



UNIVERSITI PUTRA MALAYSIA

***DEVELOPMENT OF A MATHEMATICAL MODEL FOR
HYDROCLIMATOLOGICAL DROUGHT FORECASTING***

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**DEVELOPMENT OF A MATHEMATICAL MODEL FOR
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By

ALIREZA ESLAMI

**Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia,
in Fulfilment of the Requirements for the Degree of Doctor of Philosophy**

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DEDICATION

Dedicated To:

**All the Martyrs, Patient's Mother Bountiful and Father Kind-hearted Who, I
Alive with His Memories Now and to My Wife "Masoumeh", My Lovely Girl
"Faezeh" and Two My Sons "Foad and Farzad"**

Abstract of thesis presented to the senate of Universiti Putra Malaysia in fulfilment of the requirements of the degree of Doctor of Philosophy

DEVELOPMENT OF A MATHEMATICAL MODEL FOR HYDROCLIMATOLOGICAL DROUGHT FORECASTING

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Knowledge of hydrological conditions and forecasting its occurrence for planning and for efficient use of water resources are essential. In this regard, the phenomenon of drought poses some destructive environmental effects on various aspects of hydrological processes. Anticipating the start of a drought phenomenon is very complex. Nevertheless, it is crucial to determine the most probable hydrological condition, after a certain condition of meteorological drought has occurred. Determining how long it will take for the hydrological conditions to be affected by the meteorological drought is also an important issue.

The main purpose of this research lies in attaining a method for predicting the occurrence of different hydrological conditions (states) according to various meteorological conditions for a time step ahead, in a basin. For this purpose, a stochastic model that comprises the hydro-climatological variables, based on Markov chain theory is developed. To accomplish this, meteorological and hydrological drought indices were employed. In this case, the time series of precipitation and streamflow were used to determine the different meteorological and hydrological

states. Performance of some of the well known meteorological drought indices were evaluated for the selected study area, which was the Semi-Mediterranean region in the North of Iran. Different meteorological and hydrological states were determined using the appropriate drought indices. Besides, the lag time between different meteorological and hydrological states was recognized using the monthly precipitation and streamflow time series. Probabilities of occurrence of different meteorological states were predicted via a one-dimensional transition probability matrix (ODTPM). Then, with the concept borrowed from the Markov chain theory and with regards to the basin lag time, the ODTPM was further developed into a two-dimensional transition probability matrix (TDTPM). This procedure led to a matrix as the main output of this study, which is called the Hydroclimatological Matrix (HCM). Thus, employing the ODTPM and TDTPM, probabilities of occurrence of different hydrological states were forecasted via a Prediction Matrix. Forecast verification was carried out via discrete predictors as a categorical method. Furthermore, the cross-validation approach and root mean square error (RMSE) methods were used for checking the consistence of probability shifts and robustness of the desired matrices. In particular, three study areas, which were Frizi, Joestan and Chalus Basins with various hydroclimatical variables were selected on which the proposed method could be implemented.

From this study, it is found that the non-parametric Deciles meteorological drought index method is the appropriate index. The flow duration curve (FDC) method was selected for categorizing the hydrological drought occurrence as an analogue method with the Deciles index. Following this, threshold levels in the range from Q_{50} to Q_{95} were adopted to distinguish corresponding levels of hydrological drought severity.

The Hydroclimatological matrices (HCM) have shown that a matrix with single-timescale is appropriate with a small basin like the Frizi, and in contrast, for large basins like the Chalus and Joestan, a multi-timescale matrix is more appropriate. Hence, the probabilities of occurrence of events in the Frizi Basin have indicated that hydrologic response of the river basin to climatic variation occurs in a short period of time. Comparison of the probability values related to the Frizi River has illustrated that the probability of occurrence of hydrological drought will increase by about 64.5% when the meteorological state changes from the 'Wet' to the 'Severe Dry' states for the following month in this basin. Notably, the 'Severe Drought' as another meteorological state has a significant impact on the occurrence of hydrological drought during the next three months in this case study. In the Joestan Basin, when the meteorological state changes from the Wet state to the Mild Drought, the river basin will have been trapped in drought with 76% probability. This process will continue with 58% probability, until the following four months for the river basin. In the case of the Chalus Basin, if the basin is attacked by the onset of a Severe meteorological drought in a given month, the hydrological drought streamflow will be experienced with 53.4% probability of occurrence with three months delay.

The probability of detection (Hit rate) shows that the verification of forecast performance of the hydroclimatological matrix (HCM) can be adopted as satisfactory forecast. Likewise, results of the Cross-Validation approach and RMSE method exhibit the fact that the probability shifts are consistent in the matrices obtained, so that the HCM as a reference matrix has excelled in the robustness testing. Accordingly, in terms of the river basin management, the implementation of the proposed method for triggering warning towards an impending drought is its significant benefit.

Key words: Deciles Index, Hydrological Drought Index, Markov Chain, Lag Time, Transition Probability Matrix. Hydroclimatological Matrix, Prediction Matrix, Hydrological States



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PEMBANGUNAN SATU MODEL MATEMATIK UNTUK RAMALAN KEMARAU HIDRO-IKLIM

Olah

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Pengetahuan tentang keadaan hidrologi dan ramalan berlakunya keadaan tersebut untuk tujuan merancang dan penggunaan sumber air yang berkesan adalah sesuatu yang dikira penting. Dalam hal ini, fenomena kemarau memberikan beberapa kesan pemusnahan persekitaran ke atas berbagai-bagai aspek proses hidrologi. Proses meramalkan permulaan fenomena kemarau adalah sesuatu yang sangat sukar. Namun begitu, adalah menjadi satu keperluan untuk mengesan keadaan hidrologi yang paling berkemungkinan, selepas satu kemarau meteorologi tertentu terjadi. Satu lagi isu penting ialah menentukan berapa lama masa yang diambil oleh keadaan hidrologi untuk menerima kesan dari kemarau meteorologi.

