

# A study of quasi-millennial extratropical winter cyclone activity over the Southern Hemisphere

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**Abstract** The winter extratropical cyclone activity in the Southern Hemisphere during the last one thousand years within a global climate simulation was analyzed by tracking cyclones, and then clustering them into ten clusters consecutively for each hundred years. There is very strong year-to-year variability for Southern Hemispheric winter extratropical cyclone numbers and larger variations on centennial time scale, more so than for its Northern Hemispheric counterparts. However, no obvious trend can be found. The mean tracks of clusters over the Southern Indian Ocean and near New Zealand shift poleward from the eleventh to the twentieth century while the clusters in the central Southern Pacific shift equatorward. Storm track clusters with largest deepening rates are found over the Southwestern Indian Ocean. In the twentieth century, rapidly deepening cyclones appear more often while long lifespan cyclones appear less frequently. The winter storm activity in the Southern Hemisphere is closely related to the Antarctic Oscillation. The cyclone frequency over the Indian Ocean and South Pacific Ocean can be associated with the Indian Ocean Dipole and El Niño-Southern Oscillation respectively.

**Keywords** Quasi-millennium · Extratropical cyclone · Southern Hemisphere · Cyclone numbers

## 1 Introduction

Extratropical cyclones of the Southern Hemisphere (SH) are a dynamically important phenomenon in the mid-latitude climate system, which is not only related to strong winds and heavy precipitation but also influences heat, momentum and moisture fluxes. There are a number of papers that investigated the extratropical cyclone activity over the SH. After first synoptic analyses were prepared by Meinardus and Mecking (1928), a likely first climatology of SH cyclones was provided by Vowinkel and van Loon (1957), and later after the International Geophysical Year 1957/58 by van Loon and Taljaard (1962, 1963). More recent studies dealt with decadal changes of Southern Hemispheric extratropical cyclones using reanalysis data (Key and Chan 1999; Simmonds and Keay 2000a, b; Hoskins and Hodges 2005; Wang et al. 2006; Pezza et al. 2007; Lim and Simmonds 2007; Grise et al. 2014), or future changes as an expected response to anthropogenic forcing over the twenty-first century (Yin 2005; Bengtsson et al. 2006; Chang et al. 2012). However, there is still less knowledge than for the Northern Hemisphere (NH). For example, multi-centennial changes for storminess over the NH are available using proxy data (Alexandersson et al. 1998; Matulla et al. 2008) or global climate model simulations (Fischer-Bruns et al. 2005; Xia et al. 2013), but are still deficient over the SH. So in this paper we examine the storm tracks of the SH for almost 1000 years within a coupled atmosphere–ocean global climate model (GCM) through the lens of regional clustering and frequency of storm tracks. The purpose of doing so is to learn the long-term natural variability of extratropical cyclones over the SH, which is important for assessing the significance of expected future changes.

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This study is making use of an available millennial simulation (von Storch et al. 1997). Unfortunately, the spatial resolution of this simulation is only T30 which is relatively coarse and output is saved only every 12 h. It is expected that extratropical cyclone numbers may be underestimated due to coarse temporal and spatial resolution (Zolina and Gulev 2002; Jung et al. 2006). However, the aim of this study is to investigate the variability of SH storm tracks from century to century, and the underestimation of total track lengths and numbers is uniform throughout the simulation so that the variability is supposedly hardly affected. Furthermore, this simulation has been used to study multi-centennial changes for storminess over the NH (Fischer-Bruns et al. 2005; Xia et al. 2013). More important is that the spatial patterns and relative frequencies of tracks are comparable with other studies.

Automatic tracking algorithms provide convenient ways to study long-term cyclone activities (Murray and Simmonds 1991; Hodges 1994, 1995; Serreze 1995; Blender et al. 1997; Wernli and Schwierz 2006; Rudeva and Gulev 2007; Zahn and von Storch 2008a, b; Chen et al. 2014). The well-developed tracking algorithm from Hodges (1994, 1995, 1999) is applied in this study. This algorithm has been already adopted to track SH extratropical cyclones (Hoskins and Hodges 2005; Grise et al. 2014). Also the cluster analysis is commonly used to sort cyclones into different categories (Blender et al. 1997; Sickmüller et al. 2000; Elsner 2003; Nakamura et al. 2009; Chu et al. 2010; Xia et al. 2013).

SH extratropical cyclone activity can be related to many climate factors, for example to the influence of the Antarctic sea ice concentration or extent (Simmonds and Wu 1993; Pezza et al. 2008), also to the effect of the Antarctic Oscillation (AAO) (Fischer-Bruns et al. 2005; Mendes et al. 2010; Eichler and Gottschalck 2013), to the El Niño–Southern Oscillation (ENSO) and Southern Annular Mode (SAM) (Pezza et al. 2008), Indian Ocean Dipole (IOD) (Ashok et al. 2007), as well as to anthropogenic forcing like increases of greenhouse gases (Yin 2005; Bengtsson et al. 2006; Chang et al. 2012) and depletion of Antarctic stratospheric ozone (Grise et al. 2014).

In this paper, variability of SH extratropical cyclones and its relation to southern winter circulation patterns are studied, which is done by aligning seasonal anomalies of mean sea level pressure field (MSLP) and time-variable numbers of members in cyclone track clusters through a Canonical Correlation Analysis (CCA) (Busuioc and von Storch 1996; von Storch and Zwiers 1999).

The long-term simulation dataset generated by the coupled atmosphere–ocean GCM ECHO-G exposed to estimated forcings of solar variations, volcanic and greenhouse-gases in the last millennium, is described in Sect. 2, as well as the main methods used in this study. In Sect. 3.1

the time series of SH extratropical cyclone track numbers for the quasi-millennium (991 years) and for each century are shown. In Sect. 3.2 SH cyclone tracks are clustered into ten clusters by the K-means clustering method; characteristics including life span, frequency and intensity for each group are also discussed. Relations between winter circulation patterns and variations of the numbers of the clusters in the South Pacific, South Atlantic and South Indian Ocean are studied in Sect. 3.3. Finally, the main conclusions are summarized.

## 2 Data and methods

### 2.1 Data

The quasi-millennial (1000–1990 AD) simulation used in this study has been carried out with the global climate model ECHO-G (Min et al. 2005a, b) which consists of the atmospheric model ECHAM4 (Roeckner et al. 1996) and the ocean model HOPE-G (Wolff et al. 1997). There are 19 (20) levels for the atmosphere (ocean). The horizontal resolution is T30 (about  $3.75^\circ$ ) for the atmospheric part and T42 (about  $2.8^\circ$ ) for the oceanic part. The model time step for ECHAM4 is 30 min and for HOPE-G is 12 h. The output is stored every 12 h.

The estimated historical forcing for driving the model such as solar variations,  $\text{CO}_2$  and  $\text{CH}_4$  concentrations as well as volcanic effects have been described previously by von Storch et al. (2004) and Zorita et al. (2005). The ECHO-G simulations have been shown to describe well most aspects of the seasonal and annual climatology and of the interannual to decadal variability of near-surface temperature, precipitation and mean sea level pressure (MSLP) (Min et al. 2005a, b; Gouirand et al. 2007). However, there are weak negative pressure biases at SH mid-latitudes and a strong positive pressure bias over Antarctica which may be related to a lack of ozone depletion in the model (Min et al. 2005a). The atmospheric circulation of the SH including the El Niño Southern Oscillation (ENSO) (Min et al. 2005b), the Antarctic Circumpolar Wave (Marsland et al. 2003) and decadal modulations of ENSO (Rodgers et al. 2004) are also simulated realistically by ECHO-G, although the modeled signal of the ENSO is too large and its frequency is too regular (Min et al. 2005b).

Investigations of shorter simulations done with ECHO-G have already shown that the grid resolution of T30 is sufficient to study mid-latitude baroclinic cyclones (Stendel and Roeckner 1998; Raible and Blender 2004; Fischer-Bruns et al. 2005). The storm tracks were found to agree well with ERA-15/ECMWF reanalysis data and deviations from ERA-15 are below 10 % (Stendel and Roeckner 1998). It can be speculated that simulations carried out on higher

spatially resolved grids could lead to an increase in the numbers of cyclones due to the generation of additional smaller and weaker cyclones. With respect to the development of temperature, comparisons with different proxy reconstructions have been done, including tree ring data and borehole temperatures (González-Rouco et al. 2003; Tan et al. 2009), and limited observational data (Min et al. 2005a). These results indicate that this simulation lies within the envelope of reconstructions of the past temperature evolution and exhibits qualitatively similar characteristics with other simulations extending over 1000 and more years. Some have argued that ECHO-G temperature variations would be too large. However, this does not question our main conclusion, namely that the mid-latitude winter storm activity is remarkably stationary on centennial time scales.

The key added value of this simulation is the homogeneous presentation of a possible development during the last millennium which is hardly available for observational data.

## 2.2 Cyclone tracking and clustering

A well-developed tracking algorithm by Hodges (1994, 1995, 1999) is applied for cyclone identification and tracking. This algorithm has been widely used to study climatologies of extratropical cyclones (Hoskins and Hodges 2002, 2005; Xia et al. 2013), tropical storms and monsoon depressions (Hodges 1999), or specific cyclones such as polar lows (Xia et al. 2012). It was also adopted to explore SH storm tracks (Hoskins and Hodges 2005).

In this study, the tracking is done with mean sea level pressure (MSLP) fields of the ECHO-G simulation and only winter cyclones (JJA) at mid-latitudes ( $\geq 30^\circ\text{S}$ ) in the SH are considered. Before tracking, contributions from zonal wavenumbers less than or equal to five are subtracted to remove large-scale features (Hoskins and Hodges 2002). Then the tracking algorithm determines all minima below  $-1$  hPa in the filtered MSLP fields. Minima are connected to form tracks if their distance is less than  $12^\circ$  (about 1333 km) within 12 h. Minimum lifetimes of tracks are set to 2 days.

No temporal interpolation of the 12-hourly MSLP fields is done for generating shorter time steps (as in e.g. Murray and Simmonds 1991; Zolina and Gulev 2002). To get smooth tracks, B-spline interpolation (Dierckx 1981, 1984) is used to overcome the coarseness of the T30 resolution (Hodges 1994, 1995) and a smoothing procedure with cost function is also applied as suggested by Hodges (1994, 1995, 1999).

