probability of precipitation for any desired time 172 173 scale and spatially invariant indicator of drought (Guttman, 1998, 1999). It involves fitting a gamma probability 174 175 density function to a given frequency distribution of precipitation totals for a station (Edwards and McKee, 176 1997). The SPI is computed by dividing the difference 177 178 between the normalised seasonal precipitation and its long-term seasonal mean by the standard deviation. Thus,

$$1\$9 \qquad \text{SPI} = \frac{X_{ij} - X_{im}}{\sigma} \tag{1}$$

182 where,  $X_{ij}$  is the seasonal precipitation at the *i*th rain-183 gauge station and *j*th observation,  $X_{im}$  the long-term 184 seasonal mean and  $\sigma$  is its standard deviation. Five classes of SPI as shown in Table 1 are used in the present study.

### 185 3.2. Standardised Water-Level Index

Standard Water-Level Index was proposed to 187 monitor anomaly in ground-water level as a correspon-188 dent of aquifer-stress (Bhuiyan, 2004). The ground-189 water level data are taken from the Ground Water 190 Department, Jodhpur, Rajasthan. The SWI is computed 191 by normalising seasonal ground-water level and 192 dividing the difference between the seasonal water 193 level and its long-term seasonal mean, by standard 194 deviation. For normalisation, an incomplete gamma function has been used similar to SPI. Thus,

$$\frac{196}{197} \qquad \text{SWI} = \frac{W_{ij} - W_{im}}{\sigma} \tag{2}$$

where,  $W_{ij}$  is the seasonal water level for the *i*th well and *j*th observation,  $W_{im}$  its seasonal mean, and  $\sigma$  is its standard deviation.

SWI is an indicator of water-table decline and an indirect measure of recharge, and thus an indirect reference to drought. Since ground-water level is measured from ground surface down into observation wells, positive anomalies correspond to water-stress and negative anomalies represent 'no drought' condition (Table 1).

206 207

198

### 3.3. Vegetative drought indices 🥿

Vegetative and agricultural droughts reflect vegetation-stress caused due to adverse climatic and hydrologic factors. NDVI reflects the vegetation condition
through the ratio of responses in near infrared (Ch2) and
visible (Ch1) bands of Advanced Very High Resolution
Radiometer (AVHRR) of NOAA. Vegetative Condition

Index is related to the long-term minimum and 213 maximum NDVI (Kogan, 1990) and is related as:

$$NDVI = 100 \times \frac{Ch2 - Ch1}{Ch2 + Ch1}$$
(3)

$$VCI = 100 \times \frac{NDVI_{max} - NDVI}{NDVI_{max} - NDVI_{min}}$$
(4) 216

where NDVI, NDVI<sub>min</sub>, and NDVI<sub>max</sub> are the seasonal 218 average of smoothed weekly NDVI, its multi-year 219 absolute minimum and its maximum, respectively. 220 We have taken NOAA AVHRR NDVI product for 221 the period 1984–2003 from Distributed Active Archive 222 Centre (DAAC) at the Goddard Space Flight Centre 223 (GSFC) (http://disc.gsfc.nasa.gov). 224

Vegetative drought is closely related with weather 225 226 impacts. In NDVI, strong ecological component 227 subdues the weather component. On the other hand, 228 VCI separates the short-term weather-related NDVI 229 fluctuations from the long-term ecosystem changes 230 (Kogan, 1990, 1995). Therefore, while NDVI shows seasonal vegetation dynamics, VCI varies in 231 232 the range 0 and 100 to reflect relative changes in the 233 vegetation condition from extremely bad to optimal 234 (Kogan, 1995; Kogan et al., 2003). Similarly, Temperature Condition Index represents the relative 235 236 change in thermal condition in terms of brightness temperature whose values are obtained from the 237 238 thermal band (Ch4) of NOAA-AVHRR. The TCI is given as:

$$TCI = 100 \times \frac{BT_{max} - BT}{BT_{max} - BT_{min}}$$
(5) 239

where BT,  $BT_{min}$ , and  $BT_{max}$  are the seasonal average of 241 weekly brightness temperature, its multi-year absolute 242 minimum, and maximum, respectively. 243

