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Seasonal persistence and propagation of intraseasonal patterns over the Indian monsoon region.

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Seasonal persistence and propagation of intraseasonal patterns over the Indian monsoon region

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Abstract The space-time evolution of convection over the monsoon region containing the Indian subcontinent, the Indian Ocean and the West Pacific has been studied. A multi-channel singular spectrum analysis of the daily outgoing longwave radiation has yielded two intraseasonal oscillatory patterns and two large-scale standing patterns as the most dominant modes of intraseasonal variability. The oscillatory modes vary on time scales of about 45 and 28 days and their average cycles of variability are shown to correspond to the life cycles of active and break periods of monsoon rainfall over India. During an active (break) cycle, a convection (dry) anomaly zone first appears in the equatorial Indian Ocean, subsequently expands to cover the Indian subcontinent and finally contracts to disappear in the northern part of India. Some eastward and northward movements are found to be associated with both oscillatory modes, while westward movement may also be associated with the 28-day mode. The oscillatory modes are shown to have a large spatial scale extending to the West Pacific. One of the standing modes has anomalies of uniform sign covering the entire region and is related to El Niño and southern oscillation (ENSO) pattern. The other standing mode has a dipole structure in the equatorial Indian Ocean associated with large-scale anomalies over India with the

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V. Krishnamurthy · J. Shukla Department of Climate Dynamics, George Mason University, Fairfax, VA 22030, USA same sign as those over the western part of the dipole. These two standing modes persist throughout the monsoon season, each maintaining its respective pattern. The seasonal mean monsoon is mainly determined by the two standing patterns, without much contribution from the oscillatory modes. The relative role of the standing patterns (ENSO mode and dipole mode) seems to be important in determining the seasonal mean during certain years.

1 Introduction

The potential for long-term prediction of tropical climate was indicated by general circulation model (GCM) results which showed that a large part of the tropical variability is determined by slowly varying boundary conditions such as the sea surface temperature (SST), soil moisture and snow cover (Charney and Shukla 1981; Shukla 1998). A conceptual model of the intraseasonal variability of the monsoon as a combination of large-scale persistent seasonal mean component and a statistical average of intraseasonal variations was also suggested (Krishnamurthy and Shukla 2000). A proper understanding of the response due to slowly varying components of the system and the relative role of the intraseasonal fluctuations of the monsoon is essential for successful prediction of the seasonal mean monsoon.

The intraseasonal variability of the monsoon consists of active periods of high rainfall and break periods with weak or no rainfall during June–September (JJAS) (see reviews by Webster et al. 1998; Krishnamurthy and Kinter 2003). The temporal character of the monsoon within a season has been described in terms of intraseasonal "oscillations" with time scales in different ranges. Spectral peaks at 10–20 day were found in pressure and other data of one to three seasons

(Krishnamurti and Bhalme 1976) while longer surface pressure data indicated 10–20, 20–30 and 30–40 day variability (Krishnamurti and Ardanuy 1980). A 40–50 day spectral peak was found in rainfall over India (Hartmann and Michelsen 1989), and both 10–20 and 40–50 day periods were found in convection data (Yasunari 1979).

The dominant spatial structure of the active phase of the monsoon consists of above-normal rainfall over central India and the Western Ghats and below-normal rainfall in the sub-Himalayan region and over southeastern India (Krishnamurthy and Shukla 2000). The pattern is reversed with anomalies of opposite sign during the break phase. This picture is consistent with the movement of the monsoon trough that exists over India during the monsoon season (e.g. Ramamurthy 1969). The intraseasonal variability of the monsoon has been described by northward propagation of convection from the central equatorial Indian Ocean to the Indian subcontinent (Sikka and Gadgil 1980) and also accompanied by eastward propagation over the equatorial Indian Ocean (Lau and Chan 1986; Wang and Rui 1990; Lawrence and Webster 2002). Weak westward movement of convection toward the Indian continent has also been noted (Krishnamurti and Ardanuy 1980; Wang and Rui 1990; Annamalai and Slingo 2001). While studies have associated the movements of convection zones over to the Indian continent with the active and break phases of monsoon (e.g., Krishnan et al. 2000; Lawrence and Webster 2002; Annamalai and Slingo 2001; Annamalai and Sperber 2005), a space-time relation with the rainfall over India has not been elaborated. The association of propagation of convection with intraseasonal oscillations of different periods is often based on data pre-filtered to be in the desired frequency band.