Tujuan utama kajian ini ialah membina satu kaedah untuk meramal keadaan hidrologi yang berbeza menurut pelbagai keadaan meteorologi, bagi suatu jarak masa ke hadapan, dalam sesuatu lembangan. Untuk tujuan ini, satu model stokastik yang

terdiri dari pembolehubah-pembolehubah hidro-iklim berdasarkan kepada teori rantai Markov telah dibangunkan. Untuk mencapai tujuan ini, indeks kemarau meteorologi dan hidrologi telah digunapakai. Dalam hal ini, siri masa kerpasan dan aliran sungai telah digunakan untuk menentukan keadaan meteorologi dan hidrologi yang berbeza-beza. Prestasi beberapa indeks meteorologi yang terkenal telah dinilai untuk kawasan kajian yang telah dipilih, iaitu kawasan rantau separa-Mediterranean di Utara Iran. Keadaan meteorologi dan hidrologi yang pelbagai telah ditentukan menggunakan indeks kemarau yang bersesuaian. Di samping itu, tempoh kelewatan di antara keadaan meteorologi dan hidrologi yang berlainan telah dikenalpasti menggunakan siri masa kerpasan dan aliran bulanan. Kebarangkalian kejadian keadaan meteorologi yang berlainan telah diramal melalui satu matriks kebarangkalian peralihan satu-dimensi (ODTPM). Kemudian, dengan konsep yang dipinjam dari teori rantai Markov dan dengan mengambilkira masa keterlewatan lembangan, ODTPM telah dikembangkan kepada satu matriks kebarangkalian peralihan dua-dimensi (TDTPM). Prosedur ini membawa kepada matriks sebagai satu output utama kajian ini, yang dikenali sebagai Matriks Hidro-iklim, atau Hydroclimatological Matrix (HCM). Oleh itu, dengan menggunakan ODTPM dan TDTPM, kebarangkalian kejadian keadaan hidrologi yang berlainan telah diramal melalui Matriks Jangkaan. Pengesahan ramalan telah dijalankan melalui peramal nyata sebagai kaedah berkategori. Selain daripada itu, kaedah pengesahan rentas dan kaedah root mean square error (RMSE) telah digunakan untuk memeriksa konsistensi perubahan kebarangkalian dan kekuatan matriks yang dikehendaki. Secara khususnya, tiga kawasan kajian bernama Lembah Frizi, Joestan dan Chalus dengan pelbagai pembolehubah hidro-iklim telah dipilih di mana kaedah yang dicadangkan telah dilaksanakan.

Dari kajian ini, telah didapati bahawa indeks kemarau meteorologi Deciles, iaitu satu kaedah bukan-parametrik merupakan indeks yang sesuai. Kaedah lengkung tempoh masa aliran (FDC) telah dipilih untuk mengkategorikan kejadian kemarau hidrologi sebagai satu pendekatan analog dengan indeks Deciles tersebut. Berikutan ini, aras ambang dalam Q_{50} dan Q_{95} telah digunakan untuk membezakan aras-aras keseriusan kemarau hidrologi yang saling berkaitan.

Matriks Hidro-Iklim (HCM) menunjukkan bahawa satu matriks dengan satu skala-masa adalah bersesuaian dengan lembangan kecil seperti Frizi, dan sebaliknya, untuk lembangan besar seperti Chalus dan Joestan, satu matriks skala-pelbagai dikira lebih sesuai. Oleh itu, kebarangkalian berlakunya peristiwa di Lembangan Frizi telah menunjukkan bahawa respon hidrologi ke atas variasi iklim berlaku dalam jangkamasa yang pendek. Perbandingan nilai-nilai kebarangkalian berkaitan dengan Sungai Frizi telah menunjukkan bahawa kebarangkalian berlakunya kemarau akan bertambah sebanyak 64.5% apabila keadaan meteorologi berubah dari 'Basah' kepada 'Sangat Kering' pada bulan berikutnya di lembangan ini. Jelaslah bahawa 'Kemarau Teruk' sebagai satu lagi keadaan meteorologi mempunyai impak penting ke atas kejadian kemarau hidrologi semasa tiga bulan berikutnya dalam kajian kes ini. Di Lembangan Joestan, sewaktu keadaan meteorologi berubah dari keadaan Basah kepada kemarau Sederhana, lembangan sungai itu akan dilanda kemarau dengan kebarangkaliann 76%. Proses ini akan berterusan dengan kebarangkalian 58%, sehingga empat bulan berikutnya di lembangan berkenaan. Dalam kes Lembangan Chalus, sekiranya lembangan itu dilanda dengan permulaan kemarau meteorologi yang teruk dalam bulan tertentu, aliran sungai kemarau hidrologi akan berlaku, dengan kebarangkalian kejadian sebanyak 53.4% dengan tiga bulan penanguhan.

Kebarangkalian pengesanan (Kadar melanda) menunjukkan bahawa pengesanan prestasi ramalan matriks hidro-iklim (HCM) boleh diambil sebagai satu ramalan yang memuaskan. Demikian juga, keputusan daripada ujian kaedah pengesanan-rentas dan RMSE menampakkan perubahan kebarangkalian yang konsisten dalam matriks yang diperolehi, yang demikian HCM sebagai satu matriks rujukan tampil cemerlang dalam ujian keteguhan. Sewajarnya, dari sudut pengurusan lembah sungai, perlaksanaan kaedah yang dicadangkan ini dalam memberi amaran terhadap kemarau yang bakal berlaku merupakan satu faedah yang paling ketara.

Kata Kunci: Indeks Deciles, Indeks Kemarau Hidrologi, Rantaian Markov, Masa Keterlewatan, Matriks Kebarangkalian Peralihan, Matriks Hidro-Iklim, Matriks Ramalan, Keadaan Hidrologi

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LIST OF ABBREVIATIONS

AGBM:	Australian Government Bureau of Meteorology
CMI:	Crop Moisture Index
CZI:	China Z-Index
DAI:	Drought Area Index
DI:	Deciles Index
DMCSEE:	Drought Management Centre for South-eastern Europe
DSIe:	Drought Severity Index
ED:	Extreme Drought
EDI:	Effective Drought Index
ESCAP:	Economic and Social Commission for Asia and the Pacific
EW:	Extreme Wet
FDC:	Flow Duration Curve
GPCC:	Global Precipitation Climatology Centre
HCM:	Hydro-Climatological Matrix
HDI:	Hydrological Drought Index
IDS:	Incipient Dry Spell
IPCC:	Intergovernmental Panel on Climate Change
IWMI:	International Water Management Institute
LOOCV:	Leave-one-out cross-validation
MA:	Moving Average