For each century, all tracks are clustered into ten groups by the K-means method which is widely used for the cluster analysis (Blender et al. 1997; Elsner 2003; Mendes et al. 2010; Nakamura et al. 2009). Before clustering, each



**Fig. 1** 991-year (1000–1990) average density [unit:  $(3.75^\circ \times 3.75^\circ)^{-1}$ , about  $110,000 \text{ km}^{-2}$ ] distribution of cyclone genesis in winter (JJA) for the Southern Hemisphere (SH) (Contour interval is  $0.4/110,000 \text{ km}^2$ )

track is fitted to a second-order polynomial function with six free parameters as suggested by Chu et al. (2010). More technical details about clustering are described by Xia et al. (2013).

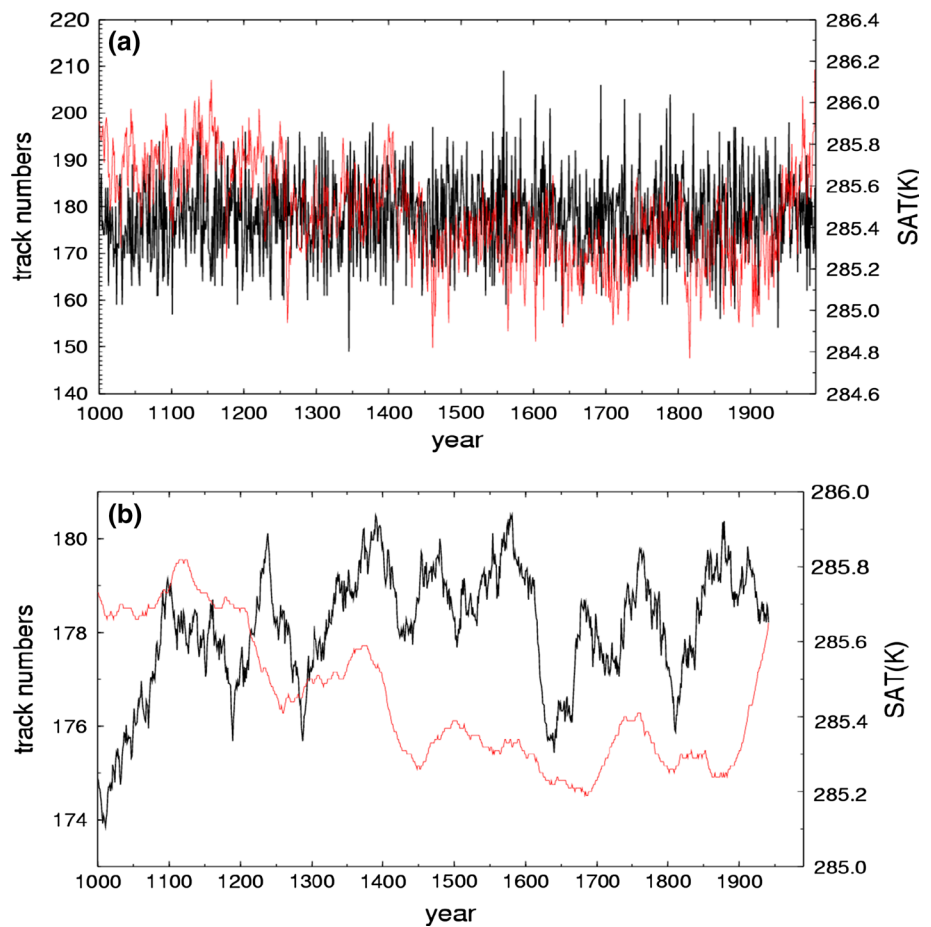
## 3 Results

### 3.1 Storm tracks

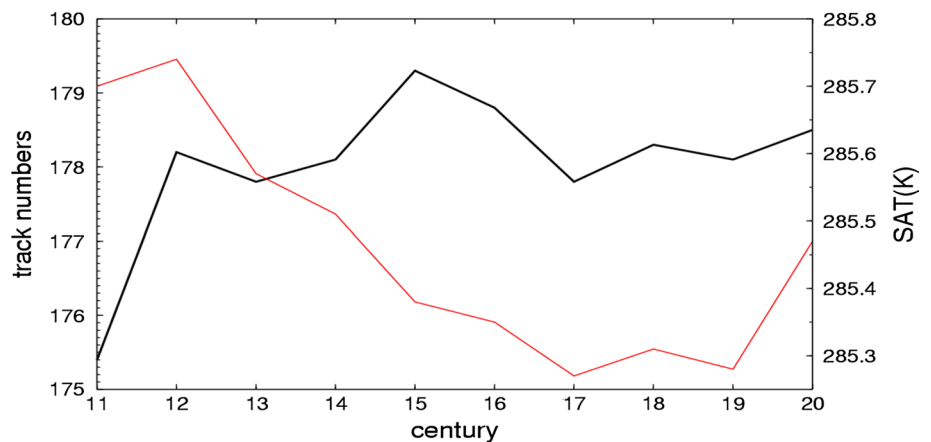
Densities of genesis describe the regions of formation of storm tracks (Fig. 1). The genesis maximum is located in the north of New Zealand and as well as in the Tasman Sea near Australia. There are also genesis maxima off Victoria Land and over the south of South Africa which are in accordance with Hoskins and Hodges (2005) and Simmonds and Keay (2000b). Other genesis regions can be found in the western and central Indian Ocean, and across the Atlantic and Pacific Oceans. The pattern of genesis areas agrees quite well with the result of Hoskins and Hodges (2005) who used vorticity from the ERA-40 with the same tracking method and the pattern is also comparable with the one of Simmonds and Keay (2000b) who used NCEP-NCAR reanalysis. In general it can be concluded that the midlatitude cyclone statistics of the SH from the ECHO-G simulation data are realistic.

The 991-year time series of winter (JJA) cyclone numbers for the SH (Fig. 2a) reveal a very strong year-to-year

**Fig. 2** **a** Time series of the numbers of winter (JJA) extratropical cyclones (*black line*) and winter surface air temperature (SAT: K) (*red line*) in the Southern Hemisphere (SH) (years 1000–1990); **b** same as **a** but for a smoothed time series by computing 50-year running means



**Fig. 3** Average annual numbers of winter (JJA) extratropical cyclones (*black line*) and average winter SAT (K) (*red line*) in the SH for different centuries (eleventh–twentieth century)



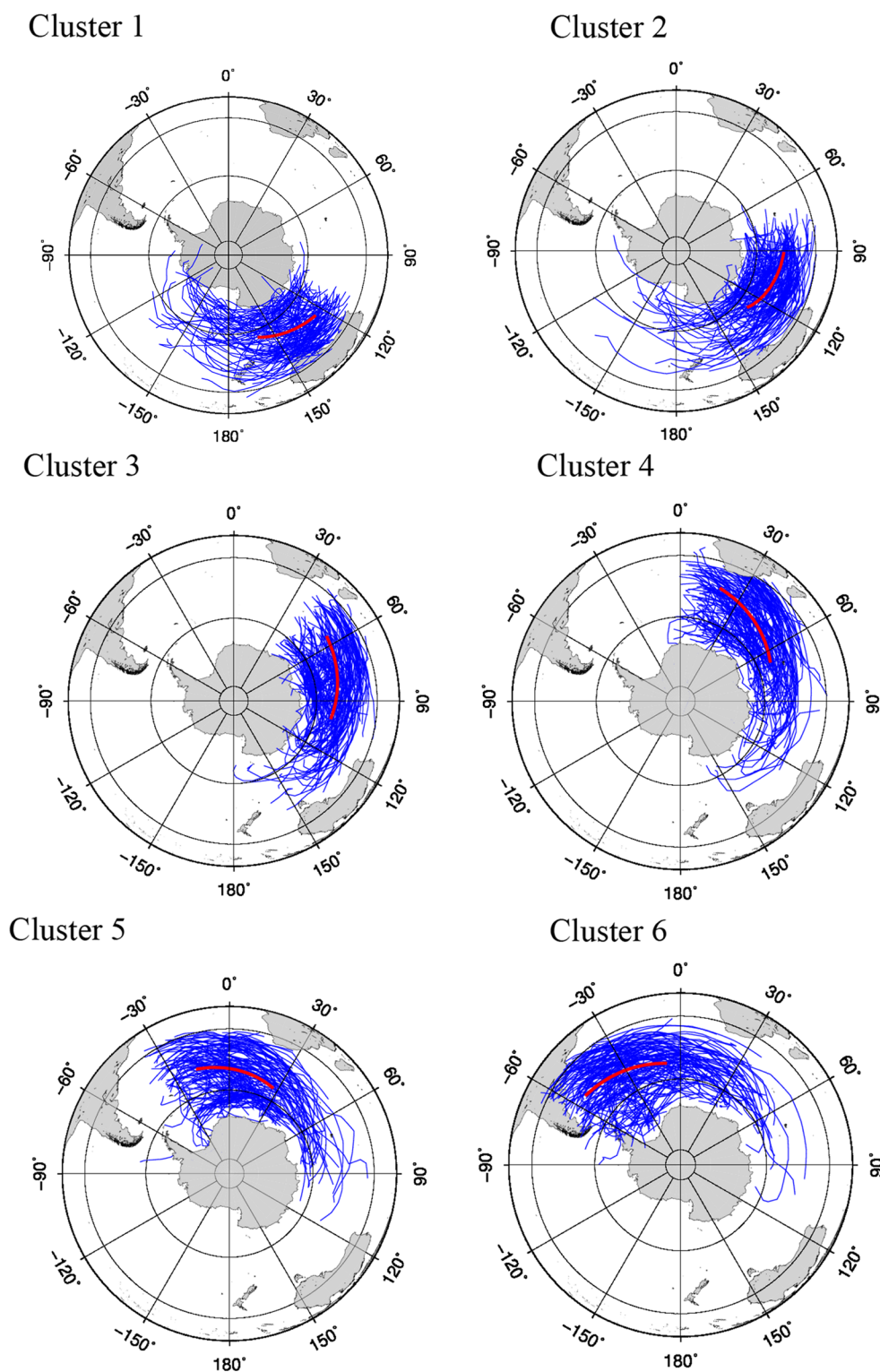
variability. 50-year running means for the whole time series are also shown (Fig. 2b). We can see there are no obvious trend for cyclone numbers and no corresponding relations between cyclone numbers and temperature variations (Fig. 2). Average centennial cyclone numbers (Fig. 3 black line) are at their minimum in the eleventh century (1001–1100) with 175.4/year. The highest average cyclone number of 179.3/year occurs in the fifteenth century (1401–1500).

For the other centuries the average is around 177–178/year. Generally, the variability of average cyclone numbers for different centuries is quite small. No long-term trends can be found during the winters of years 1000–1990.

