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INTERNATIONAL JOURNAL OF CLIMATOLOGY Int. J. Climatol. 27: 327-339 (2007) Published online 25 October 2006 in Wiley InterScience (www.interscience.wiley.com) DOI: 10.1002/joc.1403



## **Review**

# A study of precipitation variability in the Duero Basin (Iberian Peninsula)

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#### Abstract:

Spatial and temporal average behaviour of winter precipitation in the Duero basin (DB) were analysed for 1958-1993. Monthly observed data (observed data) from 34 weather stations and a subset of daily precipitation data from the NCEP/NCAR reanalysis project (reanalysis data) were used.

The spatial variability of winter precipitation was examined using principal component analysis (PCA) for both types of data. The winter precipitation fields are well represented by the first three principal components (PC), which describe 81% and 87% of the total variance for the observed and reanalysis data, respectively. The relationship between the three leading PCs and circulation patterns was also investigated. The PC1 is related to the North Atlantic Pattern (NAO), East Atlantic Pattern (EA) and Pacific North American Pattern (PNA). The PC2 is related to the East Atlantic/West Russia Pattern (EAWR), while the PC3 depends mainly on Scandinavia Pattern (SCAND) influences.

The reanalysis data were used to calculate a 10-day period to study the intra-annual variation (S-mode of PCA) and the spatial distribution of those precipitation amounts during the year (T-mode of PCA). For the intra-annual variation of precipitation, two modes statistically significant were obtained. The first mode was characterized by a broad maximum that extended from mid October to early April, and a minimum that extended from early May to September. The second mode exhibited two maxima and a minimum. The first maximum occurred in late February and the second maximum extended from early April to June. The minimum extended from mid July to early February. For the spatial distribution of precipitation, we obtained three patterns. The 'winter' pattern, which showed a maximum over the western area, the 'spring' pattern with a maximum over the eastern area, and the 'autumn' with a maximum over the easternmost edge of the basin. Copyright © 2006 Royal Meteorological Society

KEY WORDS precipitation variability; principal component analysis; 10-day period

Received 4 February 2005; Accepted 11 July 2006

#### 1. INTRODUCTION

In the past few years, investigators have been concerned with climate variability. Knowledge of the nature and causes of precipitation variability is desirable due to its impact on human activities and natural resources. In recent years, several studies of the precipitation variability and its relationships to anomalies in the macroscale circulation have been undertaken as is evident from the articles available in the literature (e.g. Cahalan, 1983; Fraedrich and Muller, 1992; Drosdowsky, 1993; Hogg, 1995; Hurrel and van Loon, 1995; Kutiel et al., 1996; Matayo et al., 2000; Zhou and Lau, 2001). Hurrel and van Loon (1995) analysed the effect of teleconnection indices on Northern Hemisphere temperature and precipitation. Marshall et al. (2001) attributed climatic variability in the North Atlantic sector to three interconnected phenomena: the North Atlantic Ocean Pattern (NAO), the

AO and the Atlantic meridional overturning circulation. Regarding the Iberian Peninsula, Rodríguez-Puebla et al. (1998 and 1999) investigated the spatial and temporal variability of annual precipitation. They also analysed the relationship between the annual precipitation and the following circulation patterns: East Atlantic Pattern (EA), NAO, SOI and Scandinavia pattern (SCAND). Zorita et al. (1992 and 1995) demonstrated the effect of NAO and atmospheric conditions on the Iberian rainfall during the winter season. On the other hand, Rodó et al. (1997) demonstrated that most of the Iberian Peninsula is under the influence of the NAO in winter. Rodríguez-Puebla et al. (2001) also investigated the winter precipitation over the Iberian Peninsula and its relationship to circulation indices. Nieto et al. (2004) studied the variability patterns obtained with observed winter precipitation data, data from NCEP-NCAR reanalysis project and data from two global climatic models, on the Iberian Peninsula. In addition, Goodess and Jones (2002) obtained the association between circulation frequencies and Iberian rainfall.



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There has recently been a growing interest in the study of precipitation variability on a much smaller scale. For example, in Southern Spain, Rodrigo et al. (2000) examined the relationship between the NAO and rainfall variability on decadal to centennial scales. Saénz et al. (2001) analysed the inter-annual variability of winter precipitation in the Northern Iberian Peninsula, and Lana et al. (2004) studied the spatial and temporal variability of the daily rainfall regime in Catalonia. Most of all the aforementioned studies deal with the characteristics of precipitation variability and define rainfall regimes on the basis of the seasonal or annual values. However, a more detailed analysis by making use of a variable that differs from annual and seasonal amount contributes, with different points of view, to our knowledge of the precipitation regime in the Duero basin (DB). Ten-day data values (10-DDV) of precipitation were computed from daily amounts and the analyses of spatial organization of precipitation fields were performed. The climatic seasons can be defined on the basis of similar space variability and their distribution during the year using principal component analysis (PCA). In view of this, the present study sets out to present a definition of the homogeneous season based on PCA of 10-DDV, similar to the work of Bartzokas et al. (2003).