Whether the variability of monsoon within a season shows a signal due the influence of slowly varying boundary forcings, as suggested by Charney and Shukla (1981), has not been addressed by most studies. Krishnamurthy and Shukla (2000) showed that the dominant mode of the seasonal mean rainfall is a large-scale pattern with anomalies of one sign over entire India persisting for the entire season and capturing the interannual variability of the seasonal mean rainfall. The seasonal mode is different from the dominant mode that explains the active and break variability. A recent study (Krishnamurthy and Shukla 2007) has provided a more detailed space-time description of rainfall over India and has shown that there are two distinct intraseasonal modes and distinct seasonally persisting components. These spatio-temporal patterns emerge as eigenmodes of multi-channel singular spectrum analysis (MSSA) of a 70-year long daily Indian rainfall record that was not subjected to any pre-filtering. The two nonperiodic oscillatory modes have periods centered at 45 and 20 days, and describe the development, maturation and demise of active and break phases during each cycle. The seasonal mean rainfall is mostly determined by the eigenmodes with standing patterns that persist with anomalies of same sign throughout most of the season.

Studies that have examined the relation between SST and atmospheric variables using band-pass filtered data have shown that air-sea interaction occurs in the 30-50 day scale (Krishnamurti et al. 1988) and coherent relations exist between convection and other variables with the SST (Hendon and Glick 1997; Woolnough et al. 2000). Air-sea interaction over the Indian Ocean is suggested to be important in the northward and eastward propagation (Kemball-Cook and Wang 2001). When band-pass filtered data are used, it is possible that both the intraseasonal and persisting components are present in the data. Model experiments have shown strong coupling between intraseasonal oscillations and SST in the Indian Ocean (Fu et al. 2003; Fu and Wang 2004). However, it has also been shown that the intraseasonal oscillation in observed OLR is not correlated with the seasonal SST anomalies (Lawrence and Webster 2001).

The need for a better understanding of the space-time structure of the intraseasonal variability of monsoon over the larger region consisting of the Indian subcontinent and the Indian Ocean is the motivation for this study. The main aim is to obtain the space-time character of the intraseasonal "oscillations" occurring at different time scales and to find large-scale patterns that persist with seasonal signature. The relative strengths of these different modes in determining the seasonal mean monsoon rainfall are also investigated. These objectives are achieved by analyzing daily OLR data over the Indian subcontinent and oceanic region containing the Indian Ocean and the West Pacific. Reliable daily rainfall data for this larger region are unavailable. The method of analysis (i.e., MSSA) is similar to that of the earlier study of rainfall over just the land points over India (Krishnamurthy and Shukla 2007). However, the results of this paper go beyond the earlier study by determining the evolution of the intraseasonal oscillations, their propagation characteristics over the oceanic region and the Indian subcontinent and establishing the relation to the active and break phases of the Indian monsoon. The data and methods of analysis are described in Sect. 2. In Sect. 3, the life cycles of convection corresponding to the active and break phases are shown. The results of MSSA of OLR over the larger monsoon region are discussed in Sect. 4. Summary and conclusions are given in Sect. 5.

2 Data and method of analysis

2.1 Data

The deep convection over the larger monsoon region is analyzed by using daily averages of observed OLR, obtained from the National Oceanic and Atmospheric Administration (NOAA), on a 2.5° longitude $\times 2.5^{\circ}$ latitude grid for the period 1975–2002. The study excludes 1978 for which data are unavailable because of satellite problems. To relate the analysis of convection to rainfall over India, a gridded dataset (Version 2) of daily rainfall over land points in India developed by the India Meteorological Department (IMD) is used. This rainfall dataset is on a 1° longitude \times 1° latitude grid and is based on observations at 2140 rain gauge stations for the period 1951–2004 (Rajeevan et al. 2005). Monthly mean SST data (HadISST 1.1 version) from the Hadley Centre for Climate Prediction and Research have also been used.

The daily climatology of each data set was calculated as the mean (for the length of the data set) of the total daily values for each calendar day. The daily anomalies are obtained by subtracting the climatology from the total field. The JJAS seasonal anomalies are the averages of the daily values over 1 June to 30 September. For a coherent analysis without the presence of very high frequency fluctuations, the daily data were converted to 5-day running means.