MAN:	Much Above Normal
MCM:	Markov Chain Model
MCZI:	Modified China Z-Index
MD:	Mild Drought
MDI:	Meteorological Drought Index
MRR:	Mediterranean Regional Roundtable
MRWC:	Mazandaran Regional Water Company
N:	Normal
NAO:	North Atlantic Oscillation
NCAR:	National Centre for Atmospheric Research
NCEP:	National Centres for Environmental Prediction
ODTPM:	One-Dimensional Transition Probability Matrix
PDF:	Probability Distribution Function
PDSI:	Palmer Drought Severity Index
PHDI:	Palmer Hydrological Drought Index
PNI:	Percent of Normal Index
POD:	Probability of Detection
RAI:	Rainfall Anomaly Index
RCS:	Reference Climate Station
RDI:	Reclamation Drought Index
RMSE:	Root Mean Square Error
SD:	Severe Drought

LIST OF NOTATIONS

v_i :	Volume of deficit
t_i :	Time of occurrence
d_i :	Duration
P_{ij} :	Transition probability from the i state to the j state
E_v :	Estimation or measure of the precision of the measurement
$\bar{x}$:	Mean of data
EF_{Qi} :	Exceedeance frequency
$P_{(N, W)}$:	Transition probability from the N to the W state
$[P_{ij}]$:	Transition Probability Matrix
ΔT :	Lag time
$(T_{qi}-T_{pi}'; T_i)$	i th lag time of the Basin
D_m :	Meteorological Drought state
D_h :	Hydrological Drought state
$P_{(D_m, D_h)}$	Transition Probability from the D_m to D_h
s_{mi} :	i th meteorological state
s_{hi} :	j th hydrological state
$f s_{mi}$:	Frequency of occurrence of i th meteorological state
$f s_{hi}$:	Frequency of occurrence of j th hydrological state
H :	Hit rate
W_h :	Hydrological Wet state
D_h :	Hydrological Drought state
$D_h S.D_m$	Hydrological Drought based on Severe meteorological drought

CHAPTER 1

INTRODUCTION

1.1 General

A good understanding of the natural drought phenomenon, as well as its meteorological and hydroclimatological causes, is essential for management of the limited water resources. Drought occurs in both low- and high-rainfall areas, in most regions of the world, and often on a yearly basis. It is important to identify the trend over time and to determine whether drought is becoming a more frequent and severe event. Concern exists that the threat of global warming may increase the frequency and severity of extreme climate events such as flood and drought in the future (IPCC, 2001). Basically, drought is a phenomenon that originates from a prolonged deficiency in precipitation over a region. Accordingly, meteorological drought is usually defined on the basis of the departure of precipitation from the normal condition or the long-term average amount and duration of the dry period. Meanwhile, hydrological drought is related to the effect of precipitation deficit on surface water, streamflow or groundwater, reservoirs and lake levels. In other words, it is a sustained and regionally extensive occurrence of below average natural water availability, and can thus be characterized as a deviation from the normal conditions of variables, such as precipitation, soil moisture, groundwater and streamflow (Tallaksen & Lanen, 2004). Due to the complexity caused by atmospheric and climatological phenomena, hydrological drought is a natural hazard and therefore cannot be prevented.

Besides, the impacts of droughts on environmental, natural resources and its other aspects can be reduced through mitigation and preparedness. Constant monitoring of the hydrological system, identification of drought characteristics, forecasting of drought occurrences, and their probability of recurrence, preferably built into an early warning system, can help in the preparation. In more specific, hydrological drought prevails after meteorological events within time lag. Hence, drought monitoring and forecasting can help to improve the decision making process for water resources management, drought mitigation and to reduce the negative impacts. The magnitude of drought impacts may increase in the future as a result of an increased frequency of the occurrence of the natural event (i.e. meteorological drought), changes in the factors that affect vulnerability, or a combination of these elements (Wilhite, 2002).

It is important to note that the characteristics of droughts are expressed in terms of drought index and intensity-duration-frequency. Many methods proposed for drought monitoring using indices, such as standardized precipitation index (SPI), Palmer Hydrological Drought Index (PHDI), and have been developed (Hayes *et al.*, 1999; Heim, 2000; Cancelliere *et al.*, 2007). As for the stochastic nature of climatological phenomenon like precipitation, some of the forecasting techniques for the characterization of meteorological drought have been developed and implemented, such as Markov chain (Isaacson and Madsen, 1976; Moreira *et al.*, 2006; Cancelliere *et al.*, 2007; Paulo, 2005, 2008). Similarly, knowledge of transition probabilities from a certain drought class to other drought conditions and its prediction for time scale ahead have also presented as a useful method (Cancelliere *et al.*, 2007; Paulo 2008). Therefore, a method that relates the

hydroclimatological variables which enable hydrological drought to be analyzed based on meteorological drought, would be significant and valuable.

1.2 Statement of the Problem

In general, hydrological droughts arise after meteorological droughts. Hence, first meteorological drought occurs and its persistence over time and space leads to the occurrence of hydrological droughts. Accordingly, it takes more time for the precipitation deficiency to affect the components of the hydrological system, such as soil moisture, stream flow, reservoirs and groundwater levels. Meanwhile, the probability of occurrence of meteorological droughts and hydrological droughts varies accordingly.

Although from the viewpoint of meteorological droughts, the real extent of drought phenomenon is very useful, it does not bring attention to hydrological droughts as water managers are only involved with streamflow at the outlets of basins as points in space. In addition, because of the intricacy of the global hydrological cycle, it is virtually impossible to detect the source of droughts (Nalbantis & Tsakiris, 2009). Hence, forecasting the start of a drought event is practically a very complex issue, and for this reason, relevant investigations by researchers still have not shown any clear results. Some questions such as when a drought begins and when it finishes, how and what unfavourable effects it may cause and many other questions, have obviously not been answered or correctly addressed (Cordery & McCall, 2000; El Hassani, 2002). Meanwhile, identifying when a drought starts varies from place to place, and may also be based on different criteria. According to the above mentioned

issues, there has been no index or a single pointer that can pinpoint the onset or severity and frequency of the occurrence of the drought event (ESCAP, 2010). So far, most studies have focused on meteorological droughts in the world. Researchers and hydrologists give more attention to the issue of how meteorological drought or shortage of precipitation will affect the hydrological system. In this respect, some important issues regarding the hydrological drought need to be investigated. The first one is determining how long it will take for the hydrological conditions to be affected by the meteorological drought. The second one is finding the probability of the occurrence of hydrological conditions with respect to lag time. Furthermore, it is crucial to determine the most probable hydrological condition, after a certain condition of meteorological drought has occurred.