244 Higher VCI values correspond to favourable moisture condition and represent unstressed vegetation. Subtle 245 246 changes in vegetation health due to thermal stress in 247 specific could be monitored through analysis of TCI data 248 (Kogan, 1995, 2001, 2002). While VCI and TCI 249 characterise by varying moisture and thermal conditions of vegetation, Vegetation Health Index represents overall 250 251 vegetation health which was used by Kogan (2001) who 252 gave five classes (Table 1) of VHI that was used for drought mapping. VHI is computed and expressed as:

$$VHI = 0.5(VCI) + 0.5(TCI)$$
(6) 253

### 4. Drought mapping

256

The terms 'monsoon' and 'non-monsoon' have been <sup>257</sup> used for meteorological and vegetative drought analysis <sup>258</sup>

258

268

## ARTICLE IN PRESS

since it involves summing up or averaging of the 259 monitoring parameters. For hydrological drought 260 analysis, the terms 'pre-monsoon' and 'post-monsoon' 261 262 have been used since ground-water level is measured twice a year, once before the commencement of the 263 monsoon and again after the end of the monsoon. Thus, 264 the non-monsoon 1984–1985 or the pre-monsoon 1985 265 266 consists of the months October-December of 1984 and 267 January-May of 1985.

#### 4.1. Mapping meteorological drought with SPI

SPI has been used to quantify the precipitation deficit 269 in the monsoon and the non-monsoon periods from 270 271 1984 to 2003. Monthly rainfall data have been collected from Ground Water Department, Jodhpur, Rajasthan. 272 273 The use of 1961–1990 thirty-year averaging period for the calculation of SPI is questionable particularly for 274 arid regions (Agnew, 2000). Therefore, for the 275 276 computation of SPI, long-term mean is calculated using seasonal rainfall data of maximum available 277 278 years, i.e. of 38 years (1966–2003). Since drought is a regional phenomenon, to demarcate its spatial extent, 279 SPI values of the 35 rain-gauge stations in and around 280 281 the Aravalli region (Fig. 2a) have been interpolated 282 using spline interpolation technique in ArcView 3.2a GIS package. Classification of SPI maps has been 283 carried out using the method proposed by Mc Kee et al. 284

(1995) and explained by Edwards and McKee (1997), to represent various hydro-meteorological drought intensities. 287

#### 4.2. Mapping hydrological drought with SWI

The pre-monsoon and post-monsoon ground-water 289 levels of 541 wells of the region (Fig. 2b) have been 290 collected from the Ground Water Department, 291 Jodhpur, Rajasthan, and have been analysed to study 292 the drought effects on hydrological regime. SWI 293 value has been classified and used as a reference to 294 hydrological drought severity (Table 1). SWI has been 295 computed using the mean seasonal water levels of 20 296 vears (1984-2003). SWI values of the wells have 297 been interpolated in a GIS environment to generate 298 SWI maps of the region using similar technique used 299 in SPI. 300

### 4.3. Mapping vegetative drought with VHI

VCI, TCI, and VHI values of the study area have 302 been computed for the monsoon and the non-monsoon 303 periods during the years 1984-2002 by averaging 304 weekly values. VHI maps have been generated by 305 plotting pixel values of VHI having 16 km spatial 306 resolution, and have been classified to represent various 307 drought intensities (Table 1). 308

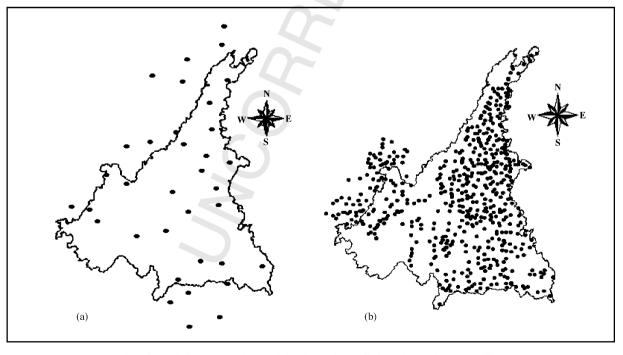


Fig. 2. (a) Rain-gauge stations and (b) observation wells in and around the Aravalli.

284 285 286

5

288

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

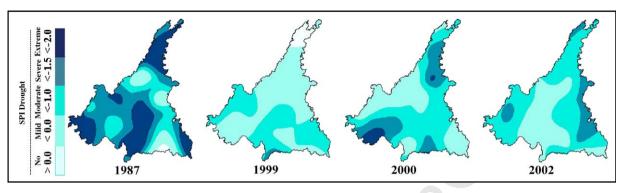


Fig. 3. Years of intense meteorological drought during monsoon.