2.2 Multi-channel singular spectrum analysis

Multi-channel singular spectrum analysis (MSSA) has been used to obtain distinct intraseasonal space-time patterns of convection over the larger monsoon region that includes the Indian Ocean. This method extracts space-time structure of oscillatory modes and persisting modes and has been applied to study the intraseasonal variability (Plaut and Vautard 1994; Krishnamurthy and Shukla 2007). A review by Ghil et al. (2002) describes the mathematical formulation and the technique in detail.

In this study, the MSSA is applied to daily OLR anomalies following exactly the same procedure used for daily Indian rainfall anomalies by Krishnamurthy and Shukla (2007). MSSA is applied to data consisting of time series of L channels (or grid points) specified at N discrete times. The lag-covariance matrix of the multi-channel time series at temporal lags from 0 to M - 1 is diagonalized to obtain LM eigenvalues and LM eigenvectors. Each eigenvector, called the space-time empirical orthogonal function (ST-EOF), consists of M sequence of maps. The corresponding space-time principal component (ST-PC), of time length N' = N - M + 1, is the projection coefficient of the data onto the ST-EOF, and the eigenvalues determine the variance. The part of the original time series corresponding to a particular eigenmode is the reconstructed component (RC) which is constructed from the corresponding ST-EOF and ST-PC (Ghil et al. 2002). The RCs are maps on the same grid (or multi-channel) as the original field, and their time length and sequence are exactly those of the original time series. For a pair of eigenmodes identified as oscillatory, the amplitude A(t) and the phase angle $\theta(t)$ are determined from the corresponding RC. The RCs of nonoscillatory modes are examined for persisting behavior.

2.3 Wavenumber-frequency spectral analysis

The propagation characteristics of the RCs are further examined by space-time spectral analysis which can identify the spatial scales and the periods associated with propagating modes and also identify standing patterns. Although the MSSA provides detailed information about the space-time evolution, the wavenumber–frequency analysis is used as further evidence. The spectral analysis is applied separately to suitably averaged data in meridional and zonal extents. In this study, the wavenumbers refer to the meridional and zonal extent of the limited domain of the monsoon region over India and the Indian Ocean.

3 Active and break monsoon phases

The spatial structure of the OLR anomalies over the Indian subcontinent and the Indian Ocean during the active and break phases of the Indian monsoon rainfall is now described. The active and break periods identified in this study are based on the daily rainfall anomalies averaged over India, referred hereafter as the Indian monsoon rainfall (IMR) index. The active (break) phase is defined as the period when the daily IMR index is above (below) a threshold of one-half of the standard deviation of the IMR index for at least five consecutive days.

3.1 Composites of OLR anomalies

The daily OLR anomalies were averaged separately over all active and break days during JJAS 1975–2002 to construct the active and break composites. The composites for the region (40°E–100°E, 20°S–35°N) are shown in Fig. 1a. The active composite has strong convection over India and the adjoining oceanic region north of about 8°N while a moderate dry anomaly zone exists over the eastern equatorial Indian Ocean. The convection during the active period is intense over most of the Indian subcontinent and over the Arabian Sea and Bay of Bengal. The same pattern with opposite sign is seen during the break phase.

By using rainfall index over India (IMR index) to identify the active and break phases, the composites of OLR anomalies in Fig. 1a seem to have captured the wet and dry zones in appropriate locations. The importance of using the rainfall index is demonstrated by showing OLR composites based on other definitions of active and break phases. One such definition by Goswami and Ajaya Mohan (2001) is based on filtered 850 hPa zonal wind at the point (90°E, 15°N). The composites of daily OLR anomalies constructed using their active and break periods (dates provided by B. N. Goswami and R. S. Ajava Mohan, private communication) for 1978–1997 are shown in Fig. 1b. During the active phase, most of India is dry and convection is confined to the head of Bay of Bengal, near the location where the active/break index is defined. The positive anomalies over the Indian Ocean cover a much larger region including part of the Arabian Sea. The pattern is reversed with anomalies of opposite sign in the break composite (Fig. 1b). Another definition of active and break phases is based on the values of 850 hPa zonal wind and OLR in the region (65°E–95°E, 10°N–20°N) and 850 hPa meridional wind at (45°E, 0) (Webster et al. 1998). The composites of OLR anomalies constructed for 1980-1993 (using the dates from Table 7 of Webster et al. 1998) show a strong convection zone confined to the region (65°E-100°E, 5°N–20°N) during the active period (Fig. 1c). The region north of 20°N over India has almost no convection. The positive anomalies over the Indian Ocean are very weak and lie to the south of the equator. The pattern is somewhat reversed in the break composite (Fig. 1c). The composites in Fig. 1 show that the locations of wet and dry

zones depend on the location used in the definition of active and break phases.