1.3 Objectives of the Study

The main aim of this research is to attain a method to be used in predicting the probability of the occurrence of various hydrological conditions according to various meteorological conditions by employing appropriate drought indices. Accordingly, the objectives in this thesis work can be summarised in five key objectives elaborated by several specific tasks, as follows:

- i. To determine the appropriate meteorological drought index (MDI);
- ii. To estimate the different meteorological drought conditions using the properly selected index;
- iii. To identify the proper hydrological drought index (HDI);
- iv. To determine the lag time between meteorological and hydrological states and;
- v. To forecast the probability of the occurrence of different hydrological states

based on various meteorological states according to their time lag.

1.4 Significance of the Study

The results of this study are significant in predicting the probability of occurrence for the different hydrological status based on the meteorological conditions for longer time step. In other words, the time lag of the hydrological drought occurrence after an onset of a meteorological drought has been analyzed. Hence, the implementation of this particular method is an important step and a good opportunity for risk reduction and management of water resources. A lot of resources and methods for analyzing meteorological drought have been discussed and proposed (Gibbs & Maher, 1967; Mckee *et al.*, 1993; Hayes *et al.*, 1999; Lloyd and Saunders, 2002; Tsakiris & Vangelis, 2005; Paulo *et al.*, 2007). On the contrary, hydrological drought indices such as Palmer Hydrological Drought Index (PHDI), or Surface Water Supply Index (SWSI) are, overall, data requiring and computationally intensive (Nalbantis & Tsakiris, 2009). It is important to highlight that forecasting hydrological droughts that follow meteorological droughts with a lag time can improve the decision making process for water resources management, drought mitigation and so on. Due to its complexity, however, there are only a few investigations carried out on this issue, and the focus has always been on the meteorological droughts. Recently, several studies were done to obtain a simple and effective hydrological drought index (see for example, Nalbantis, 2008; Nalbantis & Tsakiris, 2009). Similarly, reviews and studies on this issue are also in progress. Therefore, finding a method that focuses on hydrological droughts, based on hydroclimatological variables, is apparently valuable. Meanwhile, the lack of

streamflow data or its insufficiency is of major concern for hydrological condition simulation via time series analysis. In those cases where data are adequate, the governing of its probability distribution function (PDF) is an important constraint that makes the technique inefficient. Hence, when the precipitation time series is available, applying the result of such study will be very useful. Apparently, a generalized model for the areas of hydroclimatological homogeneity would be an efficient approach.

1.5 Scope of the Study

The scope of this study covers the development of a model to predict the transition probability of different meteorological states to different hydrological states. For this purpose, the methodology was employed in three regions located in the north, north-west and north-east of Iran with different aspects of size, climate and length of records. The first region is the Joestan watershed, with a semi-wet climate, an annual precipitation of 547 mm, and a drainage area of 412 km² located in the north-west of Tehran, the capital of Iran. The second region is the Chalus watershed, with a semi-arid temperate climate, an annual precipitation of 318 mm, and drainage area of 1600 km² located in the north of Iran near the Caspian Sea. Meanwhile, the third region is the Frizi watershed, with a semi-arid cold climate, an annual precipitation of 372 mm, and a drainage area of 273 km². The following describes the detailed scope of this study:

- i. Collecting the daily precipitation and discharge time series data at the related stations and extracting of monthly and yearly data.
- ii. Determining the meteorological drought classes using various indices.

- iii. Selecting the appropriate meteorological drought index.
- iv. Determining the transition-probability matrix (TPM) in different meteorological status by employing the stochastic method (Markov Chain Model: MCM).
- v. Determining different classes of hydrological drought using a proper index.
- vi. Developing the model of one-dimensional transition-probability matrix (ODTPM) by converting it into two-dimensional (TDTPM)
- vii. Employing the model developed for forecasting the probability of occurrence of each hydrological state based on different meteorological states using precipitation and streamflow time series.

1.6 Limitation of the Study

A significant or negligible probability value depends on the sufficient frequency and distribution of events in each class. In this study, two sub-category of drought were considered in the extraction of a two-dimensional matrix. Clearly, more separation of classes for the meteorological/hydrological drought period based on the proposed methodology, a very long-term coincident time series of precipitation and streamflow are demanded. Hence, this theme can be seen as a limitation in the case of this current study.

REFERENCES

- Alatise, M. and Ikumawoyi, O. (2007). Evaluation of Drought From Rainfall Data for Lokoja: A Confluence of Two Major Rivers. *Electronic Journal of Polish Agricultural Universities (EJPau)*, Vol 10 (1), <http://www.ejpau.media.pl/volume10/issue1/art-05.html>.
- Araghinejad, S. (2011). An Approach for Probabilistic Hydrological Drought Forecasting. *Water Resour Manage* (2011) 25:191–200.
- Australian Government Bureau of Meteorology (AGBM). (2005). Verifying Climate Forecasts, Vanuatu, Solomon Islands., Fiji, T., Samoa, Niue, Cook Islands, Tuvalu, Kiribati, Stakeholder Workshop Enhanced Application of Climate Predictions in Pacific Island Countries, Pacific Islands Climate Prediction Project. www.bom.gov.au/climate/pi-cpp/training/nms
- Bhalme, H.N. and Mooley, D.A. (1980). Large-scale droughts/floods and monsoon circulation. *Mon. Wea. Rev.* 108: 1197–1211.
- Bergaoui, M. (2003). Local and regional droughts in Siliana' catchment, Tunisia. In G. Rossi, Cancelliere, A. Pereira, L.S. Oweis, T. Shatanawi, M. Zairi, A. (Eds.) *Tools for Drought Mitigation in Mediterranean Regions* (pp. 79-88). Kluwer Academic Publishers.
- Bhuiyan, C., Singh, R.P. and Kogan, F.N. (2006). Monitoring drought dynamics in the Aravalli region (India) using different indices based on ground and remote sensing data. *International Journal of Applied Earth Observation and Geoinformation* 8 (2006) 289–302.
- Bokal, S. (2009). Standardized Precipitation Index tool for drought monitoring (examples from Slovenia). Drought Management Centre for Southeastern Europe (DMCSEE). <http://www.wamis.org/agm/meetings/slovenia10/S3-Bokal-SPI.pdf>
- Borg, D.S. (2009). An Application of Drought Indices in Malta, Case Study. *European Water* 25/26: 25-38, 2009 *E.W.Publications*.
- Bradford, R.B. (2000). Drought events in Europe. in J.V. Vogt, and Somma F. (eds) *Drought and drought mitigation in Europe*. Advances in natural and technological hazards research, Vol. 14. Kluwer Academic Publishers., The Netherlands, pp 7–20.
- Cancelliere, A. and Rossi, G. (2003). Droughts in Sicily and comparison of identified droughts in Mediterranean Regions. In G. Rossi, Cancelliere, A. Pereira, L.S.,