The result is consistent with the result of Fischer-Bruns et al. (2005) who used the storm frequency defined by the maximum wind speed based on the ECHO-G simulation. A comparison with the storm frequency for both hemispheres



**Fig. 4** Winter (JJA) extra-tropical cyclone tracks of the twentieth century (years 1901–1990) in the SH clustered into ten clusters by applying the K-means method: member tracks (*blue*) and centroid tracks (*red*) of the ten clusters. Throughout the paper the ten clusters are grouped by ocean basins: Indian Ocean (cluster 1–4), South Atlantic (cluster 5–6) and South Pacific (cluster 7–10)

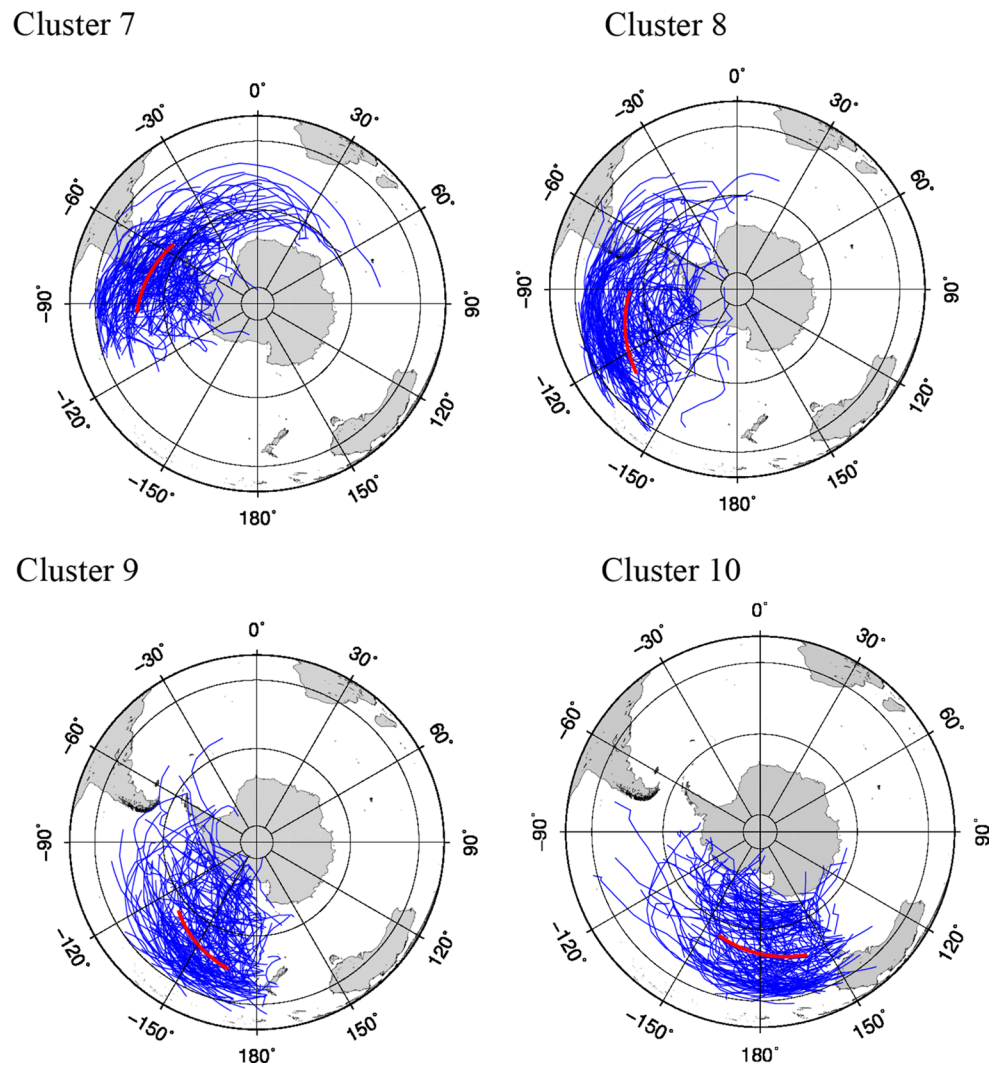


between the pre-industrial period (1551–1850) and the industrial period (1851–1990) reveals negligible differences. No noticeable difference can be seen by comparing 1851–1990 with the recent period 1961–1990 as well as for severe storm days. Fischer-Bruns et al. (2005) also divided

the 1000-year time series of maximum 10 m wind speed into 300 years intervals and found that storm activity is remarkably stable with little variability from period to period.

Our result is also very similar to that obtained for the NH (Xia et al. 2013) when the same tracking method

Fig. 4 continued



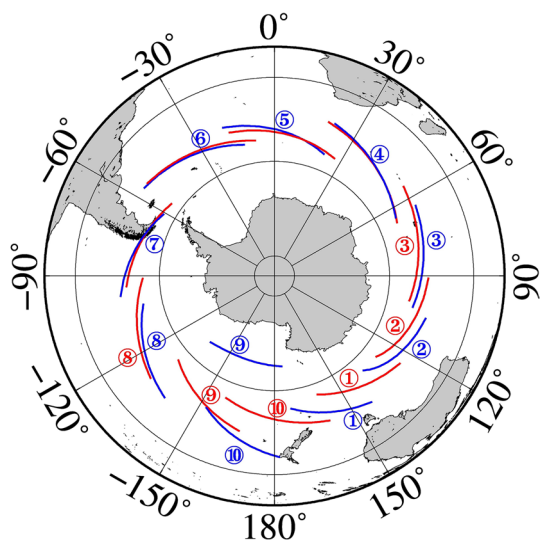
was applied to the ECHO-G simulation. It seems that the average centennial SH cyclone numbers are more closely related to temperature variations than over the NH (refer to Fig. 4 of Xia et al. 2013), even if anomalous temperature periods such as the Medieval Warm Period or the Little Ice Age are hardly associated with strong anomalies in cyclone numbers. Again, average cyclone numbers for different centuries vary only little.

### 3.2 Clustering results

All tracks for each century are clustered into ten groups by applying the K-means method. Figure 4 shows the ten clusters of tracks in the twentieth century (years 1901–1990). The centroid track is the mean track of each cluster (Fig. 4: red tracks). We can see that the trajectories of the 10 clusters almost make a full circle in the mid-latitudes of the SH and are consistent with the genesis areas (Fig. 1). Over the Indian Ocean, there are four clusters: cluster 1 from

New Zealand to Australia, cluster 2 from the southeast of Australia to 90°E, cluster 3 from 90°E to 60°E, cluster 4 from 60°E to South Africa. Over the South Atlantic Ocean, tracks are clustered into two groups: cluster 5 in the western South Atlantic Ocean, cluster 6 in the eastern South Atlantic Ocean. Over the South Pacific Ocean, tracks are separated into four clusters: cluster 7 from South America to about 90°W, cluster 8 from about 90°W–120°W, the center of cluster 9 from about 130°W–170°W, cluster 10 from 170°W to New Zealand. The centroid tracks of the SH bend poleward at their origins while those on the NH bend poleward at their ends (Fig. 5 of Xia et al. 2013).

Table 1 gives the numbers of tracks for each cluster from 1000 to 1990. Cluster 6 which extends from 10°W to South America has the highest numbers. Cluster 9 in the South Pacific Ocean has the fewest numbers. In the Indian Ocean, cluster 1 has the most tracks while cluster 3 has the fewest. Over the South Atlantic, cluster 6 is larger than cluster 5. In the South Pacific Ocean, cluster 7 is the largest, while



**Fig. 5** Mean tracks of ten clusters for the SH in the eleventh and twentieth century: *blue* ones are the mean tracks of the ten clusters in the eleventh century (years 1000–1099), *red* ones are the mean tracks of the ten clusters in the twentieth century (years 1900–1990)

cluster 9 is the smallest. The sum of cyclone tracks over the South Pacific Ocean (cluster 7, 8, 9 and 10) is higher than that over the Indian Ocean (cluster 1, 2, 3 and 4). And over the South Atlantic Ocean, the sum of cyclone counts (cluster 5 and 6) is the lowest.

Many studies implied that under man-made climate change storm tracks would shift poleward in the SH (Ulbrich and Christoph 1999; Fischer-Bruns et al. 2005; Bengtsson et al. 2006, 2009). This claim is also supported by satellite data showing that recent extratropical storm cloudiness has shifted polewards (Bender et al. 2012). Here, we consider the movement of the track centroids of our ten clusters from the first century (the eleventh century) to the last century (the twentieth century) (Fig. 5). Cluster 1, 2, 3 over the Indian Ocean and cluster 10 over the South Pacific move indeed poleward. However, Cluster 9 moves equatorward and cluster 8 also shifts a little equatorward. The poleward-shifting group (cluster 1, 2, 3, and 10) shifts eastward. Cluster 5, 7 and 8 shift westward. The equatorward shift of cluster 9 and poleward shift of cluster 10 is significant (with 95 % confidence;  $p < 0.01$ ), as well as the eastward migration of cluster 1 (with 95 % confidence;  $p < 0.05$ ).

Bengtsson et al. (2006) suggested that a poleward movement of the maximum zonal SST gradient is a contributing factor in the poleward shift of the storm track in the SH.