3.2 Evolution of OLR anomalies during active and break phases

The evolution of convection over the Indian Ocean corresponding to the active and break life cycles of rainfall over India has not been shown in previous studies. The evolution of convection discussed by Krishnan et al. (2000) covers only the break period that is identified by the OLR and not by rainfall over India. Lagged composites (with lags in days) of daily OLR anomalies constructed with respect to the midpoint (lag 0) of active and break rainfall phases identified in this study for JJAS 1975-2002 are shown in Fig. 2. At lag -12 days, a convection zone appears in the Indian Ocean with two centers, one near the west coast of India and the other to the south of Bay of Bengal; while the northern Bay of Bengal and a large area of the Indian subcontinent are dry (Fig. 2a). During lags -10 to -6, the region of convection expands with increased strength and acquires a northwest-southeast orientation from equator to 25°N. The dry region over the northern Bay of Bengal diminishes and moves to the foothills of the Himalayas. The two centers of convection merge and

Fig. 1 Active (*left panels*) and break (*right panels*) phase composites of OLR (W m⁻²). The composites in **a** were constructed with the active and break dates, as defined in this study using the IMR index (rainfall anomalies area averaged over India), for JJAS 1975–2002. The composites in **b** and **c** are based on the definition of active and break days by Goswami and Ajaya Mohan (2001) and Webster et al. (1998), respectively



expand in all directions covering almost the entire Indian subcontinent, the Bay of Bengal and the Arabian Sea from lag -4 to lag 0. The southern edge of the convection area moves a few degrees north of the equator. A weak dry zone appears in the equatorial Indian Ocean at lag -4, and subsequently expands and intensifies. At lag 0, strong dry anomalies are located in the equatorial region at $80^{\circ}E-100^{\circ}E$. The convection anomalies over India weaken during lags +2 to +4 and move to the foothills of the Himalayas. By lag +4, the drier anomalies over the Indian Ocean have expanded in the meridional direction.

The lagged composites of OLR anomalies during the break phase show both structure and evolution similar to those during active phase except with opposite sign (Fig. 2b). The evolution of convection anomalies over India during the active and break periods has good correspondence with the lag composites of rainfall anomalies over India shown by Krishnamurthy and Shukla (2007).

The life cycles of OLR anomalies during active and break phases contain intraseasonal variations of different time ranges. The discussion in the next section will reveal such oscillations as well as large-scale modes that persist throughout the monsoon season.

4 MSSA of OLR anomalies

The space-time structure of the intraseasonal variability over the larger monsoon region was determined by applying MSSA to daily OLR anomalies in the region $(40^{\circ}\text{E}-160^{\circ}\text{E}, 20^{\circ}\text{S}-35^{\circ}\text{N})$ for the period JJAS 1975–2002 with a lag window of 61 days. Each ST-EOF consists of a sequence of 61 lagged maps and the corresponding ST-PC is 62 days long each year. Using the ST-EOF and ST-PC, the space-time RC, denoted by R(i) for eigenmode *i*, was computed for different eigenmodes. Each RC has exactly

Fig. 2 Lagged active **a** and break **b** phase composites of OLR (W m⁻²) for JJAS 1975– 2002. Lag (–) or lead (+) day is indicated at the top right corner of each panel. Lag 0 corresponds to the midpoint of each active phase



the same time-length and sequence as the original time series. This decomposition of the original time series in terms of RCs will help in understanding the space-time structure of each eigenmode.