Oweis, T. Shatanawi, M. Zairi, A. (Eds.) *Tools for Drought Mitigation in Mediterranean Regions* (pp. 103-122). Kluwer Academic Publishers.

Cancelliere, A., Di Mauro, G., Bonaccorso, B. and Rossi, G. (2007). Drought forecasting using the Standardized Precipitation Index. *Journal of Water Resour Manage* 21:801–819.

Cancelliere, A., Di Mauro, G., Bonaccorso, B. and Rossi, G. (2007), Stochastic Forecasting of Drought Indices, G. Rossi et al. (Eds.) *Methods and Tools for Drought Analysis and Management* (pp. 83–100). University of Catania, Italy.

Ceglar, A. Z., Crepinsek, L. and Kajfez, B. (2008). Analysis of meteorological drought in Slovenia with two drought indices. Paper presented at the conference of the Water Observation and Information Systems. BALWOIS 2008 – Ohrid, Republic of Macedonia – 27, 31 May 2008.

Clausen, B. and Pearson, C.P. (1995). Regional frequency analysis of annual maximum streamflow drought. *Journal of Hydrol* 173:111–130.

Cinlar, E. (1975). Introduction to Stochastic Processes. Prentice-Hall, Englewood Cliffs, New Jersey.

Cordery, I. and McCall, M. (2000). A model for forecasting drought from teleconnections. *Journal of Water Resour Res* 36:763–768.

Dakova, S. (2004). Low Flow and Drought Spatial Analysis. National Institute of Hydrology & Meteorology, BASc, 66 Tzarigradsko Shosse, 1784 Sofia, Bulgaria. Balwois Conference, Ohrid, 25-29 May 2004.

Demuth, S. and Stahl, K. (2001). ARIDE–Assessment of the Regional Impacts of Drought in Europe. Final Report, EU contract, ENV4-CT-97-0553, Institute of Hydrology, University of Freiburg, Freiburg, Germany

Dracup, J.A., Lee, K.S., and Paulson, E.G. Jr. (1980). On the statistical characteristics of drought events. *Water Resour Res* 16(2):289–296

Dupuis, D.J. (2010). Statistical Modeling of the Monthly Palmer Drought Severity Index. *Journal of Hydrologic Engineering*, ASCE / October 2010.

- Economic and Social Commission for Asia and the Pacific (ESCAP). (2010). Practices in Drought Disaster Monitoring and Early Warning. http://www.unescap.org/idd/working%20papers/IDD_TP_10_2_of_WP5_2_902
- Edossa, D.C., Mukand, S. B. and Ashim, D.G. (2009). Drought Analysis in the Awash River Basin, Ethiopia. *Journal of Water Resour Manage*.
- Edwards, D.C. and McKee, T.B. (1997). Characteristics of 20th Century Drought in the United States at Multiple Time Scales. *Atmospheric Science Paper No. 634*; 1–30.
- El Hassani, T.A. (2002). Drought preparedness and risk management in the Mediterranean Region. *Mediterranean Regional Roundtable (MRR)*. Athens, Greece, http://www.uicnmed.org/web2007/CDCambio_climatico/contenido/F/PDF/CC_f1.pdf
- Fleig, A.K., Tallaksen, L.M., Hisdal, H. and Demuth, S. (2005). A global evaluation of streamflow drought characteristics. *Hydrology and Earth System Sciences*. vol. 10, 2006, pp.535–552.
- Gibbs, W.J. and Maher, J.V. (1967). Rainfall deciles as drought indicators. *Bureau of Meteorology Bulletin No. 48*, Commonwealth of Australia, Melbourne.
- Gottschalk, L. (2004). Time series modelling. In L.M. Tallaksen, Lanen, H.A.J. van. (Eds). *Hydrological Drought Processes and Estimation Methods for Streamflow and Groundwater* (pp.19-51). Elsevier.
- Ju, X.S., Yang, X.W., Chen, L.J. and Wang, Y.M. (1997). Research on determination of indices and division of regional flood/drought grades in China (in Chinese). *Quarterly Journal of Applied Meteorology* 8(1): 26–33.
- Hayes, M., Wilhite, D.A., Svoboda, M. and Vanyarkho, O. (1999). Monitoring the 1996 drought using the standardized precipitation index. *Bull Am Meteorol Soc* 80:429–438.
- Hayes, M.J. (1999). Drought indices. National Drought Mitigation Center (NDMC). <http://enso.unl.edu/ndmc>
- Hayes, M. J. (2006). Drought Indices. National Drought Mitigation Center (NDMC). [http:// WWW.drought.unl.edu/](http://WWW.drought.unl.edu/)

Heim, R.R. (2000). Drought indices: a review. In Wilhite, D.A. (Ed) *Drought: a global assessment*. Routledge, London and New York.

Henny A.J. van Lanen, Kundzewicz, Z. W., Tallaksen, L.M., Hisdal, H., Fendekova, M. and Prudhomme, C. (2008). Indices for Different Types of Droughts and Floods at Different Scales. Technical Report No. 11. www.eu-watch.org/nl/

Hester, J. (2006). Physics Tutorial: Standard Deviation. Clemson University. <http://phoenix.phys.clemson.edu/tutorials/stddev/index.htm>

Hisdal, H. and Tallaksen, L.M. (2003). Estimation of regional meteorological and hydrological drought characteristics: a case study for Denmark. *J Hydrol* 281:230–247.