It is well known that the Iberian precipitation regime is characterized by high variability in both space and time domains (Esteban-Parra et al., 1998). The DB is the largest basin in the Iberian Peninsula and it records the greatest amount of precipitation in the Iberian Peninsula. Therefore the impact of precipitation variability is related to social and economic activities such as water resources management in particular, hydroelectric production, agricultural production (wine production as Porto wine), land use and tourism. Furthermore the study of the precipitation variability on a regional scale plays a significant role. Of great interest is the identification of spatial distributions and patterns, such as those associated with intense precipitation in view of the future application of a limited area model to the DB. The other aim of this work consists in studying the spatial variability of winter precipitation in the DB and should be the starting point for determining how this regime is influenced by the main orographic features and by the atmospheric circulation patterns. For that purpose, PCA (S-mode) and correlation relationship were performed with winter precipitation data (observed and reanalysis data) to investigate the relationship between the winter precipitation and circulations' patterns (NAO, EA, PNA, East Atlantic/West Russia Pattern (EAWR), and SCAND).

This paper is organized as follows: after this introduction, a summary description of the study area is presented in Section 2. Section 2 also reports on the data sets and the methods. In Section 3, the characteristics of the spatial variability of the winter and precipitation amount are examined. The conclusions are presented in Section 4. The methods used in this study are referred to without explanation because they are well known and have often been described.

#### 2. DATA

#### 2.1. Study area

The DB is located in the Iberian Peninsula and is enclosed by latitudes  $40.3^{\circ}-43.2^{\circ}N$  and longitudes  $1.7^{\circ}-8.7^{\circ}W$  (Figure 1). This area is located in the wet temperate zone of southern Europe. The most important aspects of climate in the DB are its localization, which is relative to the atmospheric circulation patterns, its orography (Figure 1) and its proximity to the Atlantic Ocean.

The winter is dominated by the depressions of westerly circulation and by meridional circulation. More than 40% of the annual precipitation occurs during winter in the western zone of the basin. The summer is dominated by the Azores High. Less than 16% of the annual precipitation occurs during summer in the coastal area. In spring, precipitation is particularly due to local storms that are generated by local convection. More than 28% of the annual precipitation occurs during spring in the eastern region of the basin.

Relative to the orography, the DB is bounded by the Cantabrico mountain system (about 2648 m height) to the north, the Iberico mountain system (about 2313 m height) to the east and the Central mountain system (about 2592 m height) in the south and the Galaico-Portuguese mountain system. The Atlantic Ocean is the western boundary. As a result of this distribution of orography and the Atlantic origin, many synoptic disturbances contribute to a spatial variability in the precipitation amounts (Trigo *et al.*, 2004).

### 2.2. Data sources

2.2.1. Observed data. Observed precipitation data were obtained from the National Institute of Meteorology of Spain and from the Water Institute of Portugal (http://www.inag.pt).

The observed data consists of monthly precipitation totals recorded at 34 weather stations located in Spain and Portugal, both within and without the DB, for the 1958–1993 period (Figure 2). The 34 stations have relatively few missing data, less than 5% of the total number of monthly values. Thus, the missing data were filled using an interpolation method similar to the one proposed by Peterson and Easterling (1994).

From the monthly precipitation time series, winter precipitation time series were calculated as the total amount of precipitation from December of the preceding year to February of the following year.

2.2.2. Data from NCEP/NCAR reanalysis project. A 24-point grid was considered, from 0.000° to 9.375 °W of longitude and from 39.0470° to 44.7620 °N of latitude using data from the National Centers for Environmental Prediction/National Center for Atmospheric Research (NCEP/NCAR) reanalysis project.

To study winter precipitation variability, monthly time series were calculated from the daily time series. Winter precipitation values were estimated as the total amount

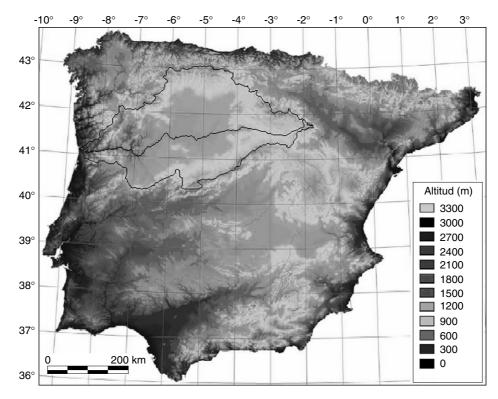


Figure 1. Location of the Duero basin and the main features of Iberian Peninsula orography (Ninyerola et al., 2005).

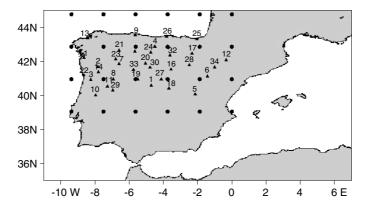


Figure 2. Location of meteorological observational network (▲) and grid points of reanalysis data (●) used in this study.

of precipitation from December of the previous year to February.