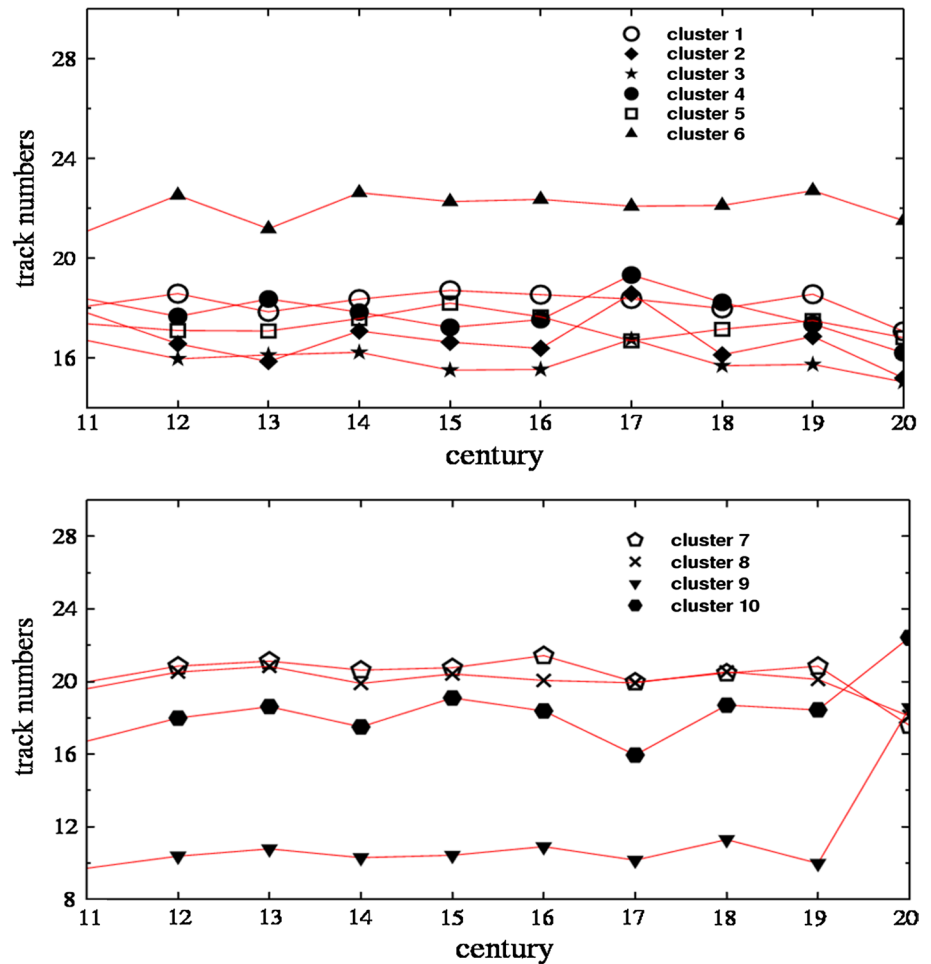
In the meantime, many studies showed that the Southern Annular Mode (SAM) [also referred to as Antarctic Oscillation (AAO)], which is the primary pattern of climate variability in the SH, associates with the location and intensity of the polar jet stream and influences cyclone activity of the SH (Fischer-Bruns et al. 2005; Mendes et al. 2010; also see Sect. 3.3). The positive phase of the SAM enhances the pressure gradient between Antarctica and midlatitude and leads to a strengthening and poleward migration of the SH storm tracks and jet streams, similarly to what is observed during a contraction of the sea ice (Pezza et al. 2008). Abram et al. (2014) pointed out that SAM shifts the positive phase since the fifteenth century and the long-term mean SAM index is now at its highest level that could interpret the poleward shifts of the storm tracks over the Indian Ocean and South Pacific. Furthermore, the study of Graff and Lacasce (2012) supports the notion that the storm tracks respond to changes in both the mean SST and SST gradients: increasing the mean SST and increasing the mid-latitude SST gradient are associated with an intensification and a poleward shift of the storm tracks while a steepening tropical SST gradient causes an equatorward shift of storm tracks. Like, El Nino (La Nina), which is a warming (cooling) of the ocean surface in the tropical eastern Pacific, coupled with the negative (positive) phase of SAM causes the Pacific storm track to shift equatorward (poleward). This happened in the Medieval Climate Anomaly transition to the Little Ice Age (Medieval Climate Anomaly) (Abram et al. 2014; Goodwin et al. 2014). Pezza et al. (2007) suggested that cyclone latitudinal shifts are also related to the Pacific Decadal Oscillation (PDO) phase, i.e. there are more cyclones in the equatorial western Pacific and Indian Ocean during the PDO positive phase while more cyclones occur in subtropical areas during the PDO negative phase.

Figure 6 shows the average cyclone numbers for the 10 clusters in different centuries. There are differences of average cyclone numbers between different clusters, while for most clusters there is no large variation between different centuries. New studies support that the Medieval Warm Period and Little Ice Age are of global scope and not limited to the NH (Rosenthal et al. 2013; Chambers et al. 2014). Neukom et al. (2014) used a new millennial ensemble reconstruction of annual temperature variation for the SH and supported that there is a global cold phase coinciding with the peak of the Northern Hemisphere “Little Ice Age”. For clusters 2, 3, and 4 there are slight increases of average cyclone numbers in the seventeenth century, but for clusters 7 and 10 there are small declines. Still, there are no

**Table 1** Cyclone numbers of the ten clusters shown in Fig. 4 for the quasi-millennial time period (years 1000–1990)

| Cluster | 1      | 2      | 3      | 4      | 5      | 6      | 7      | 8      | 9      | 10     |
|---------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Numbers | 18,057 | 16,574 | 15,794 | 17,669 | 17,163 | 21,855 | 20,206 | 19,837 | 11,082 | 18,180 |

**Fig. 6** Average annual numbers of winter (JJA) extratropical cyclones in the SH for the ten clusters in different centuries (eleventh–twentieth century): *top panel* for the Indian Ocean (cluster 1–4) and the South Atlantic (cluster 5–6); *bottom panel* for the South Pacific (cluster 7–10)



systematic changes of cyclone numbers during these temperature anomalies periods. It is also notable that cyclone numbers of cluster 9 and 10 increase markedly in the twentieth century. This is consistent with the results of Simmonds and Keay (2000a) based on 1958–1997 NCEP data, which show positive linear trends of the annual average cyclone system density around Australia, over the Tasman Sea and in the east of New Zealand. Wang et al. (2004) showed similar results.

Table 2 shows the distribution of lifetimes for all clusters. For clusters 1–8, over 30 % of all cyclones last 2–4 days (Fig. 7). Cluster 9 has the highest percentage (42.56 %) of cyclones which last 2–days. And cluster 10 has the fewest cyclones (27.88 %) which last 2 to 4 days but the cluster has the most cyclones (13.75 %) which last over 10 days (Fig. 7c). Compared to Northern Hemispheric mid-latitude cyclones (Table 2 of Xia et al. 2013), it can be found that the mid-latitude cyclones of the SH have higher percentages of cyclones which last over 10 days. This is likely related to characteristics of land-sea distribution in the SH which is favorable for the development of cyclones and for sustainability because of the availability of heat

and moisture over the large ocean. Cluster 1 contains the highest percentage (11.57 %, relative to all its cyclones) of long-lived cyclones ( $\geq 10$  days) over the Indian Ocean (Table 2: numbers in brackets). Over the South Atlantic, the number of long-lived cyclones of cluster 6 (12.25 %) is larger than that of cluster 5 (7.39 %). For the South Pacific, cluster 10 has the highest percentage (16.64 %) of cyclones lasting more than 10 days.

Deepening rates present intensity changes of cyclones during their lifetime. Frequency distributions of deepening rates for all clusters were studied. The mean deepening rate is calculated along the track from genesis location to the maximum pressure value and the maximum deepening rate is the largest pressure fall during this part of the track. The mean deepening rates per 12 h of the ten clusters for the whole time period (year 1000–1990) are listed in Table 3 and normalized ones across different clusters are given in brackets. In contrast to the cyclones of the NH which are more differentiated (Table 4 of Xia et al. 2013), the distributions of the mean deepening rates are quite uniform and similar for all clusters in the SH. The highest percentages for average deepening rates are between 2 to 4 hPa/12 h for

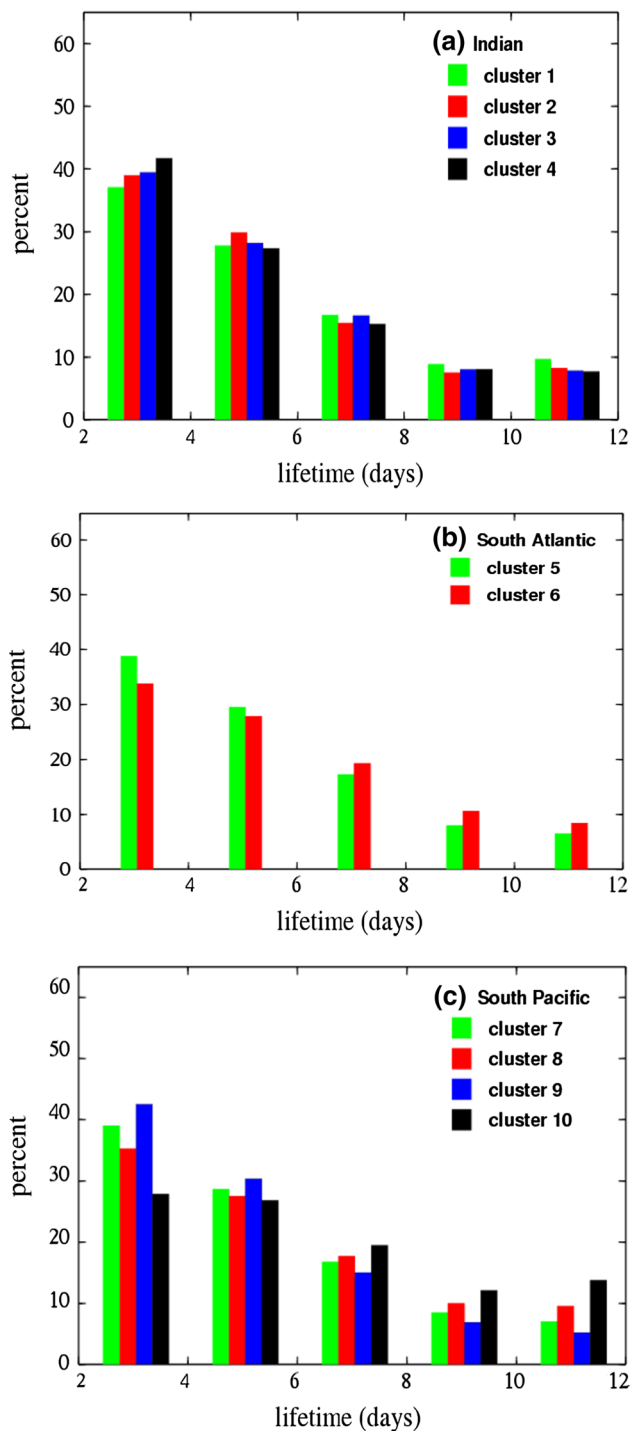


**Table 2** Lifespan (day) distribution rates (numbers in bold) of the ten clusters for the quasi-millennial time period (years 1000–1990); numbers in brackets are normalized between different clusters for each distribution (Unit: %)