Hisdal, H., Tallaksen, L.M., Clausen, B., Peters, E. And Gustard, A. (2004). Hydrological drought characteristics. In: Tallaksen L.M and Van Lanen H.A.J. (Eds) *Hydrological drought-processes and estimation methods for streamflow and groundwater*. Development in Water science, Elsevier, Amsterdam, The Netherlands, 139–182.

Hosseini, M. (2011). Effect of Land use Change on Water Balance and Suspended Sediment Yield of Taleghan Catchment, Iran. Universiti Putra Malaysia (UPM).

Karamouz, M., Rasouli, K. and Nazif, S. (2009). Development of a Hybrid Index for Drought Prediction: Case Study. *Journal of Hydrologic Engineering, ASCE* / June 2009.

Keyantash, J. and Dracup, J.A. (2002). The quantification of drought: an evaluation of drought indices. *Bull Amer Meteor Soc* 83:1167–1180.

Khalili, A. (1998). Synthesis of Country Water Master Plan, Energy Ministry of Iran.

Khalili, A., Hojjam, S. and Bazrafshan, J. (2003). The comparison and categorizing of seven drought indices from succession of drought, normal and wet years point of view in some climatic zones of Iran. In: *Proceedings of the Sixth Inter-Regional Conference on Environment-Water “Land and Water Use Planning and management, Albacete, Spain, September 3–5, 2003*, pp. 1–12.

Khalili, D., Farnoud, T., Jamshidi, H., Kamgar-Haghighi, A. and Zand-Parsa, S., (2011). Comparability Analyses of the SPI and RDI Meteorological Drought Indices in Different Climatic Zones *Water Resour Manage* (2011) 25:1737–1757, DOI 10.1007/s11269-010-9772-z.

- Khorasan Agricultural and Natural Resources Research Center (KANRRC). (2010). Physiography Report for the Frizi Basin. Jahad-e Keshavarzi Ministry of Iran.
- Kirono , D.G.C., Kent , D.M., Hennessy , K.J. and Mpelasoka, F. (2011). Characteristics of Australian droughts under enhanced greenhouse conditions: Results from 14 global climate models. *Journal of Arid Environments* 75 (2011) 566-575.
- Kjeldsen, T.R., Lundorf, A. and Dan, R. (2000). Use of two component exponential distribution in partial duration modelling of hydrological droughts in Zimbabwean rivers. *Hydrol Sci J* 45(2):285–298.
- Kwon, H. J. and Kim, S. J. (2010). Assessment of Distributed Hydrological Drought Based on Hydrological Unit Map Using SWSI Drought Index in South Korea. *KSCE Journal of Civil Engineering*. 14(6):923-929.
- Lana, X., Serra, C. and Burgueno, A. (2002). Patterns of monthly rainfall shortage and excess in terms of the standardized precipitation index for Catalonia (NE Spain). *Int. J. Climate* 21(13):1669–1691.
- Lohani. V.K. and Loganathan, G.V. (1997). An early warning system for drought management using the Palmer drought index. *Journal Am Water Resour Assoc* 33(6):1375-1386
- Lohani V.K., Loganathan, G.V. and Mostaghimi, S. (1998). Long-term analysis and short-term forecasting of dry spells by the Palmer drought severity index. *Nord Hydrol* 29(1):21-40.
- Loukas, A., Vasiliades, L. and Dalezios, N.R. (2003). Intercomparison of meteorological drought indices for drought assessment and monitoring in Greece. In: *Proceedings of the 8th International Conference on Environmental Science and Technology, Lemnos Island, Greece, 8 – 10 September 2003*, full paper Vol. B, pp. 484 - 491.
- Mathieu, R. and Richard, Y. (2003). Intensity and spatial extension of drought in South Africa at different time scales. *Water SA* 29(4):489–500.
- Malekifard, F. and Rezazadeh, P. (2005). North Atlantic Oscillation (NAO) and Its Effects on Temperature and Precipitation Over North-West of Iran. *Meteorology Organization, Tehran, Iran.*
www.balwois.com/balwois/administration/full_paper/ffp-465.pdf

- Mazandaran Regional Water Company (MRWC). (2009). *Comprehensive project of West of Mazandaran river engineering project, Hydrology report*; Co-consulting Engineers Khazarab- Ab Energy Mohit, Power Ministry of Iran.
- McKee, T.B., Doesken, N.J. and Kleist, J. (1993). The relationship of drought frequency and duration to time scales. Proceedings of 8th conference on applied climatology, pp 179–184, 17–22 January, Anaheim, CA American Meteorological Society.
- McKee, T.B., Doesken, N.J. and Kleist, J. (1995). Drought monitoring with multiple time scales. Presented at the Ninth Conference on Applied Climatology. American Meteorological Society: Dallas, TX; 233–236.
- Mendicino, G., Senatore, A. and Versace, P. (2008). A Groundwater Resource Index (GRI) for drought monitoring and forecasting in a Mediterranean climate. *Journal of Hydrology* (2008) 357, 282– 302.
- Meigh, J., Tate, E. and McCartney, M. (2002). Methods for identifying and monitoring river flow drought in southern Africa. In: FRIEND 2002 - Regional Hydrology: Bridging the Gap between Research and Practice (Ed. by H.A.J. van Lanen & S. Demuth) IAHS Publ. no. 274, 181-188.
- Mishra, A.K. and Desai, V.R. (2005b). Drought forecasting using stochastic models. *Stochast Environ Res Risk Assess* 19:326–339.
- Mishra, A.K., Desai, V. R. and Singh, V. P. (2007). Drought Forecasting Using a Hybrid Stochastic and Neural Network Model. *Journal of Hydrologic Engineering*, ASCE / November/ December 2007, DOI: 10.1061/(ASCE)1084-0699(2007)12:6(626).
- Mishra, A.K., Singh, V. P. and Desai, V. R. (2009). Drought characterization: a probabilistic approach. *Stoch Environ Res Risk Assess* (2009) 23:41–55.
- Moreira, E.E., Paulo, A.A., Pereira, L.S. and Mexia, J.T. (2006). Analysis of SPI drought class transitions using loglinear models. *J. Hydrol* 331:349–359.
- Moreira, E.E., Coelho, C.A., Paulo, A.A., Pereira L.S., and Mexia, J.T. (2008). SPI-based drought category prediction using loglinear models. *Journal of Hydrology* (2008) 354, 116– 130.
- Morid, S., Smakhtin, V.U. and Moghaddasi, M. (2005). Comparison of Seven Meteorological Indices for Drought Monitoring in Iran, *Int. J. Climate*. Published

online in Wiley InterScience. drought: Payments and policy. Drought Network News 5(3):11–12. www.interscience.wiley.com.