#### 5. Results and discussion

+ Models

6

#### 309

308

### 5.1. Meteorological drought

310

311 Severe to extreme drought occurred during 1984–

312 1987 in discrete pockets in two seasons, during 1987

monsoon, the entire Aravalli region suffered with 313 drought. In other years, monsoon period was mostly 314 drought-free, moderate drought appeared in some parts 315 of the Aravalli region during the monsoon season of 316 1991, 1993, 1995, and 1999. Severe drought was 317 observed in the year 2000, when the northern, eastern, 318

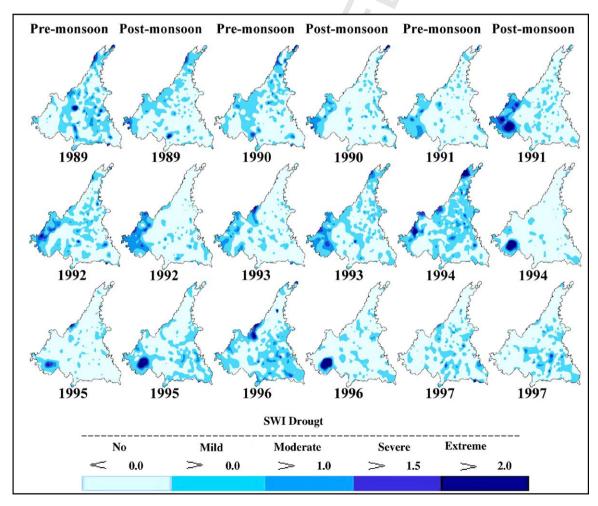


Fig. 4. Water-table depletion-zones.

southern, and southwester sectors of the province were

affected by severe to extreme drought. During 2002, the

monsoon was poor as a result the whole region suffered

with drought. During 1999–2002, just within a span of 4

years, monsoon-drought appeared throughout the

Aravalli region three times (Fig. 3). During 2002, most

parts of India affected by below-average rainfall,

causing the first all-India drought since 1987 ending

a 14-year run of average monsoon rains. The monsoon

season of 2002 was 19% drier compared to normal

(Waple and Lawrimore, 2003), and as much as 60–70%

below normal in whole of Rajasthan region. Monsoon-

drought of 2002 was unique since rain failed in the very

beginning of the season (Samra, 2002). In this year

deviation from the normal rainfall was as high as -49%

in Rajsamand, -67% in Sirohi, and -33% in Udaipur

districts of Rajasthan province that comprise the study

area (UNDP, 2002). During the non-monsoon period

most parts of the Aravalli region were drought-free

except some particular years. During 1984–1991, the

region experienced non-monsoon drought in the

318

319

320

321

322

323

324

325

326

327

328

329

330

331

332

333

334

335

336

337

338

339

## **ARTICLE IN PRESS**

alternate years, however, the intensity was mild to moderate for most parts. Various parts of the region experienced mild to moderate non-monsoonal drought

5.2. Hydrological drought

during 1991-1992 and 1995-1996.

Decline of water level takes place in various pockets 345 both during the monsoon and the non-monsoon periods 346 depending upon rainfall, temperature and draft. During 347 years 1984-1986, major parts of the Aravalli region 348 were free from water-stress despite of poor rainfall. 349 Except the western part, the region experienced severe 350 water-stress during 1987 due to monsoon failure. Till 351 the pre-monsoon of 1989, eastern Aravalli pockets 352 experienced water-table decline but the western part 353 was free from water-stress. The monsoon of 1989 is 354 marked by a shift in declining trend from the east 355 towards the west. Rainfall alone could not be 356 responsible for this as no such shift of rainfall pattern 357 was observed. This shift caused some western pockets 358

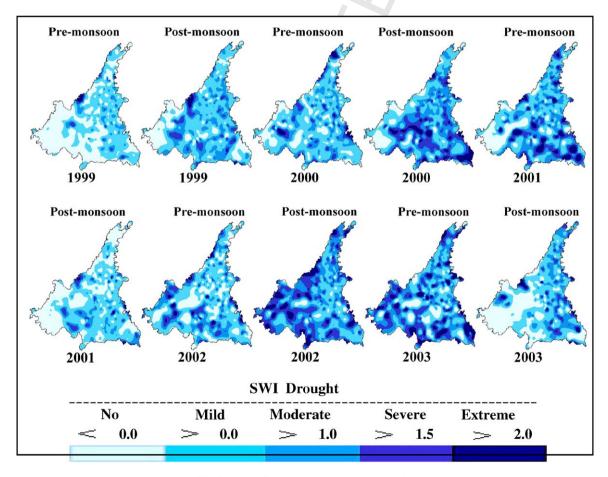


Fig. 5. Years of continuous hydrological drought.