4.1 Eigenmodes

The first 100 eigenvalues from the MSSA of daily OLR anomalies are plotted in Fig. 3a, as percentage fraction of the total variance. The first six eigenmodes, explaining about 16.2% of the variance, were found to be the most relevant to describe the dominant variability of the OLR anomalies. The consecutive eigenmodes with almost equal eigenvalues that satisfy the criteria to be oscillatory, as specified by Plaut and Vautard (1994), are the pairs (1,2)and (5,6). The eigenmodes 3 and 4 are non-oscillatory but are important components of the variability throughout the monsoon season. The power spectra of the six eigenmodes show that the pairs (1,2) and (5,6) have broad spectra centered around 45 and 28 days, respectively (Fig. 3b). The power spectrum of each mode was computed with the first spatial principal component (S-PC 1) of the mode's RC. For convenience, the pairs (1,2) and (5,6) will be referred to as 45 and 28-day oscillatory modes, respectively, although their spectra are broad. The spectra of eigenmodes 3 and 4 are red, indicating the possibility that they are persisting standing patterns.

4.2 Intraseasonal oscillatory modes

The RC of an oscillation is just the sum of the RCs of the individual eigenmodes of the pair. Denoting R(i) + R(j) =R(i, j), the RCs of 45 and 28-day oscillations are R(1,2) and R(5,6), respectively. The daily phase angle θ of the oscillations were computed from the RCs following the method used by Krishnamurthy and Shukla (2007). The two oscillations vary in a nonperiodic manner at the time scale indicated by their broad spectra shown in Fig. 3b. It is easy to follow the space-time structure of the oscillatory mode during an average period by constructing composites of R(1,2) and R(5,6) for chosen intervals of the phase of the respective mode. In a cycle of $(0, 2\pi)$, θ is divided into eight intervals in the range $(k-1)\pi/4 \le \theta(t) \le k\pi/4$ with k = 1, 2, ..., 8. By averaging the RC for all times during the phase k, the phase k composite is obtained for each oscillatory mode.

The composites of R(1,2) for eight phases of a cycle of (1,2) oscillatory mode are shown in Fig. 4. The average period of this cycle is 45 days. The composites of phases 1–4 are almost mirror images of those in phases 5–8. The composites reveal the development, maturity and demise of



Fig. 3 MSSA of OLR anomaly for JJAS 1975–2002: a Eigenvalue spectrum with the first 100 eigenvalues plotted as percentage of the total variance, and **b** power spectra of the S-PC 1 of first six RCs

active and break phases over India and show the associated convective activity over the larger monsoon region. The phase 1 composite shows a region of weak convection in the equatorial Indian Ocean while a dry region with strong anomalies stretches over the entire zonal extent of the domain in a northwest-southeast orientation to the north of 5°N. This phase with dry anomalies over India represents the peak of the break phase of the monsoon. The convection over the Indian Ocean intensifies and expands in all directions during phases 2 and 3 while the dry anomalies over India weaken and shrink in spatial extent covering only parts of northern India and the head of Bay of Bengal. A separate peak of convection appears near the west coast of India in phase 3. The dry anomalies over the western Pacific remain strong. In phase 4, convection further intensifies and stretches from 60° to 160°E in a northwestsoutheast direction. This band has peaks on either sides of the Indian peninsula, and its southern edge is above the equator to the west of 90°E. While the dry anomalies over the western Pacific have weakened during phase 4, a very weak dry zone appears along the equator to the east of African coast. Phase 5 shows a slight northward shift of the strong convection band covering most of India. The dry anomalies over the equatorial Indian Ocean have become moderate in intensity and cover an expanded region with peak values near 80°E. Phase 5 represents the peak of the active monsoon period over India. From phase 6 to 1, the

development of the break phase follows the same route as the development of the active phase but with anomalies of opposite sign. The composites of the 45-day oscillatory mode (1,2) clearly bring out the large-scale extent of the convection that could not seen in the total OLR anomalies in Fig. 2.

The composites of R(5,6) for the eight phases of the oscillation (5,6) shown in Fig. 5 also correspond to a cycle of active and break phases. The average period of this cycle is 28 days. However, there are some differences compared to the cycle of R(1,2) shown in Fig. 4 in terms of the intensity and the spatial extents of convection and dry areas. Phase 1 shows a quadrupole structure with R(5,6) anomalies of moderate intensity. The convection zone over the Indian Ocean intensifies and expands during phases 2 and 3 while dry anomalies over India diminish and shift northeastward. Most of the western Pacific is covered with