Nalbantis I. and Tsakiris, G. (2009). Assessment of Hydrological Drought Revisited. *Water Resour Manage* (2009) 23:881–897. DOI 10.1007/s11269-008-9305-1.

Nalbantis I. (2008). Evaluation a Hydrological Drought Index. *European Water* 23/24 : 67-77, 2008. E.W. Publications.

Naresh Kumar, M., Murthy, C.S., Sesha, Sa. MVR. and Roy, PS. (2009). On the use of standardized precipitation index (SPI) for drought intensity assessment. *Meteorol Appl* 16: 381–389, DOI 10.1002/met.136.

National Drought Mitigation Center (NDMC). (2004). Understanding and defining drought: <http://enso.unl.edu/ndmc> ; <http://drought.unl.edu>.

Ochola, W.O. and Kerkides, P. (2003). A Markov chain simulation model for predicting critical wet and dry spells in Kenia: Analysing rainfall events in the Kano plains. *Irrig Drain* 52(4):327–342.

Oladipo, E.O. (1985). A comparative performance analysis of three meteorological drought indices. *J. Climatol* 5: 655–664.

Pandey, R.P., Mishra, S.K., Singh, R. and Ramasastri, K. S. (2008). Streamflow drought severity analysis of Betwa river system (India). *Water Resour Manage* 22:1127–1141.

Paulo, A.A., Ferreira, E., Coelho, C. and Pereira, L.S. (2005). Drought class transition analysis through Markov and Loglinear models, an approach to early warning. *Agric Water Manag* 77:59–81.

Paulo. A.A. and Pereira, L.S. (2007). Prediction of SPI Drought Class Transitions Using Markov Chains. *Water Resour Manage* (2007) 21:1813–1827. DOI 10.1007/s11269-006-9129-9.

Paulo, A.A. and Pereira, L.S. (2008). Stochastic Prediction of Drought Class Transitions. *Water Resour Manage* (2008) 22:1277–1296. DOI 10.1007/s11269-007-9225-5.

Paltineanu, C.r., Mihailescu, I. F., Prefac, Z., Dragota, C., Vasenciuc, F. and Claudia, N. (2009). Combining the standardized precipitation index and climatic

water deficit in characterizing droughts: a case study in Romania. *Theor Appl Climatol* (2009) 97:219–233.

Pereira, L.S. and Paulo, A.A. (2005). Droughts: Concepts, Indices and Prediction. <http://ressources.ciheam.org/om/pdf/b47/05002267> [accessed 25 May 2010].

Petts, G.E., Bickerton, M.A., Crawford, C., Lerner, D.N. and Evans, D. (1997). Flow management to sustain groundwater-dominated stream ecosystems. *Hydrological Processes*, 13: 497–513.

Pyrcie, R. (2004). Hydrological low flow indices and their Uses. Watershed Science Centre. *WSC Report No. 04-2004*.

Raziei, T., Saghafian, B. and Shokoohi, A.R. (2003). Drought monitoring using SPI index in Yazd province, Iran. In: 6th Inter-Regional Conference on Environment-Water: Land and Water Use Planning and Management, September 3–5, 2003, Albacete, Spain.

Raziei, T., Bordi, I. and Pereira, L.S. (2008). A precipitation-based regionalization for Western Iran and regional drought variability. *Hydrol Earth Syst Sci* 12:1309–1321.

Raziei, T., Saghafian, B., Paulo, A.A., Pereira, L.S. and Bordi, I. (2009). Spatial and temporal variability of drought in western Iran. *Water Resour Manag* 23:439–455.

Raziei, T., Bordi, I., Pereira, L.S. and Sutera, A. (2010). Space-time variability of hydrological drought and wetness in Iran using NCEP/NCAR and GPCC Datasets. *Hydrol Earth Syst Sci* 14: 1919–1930.

Raziei, T., Bordi, I., Pereira, L.S. and Sutera, A. (2011). An application of GPCC and NCEP/NCAR datasets for drought variability analysis in Iran. *Water Resour Manage* 25:1075–1086.

Rees, G., Marsh, T.J. Roald, L., Demuth, S. and Lanen, H.A.J. (2004). Hydrological data. In: Tallaksen LM and Van Lanen HAJ (Eds) *Hydrological drought-processes and estimation methods for streamflow and groundwater. Development in Water science*, Elsevier, Amsterdam, The Netherlands, 139–182.

- Ries, K.G. and Friesz, P.J. (2000). Methods for estimating low-flow statistics for Massachusetts streams. U.S. Geological Survey Water-Resources Investigations Report 00-4135.
- Rivera-Ramirez, H.D., Warner, G.S. and Scatena, F.N. (2002). Prediction of master recession curves and baseflow recessions in the Luquillo mountains of Puerto Rico. *Journal of the American Water Resources Association*, 38: 693-704.
- Rossi, G., Benedini, M., Tsakiris, G. and Giakoumis, S. (1992). On regional drought estimation and analysis. *Water Resour. Manag.*, 6, 249-277.
- Saghafian, B., Shokoohi, A.R. and Raziei, T. (2003). Drought spatial analysis and development of severity-duration-frequency curves for an arid region. *Hydrology of the Mediterranean and Semiarid Regions (Proceedings of an international symposium held at Montpellier, April 2003)*. IAHS Publ. no. 278.2003.
- Satya, N. M. C. (2002). *Water resources engineering principles and practice*, Revised second edition, New Age International Ltd. publishers, 306 Pages, ISBN 81-224-1382-X.
- Santos, M.A., Correia, F. N. and Rodrigues, R. (1988). Risk assessment of regional droughts. In F. Siccaldi and R. L. Bras (Eds.) *Natural Disasters in European Mediterranean Countries* (pp. 333-350). U. S. Nat. Sci. Foundation and Nat. Res. Council, Italy.
- Seiler, R., Hayes, M. and Bressan, L. (2002). Using the standardized precipitation index for flood risk monitoring. *Int J Climate* 22:1365–1376.
- Shafer, B.A. and 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 Conference, USA, 1982*. Colorado State University, Fort Collins, Colorado. pp. 164–175.
- Shokoohi, A.R., Saghafian, B., Raziei, T. and Arasteh, P. (2002). SDF curves derivation and application of time series in modeling drought occurrence and forecasting drought duration. In: *8th International conference on understanding future dry land environmental changes from past dynamics*, Yazd, Iran.
- Sivakumar, M.V.K. (2001). Presentation of Drought Information in Agrometeorological Bulletins: 237-248.
www.wamis.org/agm/pubs/agm5/agm5_Sivakumar_Drought_Info_Agromet_Bulletins.pdf