| Lifetime (days) | [2, 4)                  | [4, 6)                  | [6, 8)                  | [8, 10)                 | ≥10                     |
|-----------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|
| Cluster 1       | <b>37.06</b><br>(10.22) | <b>27.77</b><br>(10.05) | <b>16.70</b><br>(9.99)  | <b>8.84</b><br>(10.06)  | <b>9.63</b><br>(11.57)  |
| Cluster 2       | <b>38.98</b><br>(9.87)  | <b>29.86</b><br>(9.92)  | <b>15.41</b><br>(8.46)  | <b>7.50</b><br>(7.83)   | <b>8.25</b><br>(9.11)   |
| Cluster 3       | <b>39.42</b><br>(9.51)  | <b>28.19</b><br>(8.93)  | <b>16.61</b><br>(8.69)  | <b>8.01</b><br>(7.97)   | <b>7.77</b><br>(8.17)   |
| Cluster 4       | <b>41.73</b><br>(11.26) | <b>27.33</b><br>(9.68)  | <b>15.25</b><br>(8.93)  | <b>8.05</b><br>(8.97)   | <b>7.64</b><br>(8.99)   |
| Cluster 5       | <b>38.79</b><br>(10.17) | <b>29.49</b><br>(10.15) | <b>17.29</b><br>(9.84)  | <b>7.95</b><br>(8.60)   | <b>6.47</b><br>(7.39)   |
| Cluster 6       | <b>33.80</b><br>(11.28) | <b>27.85</b><br>(12.20) | <b>19.32</b><br>(13.99) | <b>10.61</b><br>(14.61) | <b>8.42</b><br>(12.25)  |
| Cluster 7       | <b>39.06</b><br>(12.05) | <b>28.64</b><br>(11.60) | <b>16.77</b><br>(11.23) | <b>8.48</b><br>(10.80)  | <b>7.05</b><br>(9.48)   |
| Cluster 8       | <b>35.28</b><br>(10.69) | <b>27.54</b><br>(10.95) | <b>17.70</b><br>(11.64) | <b>9.96</b><br>(12.45)  | <b>9.52</b><br>(12.57)  |
| Cluster 9       | <b>42.56</b><br>(7.20)  | <b>30.35</b><br>(6.74)  | <b>15.00</b><br>(5.51)  | <b>6.89</b><br>(4.81)   | <b>5.21</b><br>(3.84)   |
| Cluster 10      | <b>27.88</b><br>(7.74)  | <b>26.81</b><br>(9.77)  | <b>19.45</b><br>(11.72) | <b>12.11</b><br>(13.88) | <b>13.75</b><br>(16.64) |

all clusters (Table 3 and Fig. 8). The percentage of the average deepening rates over 10 hPa/12 h is the lowest for all clusters.

Table 4 and Fig. 9 give the distributions of maximum deepening rates per 12 h. The highest percentages of maximum deepening rates fall between 4 to 6 hPa/12 h for all clusters (Table 4 and Fig. 9). Over the Indian Ocean, cluster 3 has the highest maximum deepening rate (13.66 %) of more than 10 hPa/12 h (Table 4: numbers in brackets). Also, cyclones deepening rapidly (over 10 hPa/12 h) are found mostly over the western Indian Ocean in clusters 3 and 4 (Table 4). In the South Atlantic, cluster 6 of a rapid maximum deepening rate of more than 10 hPa/12 h (14.91 %) is larger than cluster 5 (10.92 %). For the South Pacific, cluster 7 contains the most cyclones (10.97 %) with a rapid maximum deepening rate of more than 10 hPa/12 h. Generally, maximum deepening rates of more than 10 hPa per 12 h occur more often over the Indian Ocean (38.66 %) than over the South Pacific (35.51 %). Over the South Atlantic cyclones with rapid maximum deepening rates over 10 hPa/12 h (25.83 %) are the least. However, the maximum deepening rates over 10 hPa/12 h in the Atlantic (clusters 5 and 6) and Pacific (clusters 7, 8, 9 and 10) of the SH (Table 4) are smaller than the counterparts of the NH (Table 4 of Xia et al. 2013: clusters 4, 5 and 6 for the Pacific, clusters 8, 9 and 10 for the Atlantic).



**Fig. 7** Distributions (%) of cyclone lifetime (days) for winter cyclones over the Indian Ocean (a), the South Atlantic (b) and the South Pacific (c) for the whole time period (year 1000–1990)

The changes of the maximum deepening rates for the Indian Ocean, the South Atlantic, and the Pacific during different centuries were also considered. Here, only the results of typical clusters over three basins are shown (Fig. 10). For instance, for cluster 1, maximum deepening

**Table 3** Mean deepening rate (hPa/12 h) distributions (numbers in bold) of the ten clusters for the quasi-millennial time period (years 1000–1990); numbers in brackets are normalized between different clusters for each distribution (Unit: %)

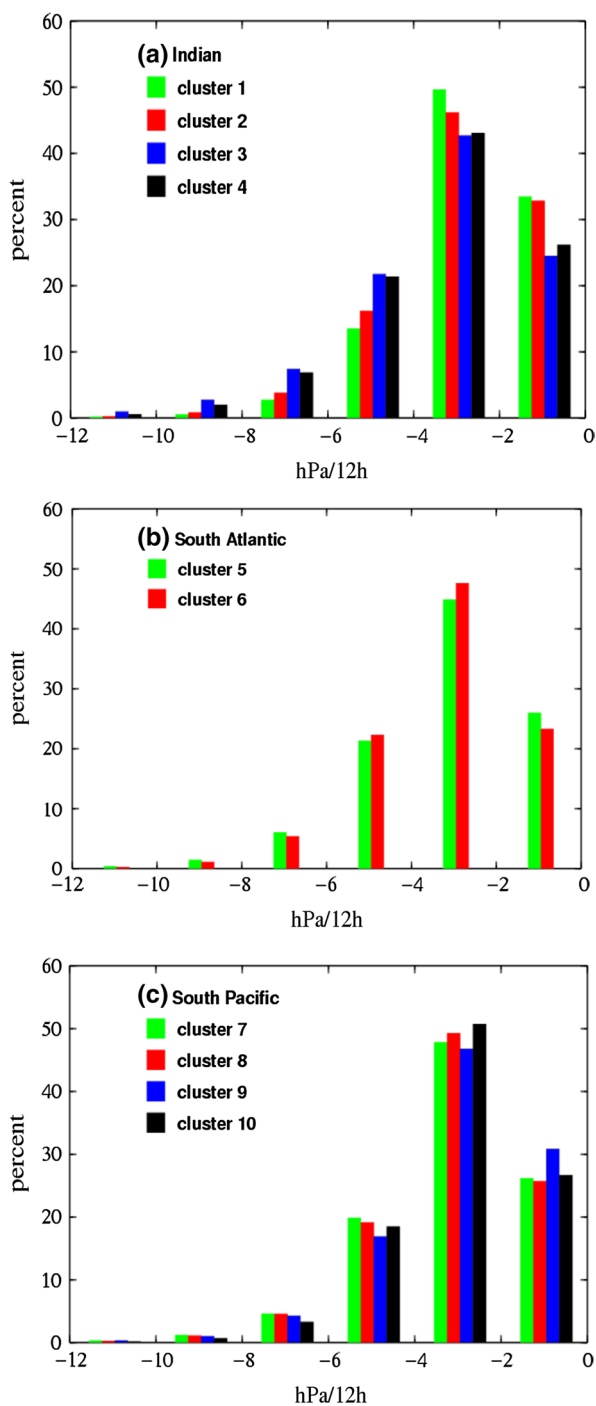
| Mean deepening rates (hPa/12 h) | <−10                   | [−10, −8)              | [−8, −6)               | [−6, −4)                | [−4, −2)                | [−2, 0)                 |
|---------------------------------|------------------------|------------------------|------------------------|-------------------------|-------------------------|-------------------------|
| Cluster 1                       | <b>0.14</b><br>(4.02)  | <b>0.53</b><br>(4.31)  | <b>2.72</b><br>(5.59)  | <b>13.50</b><br>(7.10)  | <b>49.66</b><br>(10.70) | <b>33.44</b><br>(12.39) |
| Cluster 2                       | <b>0.26</b><br>(6.70)  | <b>0.82</b><br>(6.11)  | <b>3.77</b><br>(7.13)  | <b>16.18</b><br>(7.80)  | <b>46.17</b><br>(9.11)  | <b>32.80</b><br>(11.21) |
| Cluster 3                       | <b>0.96</b><br>(24.29) | <b>2.73</b><br>(19.55) | <b>7.41</b><br>(13.59) | <b>21.73</b><br>(10.16) | <b>42.66</b><br>(8.17)  | <b>24.51</b><br>(8.08)  |
| Cluster 4                       | <b>0.54</b><br>(15.41) | <b>1.99</b><br>(15.95) | <b>6.85</b><br>(14.01) | <b>21.35</b><br>(11.09) | <b>43.08</b><br>(9.16)  | <b>26.18</b><br>(9.60)  |
| Cluster 5                       | <b>0.39</b><br>(10.72) | <b>1.44</b><br>(11.17) | <b>6.04</b><br>(12.05) | <b>21.33</b><br>(10.77) | <b>44.83</b><br>(9.27)  | <b>25.97</b><br>(9.24)  |
| Cluster 6                       | <b>0.27</b><br>(9.38)  | <b>1.11</b><br>(11.17) | <b>5.41</b><br>(13.88) | <b>22.31</b><br>(14.52) | <b>47.63</b><br>(12.69) | <b>23.27</b><br>(10.69) |
| Cluster 7                       | <b>0.33</b><br>(10.72) | <b>1.21</b><br>(11.12) | <b>4.62</b><br>(10.81) | <b>19.86</b><br>(11.83) | <b>47.80</b><br>(11.65) | <b>26.18</b><br>(10.99) |
| Cluster 8                       | <b>0.28</b><br>(8.71)  | <b>1.08</b><br>(9.70)  | <b>4.57</b><br>(10.50) | <b>19.14</b><br>(11.21) | <b>49.24</b><br>(11.79) | <b>25.70</b><br>(10.60) |
| Cluster 9                       | <b>0.29</b><br>(5.53)  | <b>1.01</b><br>(5.06)  | <b>4.26</b><br>(5.46)  | <b>16.88</b><br>(5.50)  | <b>46.74</b><br>(6.19)  | <b>30.82</b><br>(6.97)  |
| Cluster 10                      | <b>0.15</b><br>(4.52)  | <b>0.71</b><br>(5.87)  | <b>3.27</b><br>(6.99)  | <b>18.48</b><br>(10.03) | <b>50.73</b><br>(11.27) | <b>26.67</b><br>(10.22) |