For the study of intra-annual variability and spatial distribution of precipitation the data consists of 10-DDV (three values per month) of precipitation amount from 1958 to 1993. The 10-DDV was averaged over the 36 years and the mean intra-annual variation amounts consisting of 36 values were constructed for each grid point. Thus, the data sets consist of 36 mean 10-DDV for the 24-grid point.

#### 2.3. Methods of analysis

Table I summarizes the statistics of observed precipitation data, as well as, Mann-Whitney test and Wald-Wolfowitz test results.

The results reveal that approximately 71% of the winter precipitation time series can be considered as mesokurtic

because the kurtosis values are between the critical values (-1.056 and 1.502) (Ardanuy and Soldevilla, 1992). Most of the time series (65%) are positively skewed and this means that the greatest winter precipitation values are less frequent.

The data were also subjected to statistical quality control. Homogeneity analysis has been made with the Mann test and the Wald–Wolfowitz test (Sneyers, 1975, 1990). The Wald–Wolfowitz test indicated no significant correlation in the time series of the winter precipitation for 31 of the 34 series investigated. Only three series showed significant serial correlation in the winter precipitation values. Trends of decreasing winter precipitation were observed for 38% of the time series, although the results of the Mann test showed that these trends were not statistically significant. Therefore, there is no clear evidence from statistical analysis of the observed time series

Table I. Statistical parameters of the observational winter time series.

	Satation	ELE	RM	SD	SK	KT	u	u
		(m)	(mm)				(r)	(t)
1	Aldea Rey Niño	1160	168.4	78.4	0.108	-1.337	0.046	-1.747
2	Alturas Barroso	1279	751.3	383.9	0.429	-1.017	-0.056	-0.952
3	Arouca	300	661.1	354.2	0.835	0.356	-0.519	-1.434
4	Cervera Pisuerga	1013	345.5	185.3	1.163	1.443	-0.740	-0.611
5	Cuenca	956	157.6	79.0	0.115	-0.846	0.691	-2.03
6	Daroca	779	82.3	36.4	0.258	-0.529	0.413	-1.974
7	Deilão	870	303.4	155.6	0.456	-0.105	-0.163	-1.860
8	Escalhão	615	189.3	92.9	0.355	-0.511	0.771	-2.00
9	Gijón	10	285.0	104.4	-0.129	-0.237	1.690*	-1.747
10	Gralheira	1100	965.1	506.2	1.007	0.909	0.070	-1.576
11	Guarda	1019	368.2	164.0	0.026	-0.734	0.444	-2.627
12	Huesca	541	127.1	59.0	0.694	0.924	1.109	-3.053
13	La Coruña	57	365.0	160.7	1.005	1.649	-0.060	-1.264
14	Lamas Olo	1025	738.5	531.1	1.555	3.250	2.002*	-3.423
15	Léon	913	182.6	101.0	1.231	2.187	0.343	-2.030
16	Linares Arroyo	911	115.4	53.0	1.130	2.778	-0.225	-0.951
17	Logroño	352	85.8	36.1	0.157	-0.678	1.114	-1.804
18	Madrid	582	140.4	70.0	0.181	-0.687	0.462	-2.088
19	Matacan	790	109.0	53.3	0.365	-0.103	0.198	-2.485
20	Medina Rioseco	749	122.8	66.8	0.650	-0.013	0.087	-2.173
21	Ponferrada	550	235.6	139.8	1.483	2.345	0.279	-0.696
22	Porto	90	486.5	224.7	0.716	0.584	-0.465	-1.434
23	Presa Cardena	1600	566.6	307.5	1.320	1.987	-0.425	-0.241
24	Saldaña	912	178.6	86.2	0.808	0.587	-0.111	-1.065
25	San Sebastián	259	439.0	147.0	0.227	-0.201	2.332*	-1.150
26	Santander	65	359.3	116.3	-0.481	-0.309	1.957	-1.548
27	Segóvia	1005	119.8	53.4	0.357	-0.631	-0.492	-1.179
28	Soria	1082	136.4	70.4	1.123	2.666	0.552	-2.173
29	Vale Espinho	885	546.9	298.7	0.562	0.333	0.211	-1.406
30	Valladolid	735	125.7	65.0	0.704	0.097	-0.065	-1.434
31	Vigo	255	791.7	363.4	0.568	0.185	-0.567	-1.179
32	Villafria	881	166.8	88.8	1.267	2.037	0.481	-2.400
33	Zamora	667	118.4	66.6	0.682	-0.137	1.526	-2.713
34	Zaragoza	247	68.1	35.5	0.660	0.310	-0.648	-1.179

ELE, elevation; RM, winter mean precipitation (mm); SD, standard deviation; SK, skewness; KT, kurtosis; u (r), Wald-Wolfowitz statistics test; u(t), Mann statistics test.

to suggest an inhomogeneity in the winter precipitation series.