341

342

343

344

358

377

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

to suffer from moderate (SWI > 1.0) to extreme 359 (SWI > 2.0) during 1989-1996 (Fig. 4). Although 360 discrete pockets all over the region experienced water-361 362 stress in these years, decline was not consistent in any part other than the western part. The continuous decline 363 of the water level is supposed to be due to enormous 364 ground-water consumption exceeding its recharge 365 resulting negative water budget. Due to low rate of 366 367 ground-water recharge and higher rate of consumption. restoration of ground-water level generally takes a long 368 time (Kondoh et al., 2004). Severe hydrological drought 369 appeared in the region during 1999-2003 as rain-clouds 370 failed to precipitate (Fig. 5). As revealed by the post-371 monsoon ground-water level, the drought condition was 372 373 worst during the monsoon of 2002, when most of the wells and reservoirs dried up. In Rajsamand, Sirohi and 374 Udaipur districts 21 of 33 reservoirs/tanks became dry 375 in 2002 during the monsoon (UNDP, 2002). 376

### 5.3. Vegetative drought

The annual cycle of vegetation in Rajasthan state is bimodal in contrast with the unimodal rainfall regime

379 (Doi, 2001). During 1984 and prior to the 1985 380 monsoon, the Aravalli region shows normal vegetation 381 (VHI > 40). During the monsoon of 1985, the vegeta-382 tion experienced stress and loss of vegetation health. 383 The region experienced exceptionally a continuous 384 drought spell since the monsoon of 1985 until the 385 commencement of monsoon in 1988 owing to poor 386 rainfall in three consecutive monsoon and one inter-387 mediate non-monsoon seasons (Fig. 6). The worst 388 situation was encountered during the 1987 monsoon 389 when the whole region suffered with the severe to 390 extreme vegetative drought (VHI < 20) due to extreme 391 rainfall deficiency. The region was almost drought-free 392 in the following years, and mild to moderate droughts 393 appeared in certain seasons locally. Drought appeared 394 all over the Aravalli region again during the monsoon of 395 2000, after a gap of 9 years. During 2000–2002 the 396 region was affected by drought (10 < VHI < 40) owing 397 to poor rainfall and water-stress (Fig. 7). During 2002, 398 vegetation in the Aravalli region similar to most north-399 western parts of India experienced stress (VHI < 20) 400 dew to deficient monsoon (Singh and Kogan, 2002). 401 Agricultural practices, particularly timing of sowing 402

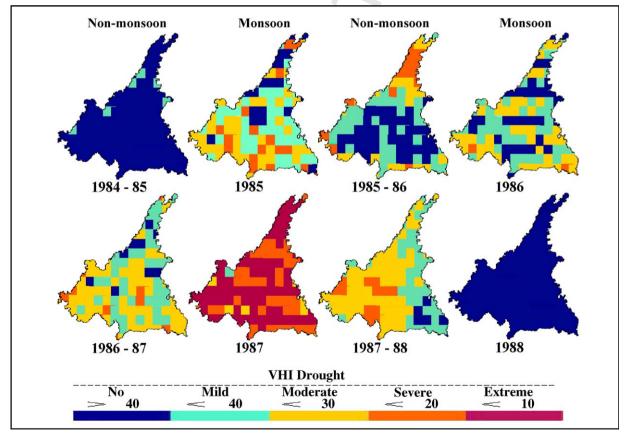
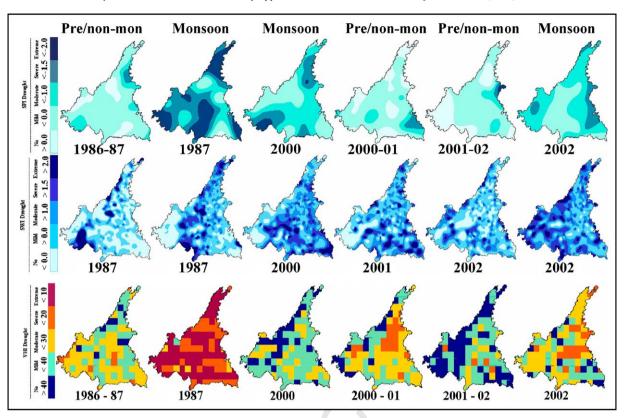


Fig. 6. Vegetative-drought dynamics during 1984–1988.



C. Bhuiyan et al. / International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

Fig. 7. Years of good correlation among SPI, SWI, and VHI.