**Table 4** Maximum deepening rate (hPa/12 h) distributions (numbers in bold) of the ten clusters for the quasi-millennial time period (years 1000–1990); numbers in brackets are normalized between different clusters for each distribution (Unit: %)

| Maximum deepening rates (hPa/12 h) | <−10                    | [−10, −8)               | [−8, −6)                | [−6, −4)                | [−4, −2)                | [−2, 0)                 |
|------------------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|-------------------------|
| Cluster 1                          | <b>4.39</b><br>(5.73)   | <b>8.30</b><br>(7.20)   | <b>18.04</b><br>(8.87)  | <b>28.20</b><br>(11.03) | <b>26.39</b><br>(12.24) | <b>14.70</b><br>(12.02) |
| Cluster 2                          | <b>4.81</b><br>(5.71)   | <b>9.19</b><br>(7.30)   | <b>18.95</b><br>(8.55)  | <b>26.44</b><br>(9.47)  | <b>25.56</b><br>(10.92) | <b>15.07</b><br>(11.38) |
| Cluster 3                          | <b>11.81</b><br>(13.66) | <b>13.31</b><br>(10.27) | <b>20.91</b><br>(9.15)  | <b>23.71</b><br>(8.24)  | <b>18.98</b><br>(7.84)  | <b>11.28</b><br>(8.21)  |
| Cluster 4                          | <b>10.52</b><br>(13.56) | <b>12.95</b><br>(11.10) | <b>20.54</b><br>(9.99)  | <b>22.83</b><br>(8.81)  | <b>20.45</b><br>(9.37)  | <b>12.72</b><br>(10.31) |
| Cluster 5                          | <b>8.69</b><br>(10.92)  | <b>12.79</b><br>(10.66) | <b>20.56</b><br>(9.71)  | <b>24.31</b><br>(9.13)  | <b>21.41</b><br>(9.55)  | <b>12.24</b><br>(9.61)  |
| Cluster 6                          | <b>9.23</b><br>(14.91)  | <b>13.77</b><br>(14.81) | <b>22.19</b><br>(13.50) | <b>25.33</b><br>(12.25) | <b>19.49</b><br>(11.22) | <b>9.99</b><br>(10.13)  |
| Cluster 7                          | <b>7.44</b><br>(10.97)  | <b>11.70</b><br>(11.47) | <b>20.91</b><br>(11.66) | <b>26.34</b><br>(11.66) | <b>21.65</b><br>(11.38) | <b>11.97</b><br>(11.08) |
| Cluster 8                          | <b>7.29</b><br>(10.58)  | <b>12.29</b><br>(11.87) | <b>21.50</b><br>(11.77) | <b>26.45</b><br>(11.50) | <b>20.49</b><br>(10.57) | <b>11.99</b><br>(10.91) |
| Cluster 9                          | <b>5.86</b><br>(4.79)   | <b>9.36</b><br>(5.04)   | <b>18.50</b><br>(5.63)  | <b>27.27</b><br>(6.55)  | <b>24.48</b><br>(6.92)  | <b>14.53</b><br>(7.28)  |
| Cluster 10                         | <b>6.80</b><br>(9.17)   | <b>11.47</b><br>(10.28) | <b>22.05</b><br>(11.18) | <b>28.18</b><br>(11.36) | <b>20.82</b><br>(9.99)  | <b>10.68</b><br>(9.06)  |

rates larger than 10 hPa per 12 h became more frequent in the eleventh, fourteenth and twentieth century, but less frequent in the twelfth, seventeenth and eighteenth century. For cluster 1 in the twentieth century the maximum deepening rates of 0–4 hPa per 12 h and larger than 8 hPa per 12 h became more frequent, but those of 4–6 hPa per 12 h became less frequent. For cluster 6 over the South

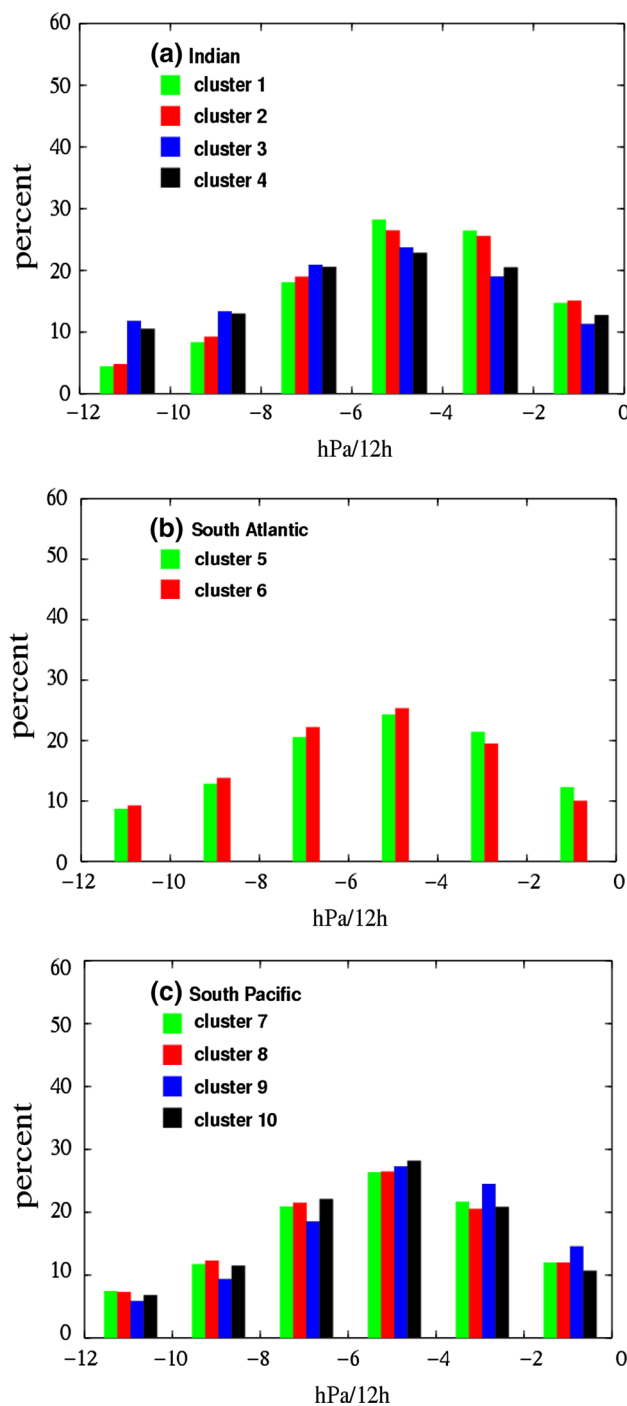
Atlantic, the maximum deepening rates of 2–4 hPa per 12 h decrease while those larger than 10 hPa per 12 h increase in the twentieth century. For cluster 10 relatively slowly deepening cyclones (0–4 hPa/12 h) appear more often in the twentieth century, however those deepening relatively fast (>4 hPa/12 h) appear less often (Fig. 10). It is very important to notice that in the twentieth century all clusters



**Fig. 8** Distributions (%) of cyclone mean deepening rates (hPa/12 h) for winter cyclones over the Indian Ocean (a), the South Atlantic (b) and the South Pacific (c) for the whole time period (year 1000–1990)

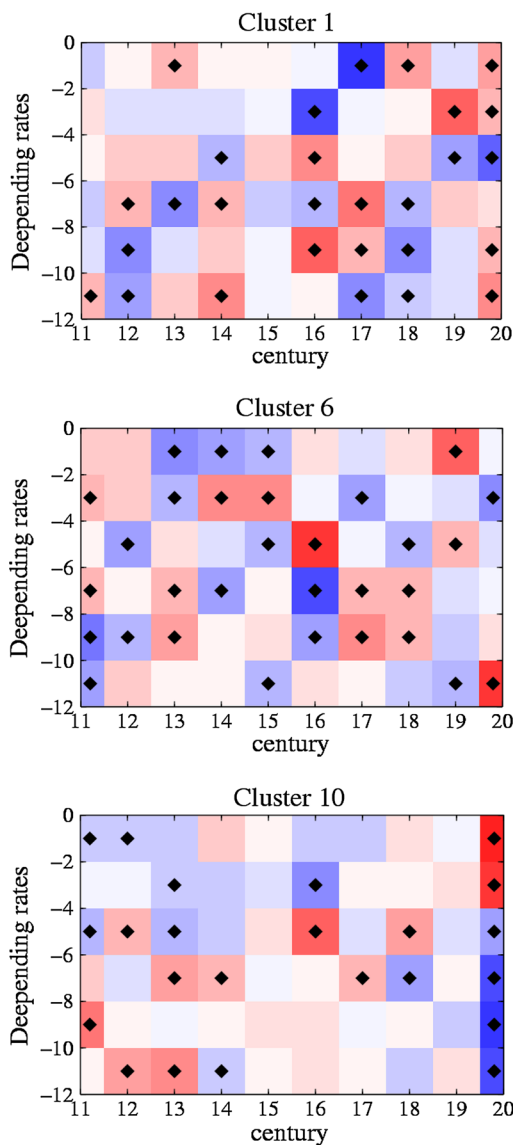
except for cluster 10 show increasing frequencies of rapidly deepening cyclones (over 10 hPa/12 h) although some clusters are not significant (not shown).

Figure 11 gives the changes of lifetime distributions during different centuries for cluster 1 (over the Indian Ocean),



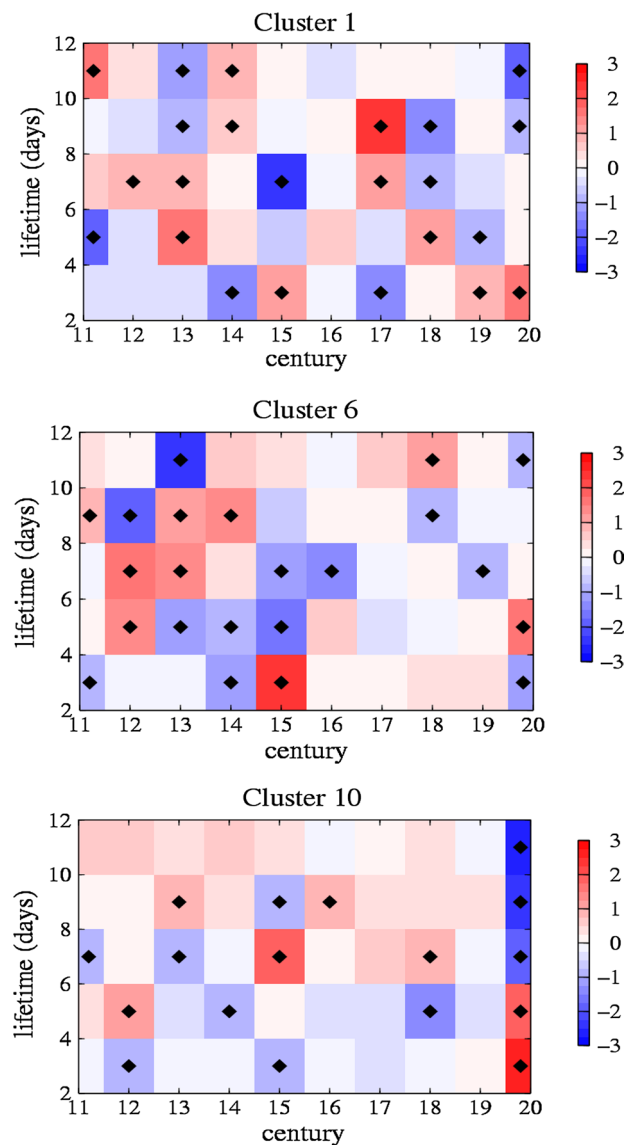
**Fig. 9** Distributions (%) of cyclone maximum deepening rates (hPa/12 h) for winter cyclones over the Indian Ocean (a), the South Atlantic (b) and the South Pacific (c) for the whole time period (year 1000–1990)

cluster 6 (over the South Atlantic) and cluster 10 (over the South Pacific). Cyclones lasting longer than 10 days are more frequent in the eleventh and fourteenth century for clusters 1 (Fig. 11). In the South Atlantic, the frequencies of cyclones with long lifespan (over 10 days) increase