To study the spatial variability, the PCA was used (Atchley and Bryant, 1975; von Storch and Zwiers, 1999). This method allows a field to be decomposed in spatial patterns and in temporal coefficients. The spatial patterns also called empirical orthogonal functions (EOFs) permit to obtain a regionalization, i.e. to identify homogeneous zones with similar variation patterns. The PCA technique is useful because it enables the reduction of dimensionality of the data while retaining most of the precipitation variation. Thus, the S-mode of PCA (Jolliffe, 1986; Preisendorfer, 1988) was applied to the data matrices. Stations or grid points with similar variation of winter precipitation were detected and clustered, revealing the sub-areas of the basin. Varimax orthogonal rotation is the option used to avoid some of the domain shape dependence (Richman, 1986) and to obtain stable and physically meaningful patterns (von Storch, 1995).

In the study of intra-annual variability, S-mode and T-mode of PCA were applied to the 10-DDV of precipitation as in Bartzokas *et al.* (2003). The S-mode enabled us to obtain zones with identical variation of precipitation, while the T-mode revealed the seasons of the year from a precipitation point of view. For the selection of the number of Principal components (PCs), we used the scree test that was proposed by Cattel (1966) and reviewed by Browen (1968).

As is well known, the variability of the precipitation series must be due to physical causes that in general are related to anomalies in the large-scale circulation of atmosphere. Therefore, the teleconnection indices, centres of action of anomalies in the tropospheric geopotencial field, proposed by Barnston and Livezey (1987) were considered to analyse the relationship between the precipitation and the anomalies in the large-scale general circulation. The data of NAO, EA, PNA, EAWR and SCAND were derived from

the database of the Climate Diagnostics Center (CPC, http://www.cpc.ncep.noaa.gov/).

#### 3. RESULTS

#### 3.1. Characterization of winter precipitation

To analyse the main characteristics of winter precipitation, we obtained the mean value of winter precipitation, in the period considered for both types of data (observed and reanalysis data). Figure 2 shows the location of meteorological stations (A) and the grid points of reanalysis data (•) used in this research.

The spatial distribution of mean winter precipitation for observed data is depicted in Figure 3(a) for the period 1958-1993. The spatial distribution is based on data from 34 stations of the meteorological network used in this study. Contrasts are illustrated between western and eastern areas. The mountains that separate coastal and inland sites play an important role as blocking factors for zonal moisture transports. The ability of mountains in the basin to modify the spatial structure of precipitation is clear in steep meridional gradients of precipitation. Generally, stations situated on the Atlantic coast are characterized by the highest values, while the lowest values are observed on the eastern area of the DB. In the 368 km from west to east, winter precipitation decreases from 600 mm to 200 mm. Figure 3(b) shows also the mean spatial distribution for the reanalysis data.

The line corresponding to 200 mm separates the zone of greater precipitation and the zone of lesser precipitation in both figures. The greatest precipitation is observed in the western zone, while the lowest is recorded in the eastern area. The spatial distribution shown in these figures tends to be similar. Nevertheless, the results obtained with reanalysis data in the western area are smaller than the ones obtained with observed data. Such differences in the mean value of winter precipitation are probably due to the different spatial resolutions of the grids used in this study.

#### 3.2. Variability of winter precipitation

To study winter variability we applied the PCA (Smode) to observed data, as well as to reanalysis data. The empirical orthogonal functions were obtained to characterize the modes of variability and to determine which of them has the periodic characteristics of the subregion where it was more influenced. To investigate the relationship between winter precipitation and anomalies in the dominant patterns of atmospheric variability, we performed the correlation between teleconnection indices and PCs of winter precipitation.

#### 3.3. Spatial variability of winter precipitation

The first component accounts for 67.5% and 60.8% of the winter precipitation variance for observed and reanalysis data, respectively (Table II). The EOF1 reveals positive loadings everywhere (Figures 4(a) and 5(a)). The highest values appear in the western zone in the mountain system located in the north-west of Portugal (Galaico-Portuguese mountain system) and in the inner part of the DB, a large plain characterized by a height of 700 m. This component represents the variability of winter precipitation in the direction of the western part of the DB.

Zorita et al. (1992) and Nieto et al. (2004) have obtained similar results for EOF1 of winter precipitation in the Iberian Peninsula. The pattern obtained by Rodríguez-Puebla et al. (1998) also exhibits positive

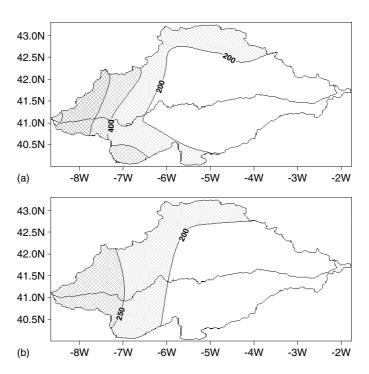


Figure 3. Spatial distribution of winter precipitation over DB for the 1958-1993 period for (a) observed data; (b) reanalysis data.