dry anomalies by phase 3. During phase 4, convection over the Indian Ocean weakens somewhat and shifts northward covering most of the Indian subcontinent along with the appearance of two peaks on either side of the Indian peninsula. A weak dry anomaly zone appears at the same time in the equatorial Indian Ocean near the African coast. The quadrupole structure is reestablished in phase 5 but with anomalies of opposite sign compared to phase 1. Thus the quadrupole structures of phase 1 and 5 correspond to the peak phases of break and active monsoon periods, respectively. The structure and evolution of R(5,6) during phase 6-1 corresponds to the establishment of the break monsoon phase over India. The quadrupole structure was also noted by Annamalai and Sperber (2005) in their 40day oscillation and in unfiltered data by Krishnan et al. (2000). The convection and dry anomalies of R(5,6) over India during the peak active and break phases (Fig. 5) are





Fig. 5 Phase composites of R(5,6) of the oscillatory mode (5,6) with an average period of about 28 days. Units are in W m⁻². The phase number is given at the top left corner of each panel



less intense than in the case of the 45-day oscillation with R(1,2) (Fig. 4). The 45 and the 28-day modes are part of the total OLR anomalies; and their combination, including the possible interaction between them, should account for the active and break life cycles shown in Fig. 2. An examination of the daily variability during all the years reveals that the active/break variation of the total rainfall anomaly is accounted for by the two oscillatory modes (figure not shown). For example, the well-known long break during 2002 is captured by the variation of the 45day mode. The two oscillatory modes found in this study are nonlinear and are obtained in a data-adaptive manner. They capture "ghost limit cycles" (see Ghil et al. 2002) which may arise due to dynamical instabilities of the system. The oscillations in the 40-day range discussed by Annamalai and Slingo (2001) and Annamalai and Sperber (2005) are not nonlinear and were obtained with a preassumption that a 40-day periodic oscillation exists.

The space-time structure of the two oscillatory modes of the OLR anomalies are now shown to be related to the actual daily rainfall anomalies over the Indian subcontinent. With the IMD rainfall data, the phase composites of daily total rainfall anomalies for the eight phases of OLR R(1,2) and R(5,6) oscillatory cycles were constructed, as shown in Fig. 6. The space-time structures of the rainfall composites in Fig. 6a, b show good agreement with their counterparts of OLR RCs (Figs. 4, 5) in depicting the active and break cycles. The peaks of the active and break phases, the rain shadow region in southeastern India and the northern movement of the rainfall anomalies are all captured remarkably well. The rainfall anomalies are more intense during 45-day cycle (Fig. 6a) than during the **Fig. 6** Composites of rainfall over India for **a** eight phases of the OLR oscillation 1–2 with a period of about 45 days and **b** eight phases of the OLR oscillation 5–6 with a period of about 27 days. Units are in mm day⁻¹. The phase number is given at the *top left* corner of each panel



28-day cycle (Fig. 6b). The rainfall composites in Fig. 6 have good correspondence with similar composites of rainfall anomalies found in the MSSA of 70-year rainfall data by Krishnamurthy and Shukla (2007).

4.3 Eigenmodes with seasonally persisting signature

The eigenmodes 3 and 4 are non-oscillatory and can be best described by showing the dominant patterns of the daily RCs, R(3) and R(4) respectively. A new spatial EOF analysis of the RCs for 1975–2002 shows that EOF 1 of

R(3) and EOF 1 of R(4) explain about 91 and 90% of their respective variance. The spatial EOFs 1 of R(3) and R(4)reveal distinctly different patterns as seen in Fig. 7. The pattern of R(3) covers the entire domain with anomalies of same sign except for a small area in the equatorial West Pacific. The EOF of R(4) in Fig. 7 has a dipole pattern in the equatorial Indian Ocean. Also, strong anomalies, with the same sign as those in the western part of the dipole, exist in a zonal stretch covering most of India and the west Pacific north of 10°N. The dipole structure in OLR data has also been reported by Gadgil et al. (2004). However, the present study has shown that the dipole



Fig. 7 Spatial EOF 1 of daily R(3) (*top*) and R(4) (*bottom*) for JJAS 1975–2002. Units are arbitrary

structure is a distinct eigenmode of the daily variation of the OLR. The daily variation of these patterns was studied by examining the corresponding PC 1 for the entire period. Each PC 1 varies without any oscillatory behavior, often with the same sign, throughout most of the JJAS season. However, during any particular year, the PC of R(3) may or may not persist with the same sign as that of R(4) through the season. The relative role of the two modes becomes important in determining the seasonal mean. This point will be discussed later with examples during certain years.