402

and harvesting has a significant bearing in shaping the 403 NDVI patterns (Doi, 2001). The agriculture was 404 405 severely affected during the year 2002, since crops could not be sown at all due to failure of rainfall-406 commencement (Samra, 2002). Estimated damage of 407 actual crop-area percentage in the Rajsamand, Sirohi 408 and Udaipur districts comprising the study area during 409 410 the monsoon of 2002 are 85, 50, and 25%, respectively, owing to drought (UNDP, 2002). 411

#### 5.4. Relative drought dynamics

412

SPI maps indicate that meteorological drought in the 413 Aravalli region appears randomly in both the monsoon 414 and non-monsoon seasons. Irregular drought pattern in 415 this region is due to inconsistent rainfall distribution 416 (Fig. 8). Meteorological drought scenario in the region 417 418 changed continuously with season depending upon rainfall amount and spatial distribution. Again, since 419 drought is not persistent to any particular sector for 420 more than two consecutive monsoon or non-monsoon 421 422 seasons, no 'drought zone' can be delineated.

423 Drought in the ground-water system develops only 424 slowly from meteorological droughts through rechargedeficit, and over-exploitation of ground-water resources 425 further enhances (Peters et al., 2003). During 1984– 426 2003, the depleting trend of water table shifted 427 periodically from the east towards the west and vice 428 versa (Fig. 9). However, certain pockets particularly in 429 the western sector continue to suffer from water-stress 430 for a long duration irrespective of good or poor rainfall. 431

Vegetative drought neither follows any spatio-432 temporal pattern nor shows a linear relationship with 433 meteorological and/or hydrological droughts. An earlier 434 study by Singh et al. (2003) failed to find any direct 435 relationship among VCI, TCI, and precipitation. Good 436 correlation however has been observed between SPI and 437 VHI (Fig. 10) during the monsoon season (1985, 1986, 438 1987, 1990, and 1994) and between SWI and VHI in 439 certain years during the non-monsoon season (1985-440 1986, 1989-1990, 1994-1995, 1995-1996, and 1996-441 1997) (Fig. 11). The reason could be that in the Aravalli 442 region rain, 90% of the annual rainfall occurs during the 443 monsoon, directly supporting Kharif cropping that 444 covers 65% of annual cultivation, whereas in the non-445 monsoon period agriculture is entirely dependent on 446 irrigation from ground-water resources. Therefore, 447 during monsoon vegetation health is dependent on 448

#### + Models

# ARTICLE IN PRESS

10

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

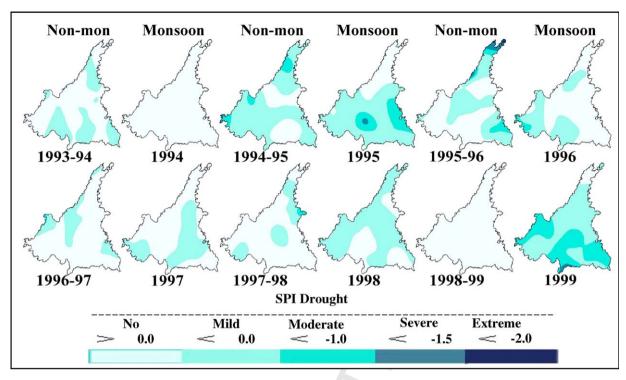


Fig. 8. Irregular meteorological drought.

448

rainfall but in between termination of one monsoon and
commencement of the next, it is controlled by irrigation
through ground water. In certain years, reasonably good
match is observed among all three drought indices—
SPI, SWI, and VHI (Fig. 7).

Drought impacts are usually first apparent in agriculture (Komuscu, 1999). However, the VHI maps reveal that although vegetation growth and health is dependent on water supply either by rainfall or by irrigation, vegetation in the Aravalli region could withstand adverse meteorological and hydrological conditions and maintained normal vegetation health for

several seasons in spite of poor rainfall or water-stress 461 (Fig. 12). 462

Analysis, correlation and comparison amongst 463 SPI, SWI, and VHI maps indicate that a deficient 464 rainfall as per the SPI index does not always 465 correspond to hydrological or vegetative drought. 466 On the contrary, drought may appear in the 467 hydrological and vegetative spheres inspite of normal 468 rainfall according to SPI. The lack of correspondence 469 of hydrological and vegetative drought with SPI is 470 more prominent during the non-monsoon season 471 (Fig. 13). 472

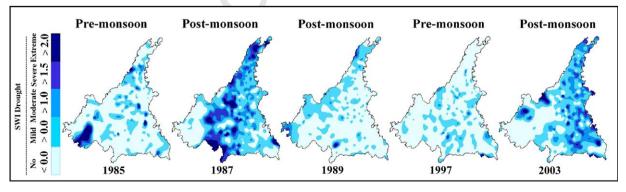


Fig. 9. Spatio-temporal shift of hydrological drought.