Table II. (a) Percentage of total variance of observed winter precipitation; (b) percentage of total variance of reanalysis winter precipitation; (c) percentage of total variance of decades values of precipitation obtain with S-mode of PCA; (d) percentage of total variance of decades values of precipitation obtain with T-mode of PCA.

	(a) Percentage of total variance	(b) Percentage of total variance	(c) Percentage of total variance	(d) Percentage of total variance
EOF1	67.5	60.8	56.3	53.2
EOF2	8.4	16.7	30.8	33.7
EOF3	5.3	9.9	_	8.8

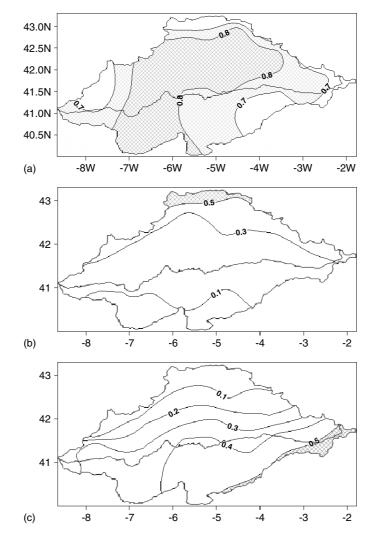


Figure 4. EOFs of winter precipitation data: (a) EOF1 observed; (b) EOF2 observed (c) EOF3 observed.

values over entire Iberia, with higher values towards the western regions.

The corresponding principal component 1 (PC1), for both data, is negatively correlated with January NAO (NAO1), winter NAO (DJF-NAO) and November PNA (PNA11) (Table III). The negative relationship between NAO and precipitation was expected according to previous results obtained by Ródo *et al.* (1997) and Rodríguez-Puebla *et al.* (1998) for the entire Iberian Peninsula. This component is also positively correlated with January EA (EA1) (Table III). Rodríguez-Puebla *et al.* (1998) obtained a significant correlation between PC1 for annual precipitation and April EA (EA4).

The second component explains 8.4% and 16.7% of the total variance for observed and reanalysis data. In the EOF2 pattern, high values appear in the north zone (for observed data) and the north-eastern zone (for reanalysis data) in the Cantabrico mountain system, while lower values are observed in the south zone in the northern Central mountain system (Figures 4(b) and 5(b)). For both data, this component divides the basin into two regions: the north and the south.

Relative to this pattern, for winter precipitation, Zorita *et al.* (1992) obtained a dipolar structure with positive and negative values being separated by a line connecting the southern end of Portugal and the Bay of Biscay.

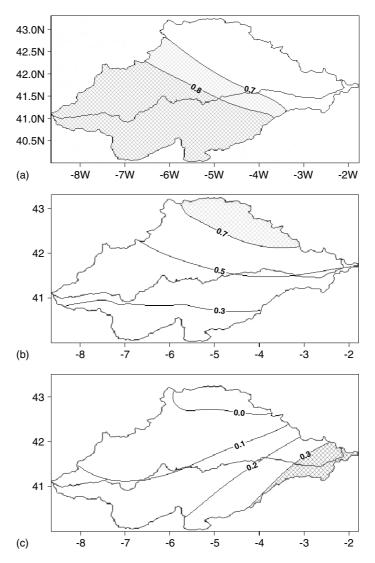


Figure 5. EOFs of winter precipitation data: (a) EOF1 reanalysis; (b) EOF2 reanalysis (c) EOF3 reanalysis.

Table III. Correlation coefficients between PCs of winter precipitation corresponding to the observed data (PCs-obs), reanalysis data (PCs-rea) and the teleconnection indices.

	PC1-obs	PC2-obs	PC3-obs	PC1-rea	PC2-rea	PC3-rea
NAO1	-0.46	_	_	-0.41	_	_
NAO-DJF	-0.49	_	_	-0.60	_	_
EA1	0.42	_	_	0.41	_	_
PNA11	-0.39	_	_	-0.37	_	_
EAWR-DJF	_	-0.44	_	_	-0.46	_
SCAND10	_	_	0.45	_	_	0.30

Negative values were obtained in the north and positive values in the south. The results obtained by Nieto *et al.* (2004) characterize the gradient of precipitation between north (positive values) and south (negative values).

In the study of annual precipitation in the Iberian Peninsula, Rodríguez-Puebla *et al.* (1998) obtained higher values toward the south-western part of Iberia and lower values in the north.

The EAWR teleconnection index is used to obtain meanings of the second mode of precipitation variability.

The results of the correlation between the precipitation and winter EAWR (EAWR-DJF) indicate that the winter EAWR is correlated with the second principal component and the correlation coefficient is -0.44 (for observed data) and -0.46 (reanalysis data) (Table III). According to the results obtained by Nieto *et al.* (2004), the precipitation variability in the northern part of the Iberian Peninsula, represented by PC2, is related to the EAWR.