To distinguish the characteristics of the oscillatory modes R(1,2) and R(5,6) and the non-oscillatory modes R(3) and R(4) with respect to the monsoon rainfall over India, the daily and seasonal composites were examined. Such an analysis will also indicate whether or not the oscillatory modes possess any seasonal signature. The active and break phase composites of daily values of the RCs were constructed for JJAS 1975–2002 using the earlier identification of active and break days based on the IMR index. The (active–break) difference composites of the RCs thus constructed are plotted in Fig. 8a. The (active–break) composites of daily R(1,2) and R(5,6) are similar to the patterns of these modes during the peak periods (phase 5–1) of phase composites of daily R(3) and R(4) in Fig. 8a

are similar to the dominant EOF patterns of R(3) and R(4) in Fig. 7. The magnitudes of R(1,2) and R(5,6) are about four times larger than those of R(3) and R(4), indicating the relative roles of the modes in the daily variability.

To study the seasonal mean features of the modes, JJAS seasonal means of the RCs were computed for each year. The composites of the seasonal mean RCs for strong and weak monsoon years were constructed. The strong (weak) monsoon year was selected by using the criterion that the JJAS seasonal IMR index was greater (less) than one positive (negative) standard deviation of IMR. The (strong-weak) difference composites of the seasonal mean RCs are shown in Fig. 8b. The seasonal composites of R(1,2) and R(5,6) in Fig. 8b show no resemblance to their respective daily composites in Fig. 8a, suggesting the absence of seasonal signature in these modes. The seasonal composites of R(3) and R(4) (Fig. 8b), however, have close spatial resemblance to their daily composites (Fig. 8a), strongly suggesting the presence of persisting signature throughout the monsoon season. The seasonal composites of R(3) and R(4) have much higher magnitude than those of R(1,2) and R(5,6) (note the differences in the scales shown in Fig. 8). The relative contributions of these different components in determining the seasonal mean monsoon will be discussed later.

4.4 Propagation characteristics

The propagation characteristics of the eigenmodes are further examined by wavenumber-frequency spectral analysis and Hovmoller diagrams of the RCs. The results of these analyses must be considered together with the phase composites given in Figs. 4 and 5. The wavenumber-frequency spectra were calculated for RCs averaged over (40°E-160°E) to obtain the features of north-south propagation in the domain (20°S-35°N). The east-west propagation features in the domain (40°E-160°E) are obtained from the spectra of RCs averaged over (20°S-35°N). The spectra are plotted in Fig. 9 where wavenumber 1 corresponds to the zonal or meridional extent of the region considered. The broad spectra of R(1,2) (Fig. 9a, b) show that the (1,2) mode is associated with northward and eastward movement with a period centered at 45 days. The spectra of R(5,6) (Fig. 9c, d) indicate northward movement as well as predominantly westward movement with a period centered at 28 days. The spectra of R(3) and R(4)(Fig. 9e-h) show that they correspond to standing patterns without oscillatory behavior.

The variations in propagation features can be better seen in the Hovmoller diagrams of the RCs. To show the average behavior for the entire 1975–2002 period, the phase of the oscillatory modes in a cycle is used as the Fig. 8 a Difference between active phase composite and break phase composite of daily OLR RCs and b difference between strong monsoon year composite and weak monsoon vear composite of seasonal mean OLR RCs. The definition of active and break phases are based on the daily rainfall over India and the definition of strong and monsoon are based on the seasonal rainfall over India. The components plotted are identified at the top right corner. Note the difference in scales. The scales for R(1.2) and R(5,6) are given by the top side bars and those for R(3) and R(4)are given by the bottom bars



time coordinate. The longitude-phase cross-sections of R(1,2) and R(5,6) averaged over the latitudinal belts (5°S–10°N) and (10°N–25°N) are plotted in Fig. 10. These diagrams show the propagation for an average cycle moving forward in time from phase $-\pi$ to $+\pi$. The (1,2) mode exhibits eastward propagation over the Indian Ocean and the West Pacific in the (5°S–10°N) belt whereas there are standing patterns separated at 100°E in the (10°N–25°N) belt. The (5,6) mode has a standing pattern to the west of 100°E and eastward movement to the east of 100°E in (5°S–10°N). In the (10°N–25°N) belt, there is a suggestion of weak eastward movement to the west of 100°E and westward propagation in the western Pacific for the (5,6) mode.