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

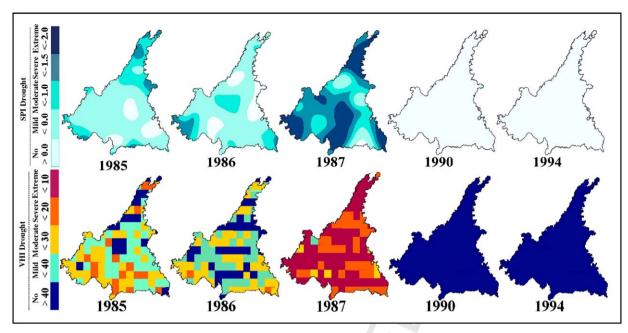


Fig. 10. Correlation between monsoonal SPI and VHI.

#### 472

### 6. Conclusions

+ Models

473

The SPI maps indicate that meteorological drought appears in the Aravalli region in a random fashion, in either seasons and in some years in both the seasons. However, seasonal meteorological drought has a short life span. The SWI maps reveal that in the Aravalli478region aquifer-stress shifts its position time to time and479the migration is alternate from east to west and vice480versa. In comparison to hydrological stress, vegetative481stress in the Aravalli region is slower to begin but482quicker to withdraw. Vegetation generally maintains483

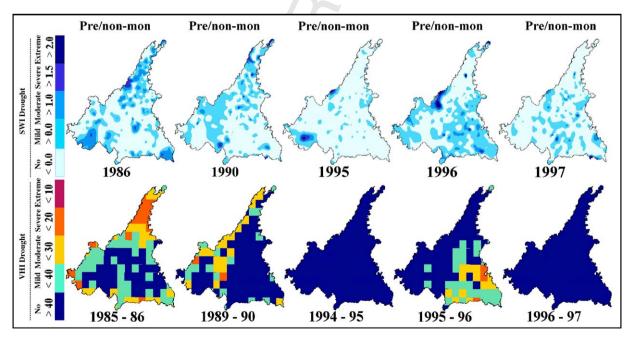


Fig. 11. Correlation between non-monsoonal SWI and VHI.

11

#### + Models

# ARTICLE IN <u>PRESS</u>

483

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

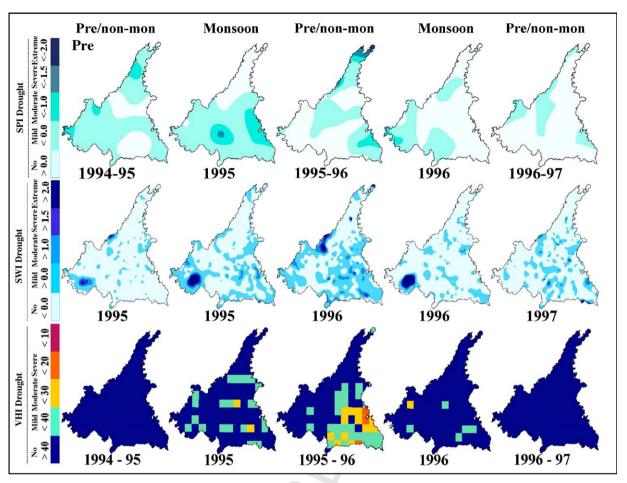


Fig. 12. Resistance of vegetation to adverse hydro-meteorological condition.

484 normal health for longer duration. There are some
485 hydrological stress-zones and drought prone areas.
486 However, no meteorological or vegetative drought487 zones could be demarcated.

The time-series maps of different droughts reveal no 488 linear correlation among meteorological, hydrological, 489 490 and vegetative droughts in the Aravalli region. Moreover, speed of drought development and drought 491 duration also varies widely. Therefore, identification, 492 classification, and analysis of drought dynamics are 493 highly influenced by the monitoring parameters. 494 Natural hazards refer to the adverse impacts on natural 495 spheres and not to the causes for the impacts. SPI 496 497 monitors precipitation deficit, the primary cause for drought development but takes no account of the 498 impact. Despite of negative SPI, a region could be free 499 from water-stress and might maintain normal vegeta-500 501 tion. Thus, negative SPI anomalies not always correspond to drought. On the contrary, drought may 502 appear in hydrologic and vegetative spheres inspite of 503

positive SPI. Besides, SPI classification schemes rely on the assumption of drought to follow the scale of probability and normal statistics which is debatable. 506 SWI and VHI, however, represent the negative impact of adverse meteorological and hydrological conditions on water and vegetation, therefore SWI and VHI present better picture of drought. 510