The third eigenvector corresponds to an eigenvalue of 5.3 and 9.9% for observed and reanalysed data

respectively. The EOF3 pattern for both data shows the highest values over the south-eastern area of the DB in the Central mountain system and the lowest values in the north-west corner of the DB and north, south of Cantábrico mountain system and east of Galaico-Portuguese mountain system (Figures 4(c) and 5(c)).

The pattern obtained by Rodríguez-Puebla *et al.* (1998) divides the Iberian Peninsula into west-east precipitation regimes, with higher values toward the east and lower values toward the north-west. The PC3 is positively correlated with October-SCAND (SCAND10) (Table III).

In addition to the relationships between precipitation and teleconnection indices, there are other reasons for the behaviour of the precipitation. The spatial distribution of rainfall, as well as its seasonal variability, may be explained in terms of the broad characteristics of the global circulation and regional climate factors, e.g. latitude, orography, and oceanic and continental influences (Trigo and DaCamara, 2000). Egido et al. (1991) analysed the precipitation over the Spanish Tagus River basin as a function of topographic factors and the results suggest a greater influence of elevation. Rodríguez-Puebla et al. (1998) obtained the relationships between the annual patterns of precipitation variability and geofactors. An interpretation of the patterns obtained for the winter precipitation in DB also takes into account the relationship between winter months and orographic influences. The topographic factors must also be considered to characterize the winter precipitation variability. Table IV shows the correlation between the winter patterns of precipitation variability and elevation, latitude and longitude.

The EOF1 pattern is strongly linked to rainy months, when westerly advection brings moist air and produces precipitation. This precipitation is intensified by the passage of cold fronts associated with families of transient depressions (Trigo and DaCamara, 2000) and by the orography of the region. In this case, the mountains that separate coastal and inland sites play an important role as blocking factor. The inner basin is protected against Atlantic advections by the mountainous systems. Zorita et al. (1992) assumed that the first EOF pattern of winter precipitation in the Iberian Peninsula is associated with the strength of the mean westerly winds adverting precipitation synoptic systems to Iberia or with the sea surface temperature at the coast. Therefore, the NAO is strongly related to the strength of westerly winds (Trigo et al., 2004).

To quantify the effect of westerly advection, Ulbrich et al. (1999) obtained a highly linear relationship (r =

Table IV. Correlation coefficients between EOFs of observed winter precipitation and topographic factors.

Factors	EOF1	EOF2	EOF3
Latitude Longitude Elevation	-0.39 $-0.53$ $0.51$	0.70 $0.01$ $-0.55$	-0.59 0.50 0.01

0.81) between the first principal component of precipitation in Portugal and north-south sea level pressure gradient over Portugal for individual winter months. They found a correlation maximum of rainfall and local upper air geopotential height variability (the storm track) over Portugal.

EOF2 is positively correlated with the latitude of the region: maximum values correspond to the northeastern zone. Possibly, this pattern could be linked to cyclonic activity that originated in the Mediterranean basin (Zorita *et al.*, 1992). This assumption is reinforced by the fact that the highest coefficients are obtained for the Cantábrico mountain system.

With regard to the different sign of correlation between EOF1 and EOF2 with elevation (Table IV), these relationships are not the simple precipitation enhancement due to the elevation, i.e. precipitation increases with elevation. According to Prudhomme and Reed (1998), the relationship between precipitation and topography, and especially elevation, has been moderated by a secondary phenomenon, the rain-shadow effect. Furthermore, the spatial distribution of precipitation does not depend on elevation in a simple manner, but reflects more complex relationships between relief and position to moisture source (Prudhomme and Reed, 1998).

The smaller scale of EOF3 is difficult to interpret in simple physical terms. The higher variability in the eastern area probably is due to the orography and to the effect of the distance of the shores.

The patterns obtained with observed data have been compared to the corresponding reanalysis data. An examination of the results shows that, in the case of EOF1, both patterns represent the variability of winter precipitation in the direction of the western zone of the basin. An inspection of Figures 4(b) and 5(b) reveals that these patterns divide the study area into a north region (where the loadings are the highest) and a south region (where the loadings are the lowest). In the patterns shown in Figure 4(c) and in Figure 5(c), the maximum loadings are recorded in the south-east zone, while the minimum is recorded in the north-western and north sectors of the DB.

Finally, it is interesting to observe that patterns obtained with observed data have very similar spatial distributions to those obtained with reanalysis data. In both cases, the PCs of winter precipitation corresponding to the observed and reanalysis data are linked to the same teleconnection indices. This result suggests that reanalysis data are suitable for analysing climate variability and climate dynamics in the DB.

#### 3.4. Intra-annual variation of precipitation

Using the S-mode of PCA in 10-DDV, some characteristics of the intra-annual variation of precipitation are revealed. The scree test showed that the number of EOFs to retain is two.