**Fig. 10** Normalized anomalies of the cyclone maximum deepening rates (hPa/12 h) distributions for cluster members over the Indian Ocean (cluster 1), the South Atlantic (cluster 6) and the South Pacific (cluster 10) across different centuries (eleventh–twentieth century): the diamond symbol indicates that the anomaly is significant according to a *t* test at the 95 % level

notably in the fourteenth century for cluster 5 and in the eighteenth century for cluster 6. It is found that in the twentieth century there are tendencies of decreases in the frequency of long lifespan cyclones (over 10 days) for most clusters and these are significant for clusters 1, 6 and 10 (Fig. 11). However, it is noteworthy that in the twentieth century there are significant increases in the frequency of long lifespan cyclones ( $\geq 8$  days) for cluster 9 (not shown) in the South Pacific.

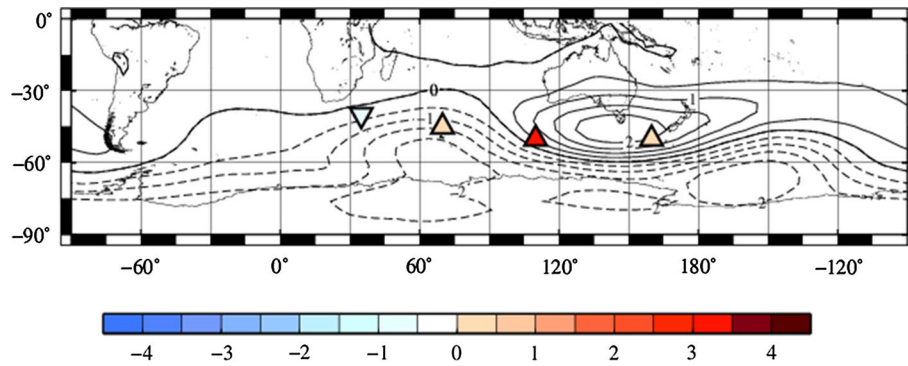


**Fig. 11** Normalized anomalies of the cyclone lifetime (days) distributions for cluster members over the Indian Ocean (cluster 1), the South Atlantic (cluster 6) and the South Pacific (cluster 10) across different centuries (eleventh–twentieth century): the diamond symbol indicates that the anomaly is significant according to a *t* test at the 95 % level

### 3.3 Links to large-scale pressure patterns

Storm activity in the SH is strongly related to climate variability. In this study, we investigate how seasonal (JJA) mean MSLP patterns are associated with the annual variability of winter cyclone numbers using the Canonical Correlation Analysis (CCA) (von Storch and Zwiers 1999). The systematic association of winter MSLP fields and winter

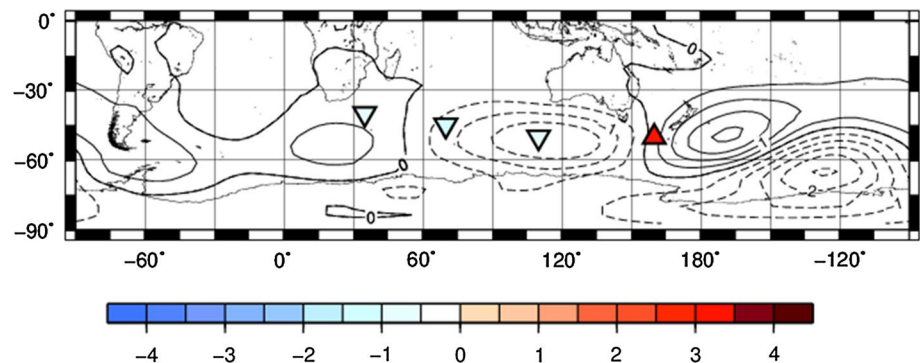




**Fig. 12** Corresponding correlation patterns between time series of winter (JJA) cyclone numbers in the Indian Ocean (cluster 1, 2, 3 and 4) (symbols represent the mean centroid position of each cluster over the whole period: triangles for positive values, inverted triangles for negative values) and mean sea level pressure fields in hPa (iso-

lines: dashed for negative and solid for positive; contour interval is 0.5 hPa). The first CCA pair shares a correlation coefficient of 0.42 and represents 25 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are 0.45 for cluster 1, 3.41 for cluster 2, 0.25 for cluster 3, but  $-1.14$  for cluster 4

**Fig. 13** Same as Fig. 12 for the second CCA pair: it shares a correlation coefficient of 0.33 and represents 25 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are 3.27 for cluster 1, but  $-0.73$  for cluster 2,  $-1.31$  for cluster 3,  $-0.62$  for cluster 4



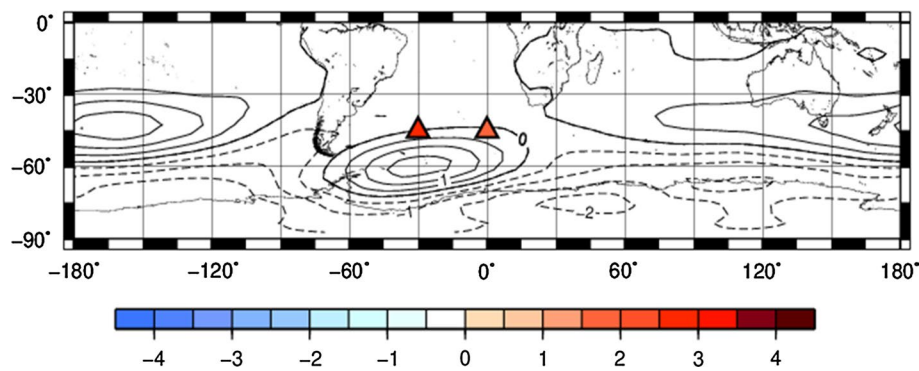
cyclone numbers are determined separately of the clusters over the Indian Ocean, the South Atlantic and Pacific. In preparation for the CCA, the high-dimensional MSLP fields are truncated to the first thirteen Empirical Orthogonal Functions (EOFs) (von Storch and Zwiers 1999). All analyses are based on anomalies of the quasi-millennium (year 1000–1990) mean.

Figures 12 and 13 give the two most important related patterns linking MSLP and cyclone number anomalies in the *Indian Ocean*. The coefficient time series of the first (second) CCA pattern have a correlation of 0.42 (0.33) and the pattern describes 25 % (25 %) of the variance of winter cyclone numbers over the Indian Ocean.

In the first Indian Ocean pattern (Fig. 12) negative pressures anomalies over Antarctica and the vicinity go along with positive pressure anomalies at mid-latitudes. When the CCA time coefficient of the cyclone count is 1, Antarctica and mid-latitudes with a pressure contrast of about 4 hPa, then the number of cyclones in cluster 1 increases by 0.45, in cluster 2 by 3.41 and in cluster 3 by 0.25, but decreases by  $-1.14$  in cluster 4. Thus, when the CCA pattern has a positive coefficient, cyclone numbers in the eastern and

middle Indian Ocean (clusters 1, 2 and 3) increase whereas cyclone counts in the western Indian Ocean (cluster 4) decrease. This pattern seems to be related to the Antarctic Oscillation (AAO) which is associated with the location and intensity of the polar jet stream and influences cyclone activity of the SH (Fischer-Bruns et al. 2005; Mendes et al. 2010).

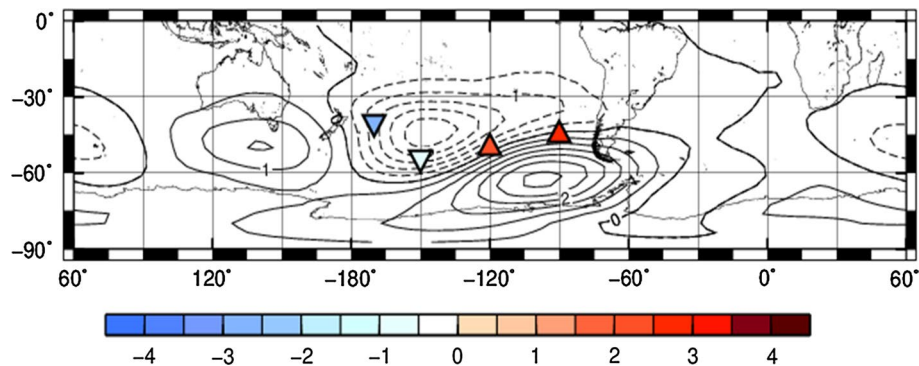
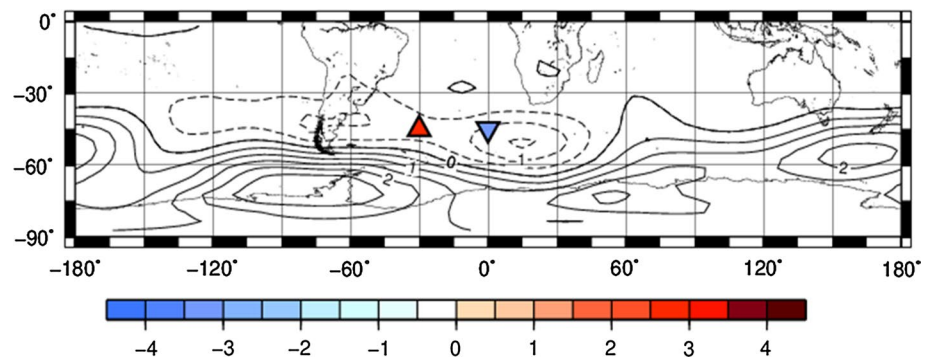
The second Indian Ocean pattern (Fig. 13) describes negative pressure anomaly centers located in the southwest of Australia and in the high-latitudes of the South Pacific while large positive pressure anomaly areas propagate from the South Atlantic to the South Pacific. This relates to the strong increase of cyclone numbers in the eastern Indian Ocean (cluster 1) but decreases in the middle and western Indian Ocean (clusters 2, 3 and 4). According to Ashok et al. (2007), the Indian Ocean Dipole (IOD) phenomenon can remotely influence winter storm track activity over the SH mid-latitude regions. It seems that this pattern is linked to a negative IOD event with increases of storm track activity over South Australia and portions of New Zealand (cluster 1). This is consistent with the results of Ashok et al. (2007) that during a positive (negative)