### Uncited references

Kroll and Vogel (2002), Samra (2004), Wu et al.	512
(1997), Yue and Pilon (2005), Yevjevich (1972), Zhou	513
and Wang (2003).	514

### Acknowledgements

Sincere thanks are due to Dr. S.M. Pandey, Ex-Chief 516 Geophysicist, and Mr. Ashok Bordia, Sr. Hydrologist, 517 Ground Water Department, Rajasthan, for their kind 518 help in providing all kind of meteorological and 519

511

515

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

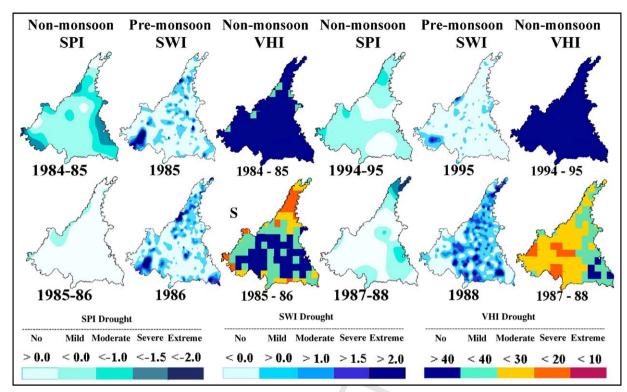


Fig. 13. Failure of SPI to correspond with hydrological and vegetative droughts.

519

hydrological data used in the present study. We are
grateful to the two reviewers for giving their suggestions
that have helped us to improve the original version of the
paper.

#### References

- 524 525
- 526 Agnew, C.T., 2000. Using the SPI to identify drought. Drought 527 Network News 12 (1), 6–12.
- Bhuiyan, C., 2004. Various drought indices for monitoring drought
   condition in Aravalli terrain of India. In: Proceedings of the XXth
   ISPRS Conference. Int. Soc. Photogramm. Remote Sens., Istanbul
   (Available at: http://www.isprs.org/istanbul2004/comm7/papers/
- 243.pdf).
  Brown, L. (Ed.), 2001. State of the World. Worldwealth Institute,
- 534 Diamond-Sha, Tokyo, p. 422.
- 535 Doi, R.D., 2001. Vegetational response of rainfall in Rajasthan using
   536 AVHRR Imagery. J. Indian Soc. Remote Sens. 29 (4), 213–224.
- Dracup, J.A., Lee, K.S., Paulson Jr., E.G., 1980. On the definition of
  droughts. Water Resour. Res. 16 (2), 297–302.
- 539 Department of Science and Technology (DST), 1994. Resource Atlas
  540 of Rajasthan. Government of Rajasthan, India, Jaipur, p. 28.
- 541 Edwards, D.C., McKee, T.B., 1997. Characteristics of 20th Century
- 542Drought in the United States at Multiple Time Scales. Climatology543Report Number 97–2. Colorado State University, Fort Collins, CO,544pp. 1–155.
- 545 Gibbs, W.J., Maher, J.V., 1967. Rainfall Deciles as Drought Indicators.
- 546 Bureau of Meteorology Bulletin No. 48. Commonwealth of Australia, Melbourne.

- Ground Water Department (GWD), Government of Rajasthan, India, 2000. Annual Report (Unpublished). p. 37.
- Guttman, N.B., 1998. Comparing the Palmer Drought Index and the Standardized Precipitation Index. J. Am. Water Resour. Assoc. 34 (1), 113–121.
- Guttman, N.B., 1999. Accepting the Standardized Precipitation Index: a calculation algorithm. J. Am. Water Resour. Assoc. 35 (2), 311– 322.
- Keyantash, J., Dracup, J.A., 2004. An aggregate drought index: assessing drought severity based on fluctuations in the hydrologic cycle and surface water storage. Water Resour. Res. 40 , doi:10.1029/2003WR002610 (W09304).
- Kroll, C.N., Vogel, R.M., 2002. Probability distribution of low streamflow series in the United States. J. Hydrol. Eng. 7 (2), 137–146.
- Kogan, F.N., 1990. Remote sensing of weather impacts on vegetation in non-homogeneous areas. Int. J. Remote Sens. 11 (8), 1405–1419.
- Kogan, F.N., 1995. Application of vegetation index and brightness temperature for drought detection. Adv. Space Res. 15 (11), 91– 100.
- Kogan, F.N., 2001. Operational space technology for global vegetation assessment. Bull. Am. Meteorol. Soc. 82 (9), 1949–1964.
- Kogan, F.N., 2002. World droughts in the new millennium from AVHRR-based Vegetation Health Indices. Eos Trans. Am. Geophy. Union 83 (48), 562–563.
- Kogan, F.N., Gitelson, A., Edige, Z., Spivak, I., Lebed, L., 2003.
  AVHRR-based spectral vegetation index for quantitative assessment of vegetation state and productivity: calibration and validation. Photogramm. Eng. Remote Sens. 69 (8), 899–906.
  574
- Komuscu, A.U., 1999. Using the SPI to analyze spatial and temporal<br/>patterns of drought in Turkey. Drought Network News 11 (1), 7–<br/>13.576<br/>577