The first EOF captures 56.3% of the total variance. A marked longitudinal trend is shown by EOF1 with

negative values in the eastern part of the basin and positive values in the western area (Figure 6(a)). This pattern divides the DB into west-east regimes. The loadings exceed 0.7 in the western area of the basin and it means that zone represents the first mode of intra-annual variation.

The temporal coefficients are plotted in Figure 6(b). The intra-annual variation shows one maximum. This maximum extends from mid October to early April. The minimum is recorded in summer. It appears in late May and extends up to September.

The second component explains 30.8% of the total variance. High loadings appear in the inland zone of DB decreasing toward the west (Figure 7(a)). In this area, the intra-annual variation of the precipitation amounts presents two maxima and a wide minimum. The first maximum appears in late February. The second maximum spans from early April to June and appears about three months later than in PC1. This maximum is especially observed in the central DB region, probably due to the heating of land that favours convection air mass and local storms that generate precipitation. The minimum extends from mid July to early February (Figure 7(b)).

#### 3.5. Spatial distribution of precipitation

The T-mode of PCA applied to 10-DDV of precipitation reveals the seasons of the year from a precipitation point of view with similar spatial patterns. The first EOF explains 53.2% of total spatial variance of precipitation (Figure 8). The spatial distribution of precipitation is

characterized by high values in the western and northern areas, decreasing toward the south-eastern region.

Table V shows the factor loadings for the analysis of the spatial distribution of precipitation. These results suggest that PC1 is closely associated with the October 10-DDV to the first 10-DDV of April. The maxima loadings are those of December and January, when all of them exceed 0.95. This period (October-early April) can be associated with the winter season, when the DB is mainly exposed to the influence of Atlantic advections that generate precipitation. The effects of these advections are mitigated in the inland and eastern areas of DB due to the sheltering effect of different mountain ranges. Furthermore, in these zones the effects of frontal precipitation are not so intense because the fronts coming from the Atlantic are weakened by their trajectories.

The second EOF accounts for 33.7% and comprises mainly the 10-DDV of April to the first 10-DDV of August. The most typical 10-DDV are the first and second of May, when loadings exceed 0.97. During this season, the pattern is characterized by high values in the inland and eastern areas, whereas the lowest values are recorded in the western area of the basin (Figure 9). This period (April–August) can be associated with later spring/summer. The precipitation that occurs in April and May is related to the intense heating of land that leads to air convection and thunderstorms.

The third EOF captures 8.8% and refers to the period from late August to September, with the maximum at the

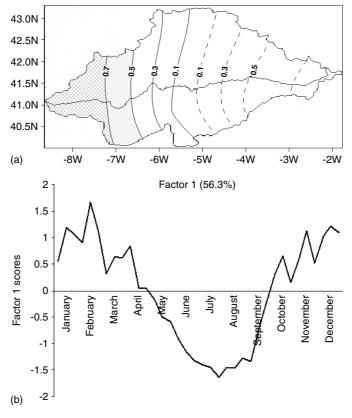


Figure 6. (a). EOF1 of 10-DDV reanalysis data; (b) Time series of PC1 of 10-DDV reanalysis data.

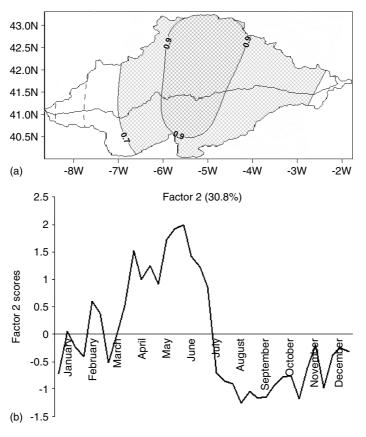


Figure 7. (a). EOF2 of 10-DDV ł reanalysis data; (b) Time series of PC2 of 10-DDV reanalysis data.

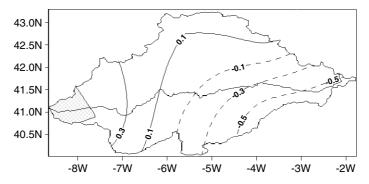


Figure 8. Spatial distribution of precipitation amount. Factor 1 scores.

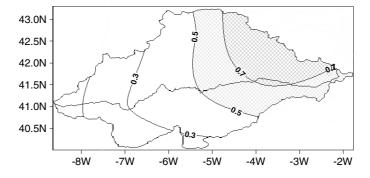


Figure 9. Spatial distribution of precipitation amount. Factor  $\boldsymbol{2}$  scores.

Table V. Factor loadings for the analysis on the spatial distribution of precipitation (values lower than 0.32 are not statistically significant at the 95% confidence level and have been omitted. Values greater than 0.70 indicate that at least 49% of variance is explained by one factor only and appear in bold).