**Fig. 14** Corresponding correlation patterns between time series of winter (JJA) cyclone numbers in the South Atlantic (cluster 5 and 6) (symbols represent the mean centroid position of each cluster over the whole period: *triangles* for positive values, *inverted triangles* for negative values) and mean sea level pressure fields in hPa (iso-

lines: *dashed* for negative and *solid* for positive; contour interval is 0.5 hPa). The first CCA pair shares a correlation coefficient of 0.29 and represents 42 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are 1.91 for cluster 5 and 2.91 for cluster 6

**Fig. 15** Same as Fig. 14 for the second CCA pair: it shares a correlation coefficient of 0.17 and represents 58 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are  $-3.14$  for cluster 5, but  $2.58$  for cluster 6



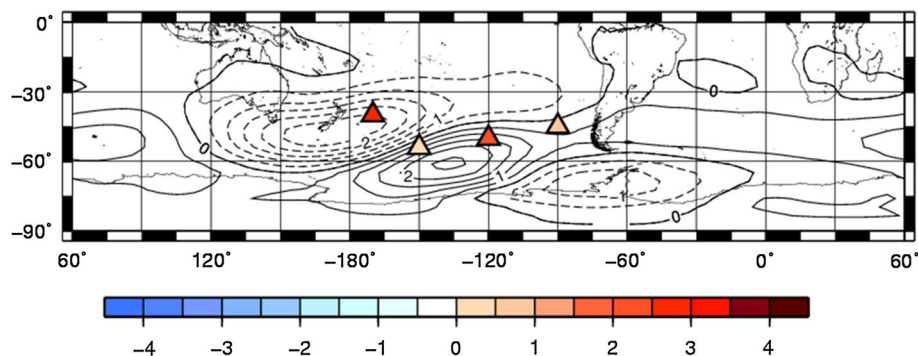
**Fig. 16** Corresponding correlation patterns between time series of winter (JJA) cyclone numbers in the South Pacific (cluster 7, 8, 9 and 10) (symbols represent the mean centroid position of each cluster over the whole period: *triangles* for positive values, *inverted triangles* for negative values) and mean sea level pressure fields in hPa (iso-

lines: *dashed* for negative and *solid* for positive; contour interval is 0.5 hPa). The first CCA pair shares a correlation coefficient of 0.44 and represents 31 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are 2.70 for cluster 7, 2.17 for cluster 8,  $-0.55$  for cluster 9 and  $-2.64$  for cluster 10

IOD event, the westerlies and storm track activity weaken (enhance) and therefore lead to a significant deficit (surplus) in winter precipitation over the Australia-New Zealand region.

Figures 14 and 15 are the first and second CCA patterns for clusters 5 and 6 over the *South Atlantic*. The first pattern has a correlation of only 0.33 for the coefficient time series and the second pattern shares a correlation of 0.29. They

**Fig. 17** Same as Fig. 16 for the second CCA pair: it shares a correlation coefficient of 0.42 and represents 19 % of the variance of winter cyclone numbers from year 1000 to 1990. Cyclone frequency anomalies are 0.73 for cluster 7, 2.01 for cluster 8, 0.24 for cluster 9, and 2.76 for cluster 10



present about 42 and 58 %, respectively, of the variance of year-to-year winter cyclone numbers.

The first South Atlantic pattern (Fig. 14) goes with large negative anomalies around the high latitudes of the SH and positive anomalies over the mid-latitude areas which is related to the positive AAO. When the CCA time coefficient of cyclone count is 1, the cyclone numbers in the South Atlantic increase by 1.91 for the eastern cluster 5 and 2.91 for the western cluster 6. This agrees with Mendes et al. (2010) that AAO could influence the cyclone density of the South American–Southern ocean sector. The second South Atlantic pattern (Fig. 15) has large positive values over the high latitudes while negative values occur over the South Atlantic and parts of the Pacific. It relates to a decrease of cyclone numbers for cluster 5 by  $-3.14$ , but an increase for cluster 6 by 2.58.

Figure 16 is the first CCA pattern for clusters 7, 8, 9 and 10 over the *South Pacific*. It presents 31 % of the variance for the year-to-year winter cyclone numbers of the Southern Pacific and has a correlation of 0.44 for the coefficient time series. It shows a pattern with positive MSLP anomalies located in the South of Australia and over the Bellingshausen Sea while negative anomalies prevail over the central South Pacific. This pattern is related to increases of cyclone numbers over the eastern South Pacific (by 2.70 for cluster 7 and 2.17 for cluster 8), but decreases of cyclone numbers over the western South Pacific (by  $-0.55$  for cluster 9 and  $-2.64$  for cluster 10). It can be seen that the pattern seems to be related to the central Pacific El Niño-like pattern which is very similar to the results presented by Goodwin et al. (2014; Fig. 1b).

Figure 17 is the second CCA pattern over the *South Pacific*. This pattern has a correlation of 0.42 for the coefficient time series and presents 19 % of the variance for the year-to-year winter cyclone numbers of the Southern Pacific. We can see that there are positive pressure anomalies over the eastern South Pacific, but negative anomalies over the western South Pacific. This may be related to the cool phase of ENSO (i.e. La Niña) and there are higher cyclone numbers over the South Pacific especially for cluster 8 (by 2.01) and cluster 10 (by 2.76). It is also worthy to

note that the Pacific Decadal Oscillation (PDO), which is related to AAO and ENSO, could influence the SH cyclone activities including numbers, latitudinal position and intensity. For example, Pezza et al. (2007) found that El Niño (La Niña) type condition usually occurs during the positive (negative) phase of the PDO. And the negative phase of the PDO is associated with more but less intense cyclones while the positive phase of the PDO is associated with fewer but more intense cyclones for the mid-high latitudes (Pezza et al. 2007).

## 4 Conclusions and discussions

A global climate model (ECHO-G) simulation for approximately the last one thousand years was used to investigate the changes of winter extratropical cyclone activity for the SH. The ECHO-G model was driven by the historical forcing of realistic variations of shortwave solar input, time-dependent presence of volcanic material in the upper atmosphere, and slowly changing greenhouse gas concentrations during the last millennium (years 1000–1990). A tracking algorithm developed by Hodges (1994, 1995, 1999) was applied to track extratropical cyclones within the simulated MSLP fields. The main result of this study is that the time series of the SH cyclone counts for years 1000–1990 show strong year-to-year variations, but no obvious trend. The centennial variability of storm tracks is small. This result is quite similar to the one for the NH found before with the same ECHO-G simulation (Xia et al. 2013).

Cyclone tracks are clustered into ten groups using the K-means method. There are four clusters over the Indian Ocean, two clusters over the South Atlantic and four clusters over the South Pacific. Cyclone numbers of the South Pacific are the highest while the lowest ones are over the South Atlantic. The mean track positions of each cluster are also compared between the first century (the eleventh century) and the last century (the twentieth century). In the twentieth century, the track positions over the Indian Ocean (clusters 1, 2, and 3) and near New Zealand (cluster 10) shift poleward while cluster 9 over the South Pacific

shifts equatorward. This is quite different from Northern Hemispheric cyclone positions which change only marginally (Xia et al. 2013). There are small variations on centennial time scales for most clusters. It should be noticed that cyclone numbers in clusters 9 and 10 over the eastern Pacific increase clearly in the twentieth century.

Compared to the Northern Hemispheric mid-latitude cyclones (Xia et al. 2013), the Southern Hemispherical cyclones have higher percentage of long lifespan (last over 10 days). In the twentieth century frequencies of cyclones lasting more than 10 days decrease for most clusters except for clusters 4 and 9. The highest percentage of average deepening rates for the Southern Hemispherical cyclones is between 2 to 4 hPa/12 h for all clusters. The percentage of maximum deepening rates over 10 hPa/12 h over the oceans of the SH are smaller than the oceanic counterparts of the NH. It is noteworthy that in the twentieth century frequencies of rapidly deepening cyclones (maximum deepening rates over 10 hPa/12 h) increase for all clusters of the SH except for cluster 10.

Fischer-Bruns et al. (2005) pointed out that the storm activity in the SH is closely related to the Antarctic Oscillation (AAO) and the pattern of AAO elongates with the CO<sub>2</sub> increase. In our study, the positive AAO pattern is correlated with increased cyclone frequency in the eastern Indian Ocean, the South Atlantic and the eastern South Pacific which agrees with Mendes et al. (2010) and Eichler and Gottschalck (2013). The study of Fischer-Bruns et al. (2005) also shows that the AAO index is highly associated with the storm shift index. Abram et al. (2014) found that the long-term mean of the SAM (AAO) index is now at the highest positive value for the past 1000 years which results in a poleward shift of the regions with high storm frequency for the SH. Besides, cyclone frequency over the Indian Ocean and the South Pacific are connected with the Indian Ocean Dipole (IOD) and ENSO. El Niño (La Niña) events associated with negative (positive) SAM states influence storm tracks and westerlies which are confirmed by instrumental studies (Abram et al. 2014 and Goodwin et al. 2014).

There are a number of caveats of this study: First, the external forcing of ECHO-G may deviate from reality and the solar and volcanic forcing may be overestimated. But, even with larger variations of temperature, the centennial variations of SH storm track statistics are still small. Thus, the main conclusions will not be affected. However, Neukom et al. (2014) pointed out that climate models would overestimate the strength of external forcing but underestimate the role of internal ocean–atmosphere dynamics particularly in the SH, and tend to overemphasize Northern Hemisphere–Southern Hemisphere synchronicity. This may explain the similarity on variations of cyclones between the NH (Xia et al. 2013) and SH based on the same ECHO-G simulation.

And the deficiencies of the model lead to uncertainties in estimating and attributing cyclone variations. Secondly, there may be underestimations of cyclone tracks due to the coarse spatial resolution (T30) and relatively infrequent storing (every 12 h) of MSLP fields. This may lead to a reduced variability of storm activity. However, we argue that this would be stationary in time, so that the temporal variability would not be affected. Thirdly, this study is a result of just one single model. Their significance will be shown with other similar millennial simulations with better spatial and temporal resolution in the future. But all in all, these caveats must be addressed.

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