- Smakhtin, V.U. (2001). Low flow hydrology: A review, *J Hydrol* 240: 147–186.
- Smakhtin, V.U. and Hughes, D. A. (2004). Review, Automated Estimation and Analyses of Drought Indices in South Asia. Working Paper 83. Colombo, Sri Lanka: International Water Management Institute (IWMI).
- Smith, D.I., Hutchinson, M.F. and McArthur, R.J. (1993). Australian climatic and agricultural drought: Payments and policy. *Drought Network News* 5(3):11–12.
- Stahl, K. and Histal, H. (2004). Hydroclimatology. In L.M. Tallaksen, Lanen, H.A.J. van. (Eds). *Hydrological Drought Processes and Estimation Methods for Streamflow and Grounwater* (pp.19-51). Elsevier.
- Stefan, W. (2004). Finite Mathematics and Finite Mathematics & Applied Calculus, Topic: Markov Systems,
<http://www.zweigmedia.com/ThirdEdSite/Summary8.html>
- Tallaksen, L.M., and Lanen, H.A.J. (2004). Netherlands: Hydrological Drought Processes and Estimation Methods for Streamflow and Grounwater. Elsevier.
- Tate, E.L. and Gustard, A. (2000). Drought definition: a hydrological perspective. In J.V. Vogt and Somma, F. (eds). *Drought and drought mitigation in Europe, advances in natural and technological hazards research*, Vol. 14. Kluwer, Dordrecht, The Netherlands, pp 23–48.
- Tharme, R.E. (2003). A global prespective on environmental flow assessment: emerging trends in the development and application of environmental flow methodologies for rivers. *River Research and Applications*, 19: 397–441.
- Thompson, S. A. (1990). A Markov and runs analysis of drought in the central united states, *Physical Geography*, 11 (3), 191-205.
- Tsakiris, G. and Vangelis, H. (2004). Towards a drought watch system based on spatial SPI. *Water Resour Manag* 18:1–12.
- Tsakiris, G. and Vangelis, H. (2005). Establishing a drought index incorporating evapotranspiration. *European Water* 9/10:3–11.
- Tsakiris, G., Pangalou, D. and Vangelis, H. (2007). Regional drought assessment based on the Reconnaissance Drought Index (RDI). *Water Resour Manag* 21:821–833.

- Turkes, M. and Tatli, H. (2009). Use of the standardized precipitation index (SPI) and a modified SPI for shaping the drought probabilities over Turkey. *International Journal of limatology*, 29: 2270–2282 .Published online 9 February 2009 in Wiley InterScience.
- Lloyd-Hughes, B. and Saunders, M.A. (2002). A drought climatology for Europe. *Int. J. Climatol* 22:1571–1592.
- Intergovernmental Panel on Climate Change (IPCC). (2001). *Climate Change 2001: The Scientific Basis. Contributions of Working Group I to the Third Assessment Report of the Intergovernmental Panel on Climate Change*. In Houghton, J.T., Ding, Y., Griggs, D.J., Noguer, M., van de Linden, P.J., Dai, X., Maskell, K. and Johnson, C.A. (Eds). UK and New York: Cambridge University Press.
- Isaacson, D.L. and Madsen, R. (1976). *Markov chains: theory and applications*. John Wiley; New York, p 267. Karl, T., Quinlan, F. and Ezell, D.S. (1987). Drought termination and amelioration: its climatological probability. *J. Clim Appl Meteorol* 26:1198–1209.
- Vasiliades, L. and Loukas, A. (2006). Hydrological drought evaluation with the use of meteorological drought indices. *Geophysical Research Abstracts*, Vol. 8, 04468, 2006. SRef-ID: 1607-7962/gra/EGU06-A-04468. European Geosciences Union 2006.
- Velayati, S., Ghayour, H. and Shafia, S. (2004). Investigation of Frizi River hydrologic regime and its role of recharge in the Mashhad plain. *Journal of Geography and Development*.35 (3):47-72.
- Vicente-Serrano, S.M. and Lopez-Moreno, J.I. (2005). Hydrological response to different time scale of climatological drought: an evaluation of the Standardized Precipitation Index in a mountainous Mediterranean basin. *Hydrology and Earth System Sciences* 9: 523–533, SRef-ID 1607-7938/hess/2005-9-523.
- Vicente-Serrano, S.M. (2006). Spatial and temporal analysis of droughts in the Iberian Peninsula (1910-2000). *Hydrological Sciences Journal* 51: 1, 83-97, DOI 10.1623/hysj.51.1.83.
- Western Regional Climate Centre (WRCC). (2000). Standardized Precipitation Index. <http://www.wrcc.dri.edu/spi.html> [accessed in 2011].

Wilhite, D.A. and Glantz, M.H. (1985). Understanding the drought phenomenon: the role of definitions. *Water International*. 10(3):111–120.

Wilhite, D.A. (2002). Moving toward drought risk management: the need for a global strategy. <http://www.nahrim.gov.my/pdf/drought%20management.pdf>.

Willeke, G., Hosking, J. R. M. Wallis, J. R., and Guttman, NB. (1994). The National Drought Atlas. Institute for Water Resources Report 94- NDS-4, U.S. Army Corps of Engineers.

Wu, H., Hayes, M.J., Weiss, A. and Hu, Q. (2001). An evaluation of the standardized precipitation index, the China-Z Index and the statistical Z-Score. *Int. J. Climate* 21(6):745–758.

Wu, H. Leen-Kiat, S., Samal, A. and Chen, X.H. (2007). Trend analysis of streamflow drought events in Nebraska. *Water Resources Management*, Published online, Jan 19, 2007 .

Xiaofan, L., Liliang, R., Fei, Y. and Bang, Y. (2009). Meteorological Droughts Forecasting Using Markov Chain Model, vol,2, pp.23-26,2009, International Conference on Environmental Science and Information Application.2009.