10-DDV	EOF 1	EOF 2	EOF 3
1 <sup>a</sup> Dec-January	0.98	_	_
2 <sup>a</sup> Dec-January	0.96	_	_
3ª Dec-January	0.98	_	_
1 <sup>a</sup> Dec-February	0.97	_	_
2ª Dec-February	0.94	_	_
3 <sup>a</sup> Dec-February	0.94	_	_
1ª Dec-March	0.97	_	_
2 <sup>a</sup> Dec-March	0.96	_	_
3ª Dec-March	0.87	0.40	_
1 <sup>a</sup> Dec-April	0.75	0.62	_
2ª Dec-April	0.45	0.86	_
3ª Dec-April	0.33	0.90	_
1 <sup>a</sup> Dec-May	0.33	0.88	_
2ª Dec-May	_	0.97	_
3 <sup>a</sup> Dec-May	_	0.97	_
1ª Dec-June	_	0.94	_
2ª Dec-June	_	0.93	_
3ª Dec-June	_	0.89	_
1a Dec-July	_	0.91	_
2 <sup>a</sup> Dec-July	_	0.85	0.43
3ª Dec-July	_	0.77	0.37
1 <sup>a</sup> Dec-August	_	0.73	0.61
2ª Dec-August	_	0.59	0.74
3ª Dec-August	_	0.59	0.77
1 <sup>a</sup> Dec-September	_	0.51	0.79
2 <sup>a</sup> Dec-September	_	_	0.93
3 <sup>a</sup> Dec-September	0.64	_	0.72
1ª Dec-October	0.80	_	0.46
2ª Dec-October	0.89	_	_
3ª Dec-October	0.90	_	_
1 <sup>a</sup> Dec-November	0.73	_	_
2 <sup>a</sup> Dec-November	0.97	_	_
3ª Dec-November	0.95	_	_
1ª Dec-December	0.98	_	_
2ª Dec-December	0.96	_	_
3ª Dec-December	0.97	_	_

Note:  $1^a$  signifies the first ( $1^{st}$ ) DDV,  $2^a$  signifies the second ( $2^{nd}$ ) DDV and  $3^a$  signifies the third ( $3^{rd}$ ) DDV.

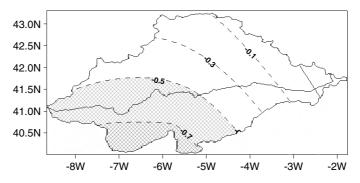


Figure 10. Spatial distribution of precipitation amount. Factor 3 scores.

second 10-DDV of September. The spatial distribution of precipitation has the maximum located in the eastern corner of the basin, while the minimum is located in the south-western zone of the DB (Figure 10).

This period (end August–September) can be associated with autumn when the precipitation is associated with the gradual displacement of depressions to lower latitudes than in summer.

#### 4. CONCLUSION

The results obtained in this study can be summarized as

(1) The winter precipitation variability was studied with PCA and the winter precipitation fields are represented by the first three PCs, which describe 81 and 87% of the total variance, for both data, respectively. The first mode of variability represents the winter precipitation variability toward the western area of the basin. The second component characterizes the gradient of winter precipitation between north and south and the third component represents the gradient between east and west. The distribution of spatial variability shows agreement between the observed and reanalysis data.

The PC1 data, which represents the precipitation variability toward western regions, are significantly correlated with NAO1, DJF-NAO, EA1 and PNA11. The precipitation variability in the north and northern zones of the DB, represented by PC2, was correlated with EAWR-DJF, while PC3, which represents the variability toward the south-eastern areas in the DB region, is linked with SCAND10. Therefore, the reanalysis precipitation data capture the main behaviour of winter over the DB.

The precipitation reanalysis data are a good choice to study the average behaviour and the distribution of spatial and temporal winter variability, as well as climate dynamics over the DB.

(2) The intra-annual variation of precipitation amount was studied applying S-mode on 10-DDV. Over the western area, the intra-annual variation of precipitation amount is characterized by a broad maximum from mid October to early April, probably reflecting the passage of frontal systems typical of this period. During June-August, in the western area of DB, precipitation is a rare event. Over the eastern area, the intra-annual variation of precipitation presents two maxima: the first from late February and the second around April. The first can be attributed to Atlantic advection and the second to local convection air mass. A very long dry period emerges clearly covering the months from August to January.

T-mode of PCA revealed the seasons of the year from a precipitation point of view. The first EOF, with maximum loadings in the western and northern zones of the basin, is associated with 10-DDV of October to the first 10-DDV of April. This period can be associated with the winter season. The second EOF showed a maximum in

the inland and eastern areas. The most typical 10-DDV is the first and second of May and this pattern can be associated with the spring season. The third EOF with a maximum over the easternmost edge of the basin refers to the period from late August to September. This period is clearly the autumn season.

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Int. J. Climatol. 27: 327-339 (2007)

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Int. J. Climatol. 27: 327-339 (2007) DOI: 10.1002/joc