546

547

548

549

550

551

552

553

554

555

556

557

558

559

560

561

562

563

564

565

566

567

568

569

#### + Models

## **ARTICLE IN PRESS**

C. Bhuiyan et al./International Journal of Applied Earth Observation and Geoinformation xxx (2006) xxx-xxx

- Kondoh, A., Harto, A.B., Eleonora, R., Kojiri, T., 2004. Hydrological
  regions in monsoon Asia. Hydrol. Process. 18, 3147–3158.
- McKee, T.B., Doesken, N.J., Kleist, J., 1993. The relation of drought
   frequency and duration to time scales. Proceedings of the Eighth
   Conference on Applied Climatology. Am. Meteorol. Soc. Boston,
   pp. 179–184.
- 584 Mc Kee, T.B., Doesken, N.J., Kleist, J., 1995. Drought monitoring
  585 with multiple time scales. In: Proceedings of the Ninth Conference
  586 on Applied Climatology, Am. Meteorol. Soc. Boston, pp. 233–
  587 236.
- Palmer, W.C., 1965. Meteorological drought. Research Paper No. 45,
   U.S. Department of Commerce Weather Bureau, Washington, DC.
- Palmer, W.C., 1968. Keeping track of crop moisture conditions, nationwide: The new Crop Moisture Index. Weatherwise 21, 156–161.
- 593 Peters, E., Torfs, P.J.J.F., van Lanen, H.A.J., Bier, G., 2003. Propaga594 tion of drought through groundwater—a new approach using
  595 linear reservoir theory. Hydrol. Processes 17, 3023–3040.
- Samra, J.S., 2004. Review and analysis of drought monitoring, declaration and management in India. Working Paper 84. International Water Management Institute, Colombo, Sri Lanka, pp. 1– 31.
- Shafer, B.A., Dezman, L.E., 1982. Development of a Surface Water
   Supply Index (SWSI) to assess the severity of drought conditions

in snowpack runoff areas. In: Proceedings of the Western Snow 602 Conference, Fort Collins, CO, pp. 164–175. 603

- Singh, R.P., Kogan, F.N., 2002. Monitoring vegetation condition from NOAA operational polar-orbiting satellites over Indian region. J.
   Indian Soc. Remote Sens. 30 (3), 117–118.
- Singh, R.P., Roy, S., Kogan, F.N., 2003. Vegetation and temperature condition indices from NOAA–AVHRRA data for drought mon-itoring over India. Int. J. Remote Sens. 24 (22), 4393–4402.
- United Nations Development Programme (UNDP), 2002. UNDP
  Mission Report on Drought Damage Assessment and Agricultural
  Rehabilitation for Drought Affected Districts of Rajasthan Draft 2,
  pp. 1–20 (Available at: http://www.undp.org.in/dmweb/
  RAJASTHAN%20DROUGHT.pdf, accessed on: 18th November
  2005).
- Waple, A.M., Lawrimore, J.H., 2003. State of the climate in 2003. 616Bull. Am. Meteorol. Soc. Boston 84 (6), S1–S68. 617
- Wu, J., Zhang, R., Yang, J., 1997. Estimating infiltration recharge 618 using a response function model. J. Hydrol. 198, 124–139.
- Yue, S., Pilon, P., 2005. Probability distribution type of Canadian 620 annual minimum streamflow. Hydrol. Sci. J. 50 (3), 427–438.
- Yevjevich, V., 1972. Probability and Statistics in Hydrology. Water 622
   Resources Publications, CO, pp. 148–149. 623
- Zhou, Z., Wang, Z., 2003. Theory and methods of drought system 624 analysis. Nat. Sci. 1 (1), 62–66. 625

<sup>14</sup>