The northward or southward movement of the 45 and 28-day oscillatory modes are examined from the phaselatitude cross-sections of R(1,2) and R(5,6) averaged over $(60^{\circ}\text{E}-100^{\circ}\text{E})$ and $(100^{\circ}\text{E}-160^{\circ}\text{E})$ in Fig. 10. In the $(60^{\circ}\text{E}-100^{\circ}\text{E})$ belt that contains the Indian Ocean and the Indian subcontinent, both the oscillatory modes have southward movement to the south of the equator and northward movement to the north of the equator. In the western Pacific belt of $(100^{\circ}\text{E}-160^{\circ}\text{E})$, these modes show northward propagation from 10°S to 25°N . Although these diagrams may indicate clear propagation in certain directions, a complete picture involves considerable in-situ expansion or contraction.

4.5 Seasonal mean monsoon

The relative contribution of the oscillatory and the nonoscillatory modes in determining the seasonal mean monsoon over India is now discussed. The RCs are averaged over the land points in India exactly like the IMR index and their daily variations are examined in detail for two particular years, the weak monsoon year 1987 and strong monsoon year 1988 (Fig. 11). Throughout JJAS, R(1,2)and R(5,6) fluctuate with the time scale of about 45 and 28 days, respectively. While the number of cycles of fluctuations is the same for the 2 years for each mode, the amplitudes are larger during the weak year than those during the strong year. These fluctuations are not periodic and do not vary in a sinusoidal manner about zero. Therefore, the seasonal mean does not add up to zero. The more interesting behavior is seen in R(3) which has strong positive (negative) values throughout JJAS of 1987 (1988), clearly showing season-long persistent signature consistent with the seasonal mean character of the monsoon rainfall for the year. Somewhat similar behavior is also seen in

Fig. 9 Wavenumber–frequency spectra from latitude-time domain of a R(1,2), c R(5,6), e R(3) and g R(4) and from longitude-time domain of b R(1,2), d R(5,6), f R(3) and h R(4) for JJAS 1975–2002. The frequency scale is at *left* and the period scale at *right*. See text for the domains for which the spectra are computed



R(4) which has strong positive anomalies throughout 1987 but is close to zero without fluctuations during 1988.

The spatial structures of the JJAS seasonal means of the RCs for 1987 and 1988 are presented in Fig. 12. The magnitudes of R(1,2) and R(5,6) are about three times smaller than those of R(3) and R(4). The difference between the 2 years is reflected in a consistent manner for

R(1,2) and R(3). However, R(5,6) has higher than normal convection over India during 1988 but is not consistent with the weak year 1987. This situation is opposite for R(4) which shows a dry monsoon over India in 1987 and also weak dry anomalies during 1988. The seasonal mean monsoon may therefore depend on the relative strengths of these components.

Fig. 10 Cross-sections of phase composites of R(1,2) for a complete cycle of the oscillatory mode (1,2) ranging in phase $-\pi$ to $+\pi$ for the period 1975–2002 are shown in left panels. The composites were constructed at intervals of $\pi/12$. Longitudetime cross-sections of the RC shown in top two panels are averages over (5°S-10°N) and (10°N-25°N). Latitude-time cross-sections of the RCs averaged over (60°E-100°E) and (100°E-160°E) are shown in bottom two panels. Similar composites of R(5.6) for a cycle of the oscillatory mode (5,6) are shown in right panels. The domain of average is indicated at the top of each panel. Units are in W m⁻²



A quantitative understanding of the relative strengths of the different modes is obtained by examining the interannual variability for 1975-2002. The time series of all-India averages (like IMR index) of JJAS seasonal mean of RCs and total OLR anomalies are plotted in Fig. 13. These time series are also compared with the JJAS seasonal means of IMR index and NINO3.4 index (SST anomaly averaged over 170°W-120°W, 5°S-5°N). In Fig. 13a, it can be seen that the seasonal mean total OLR anomaly is in good correspondence with the IMR index except during 1975-1977 and 1998-2001. However, NINO3.4 shows even better correspondence with the total OLR anomaly (Fig. 13b). The oscillatory modes R(1,2) and R(5,6) in Fig. 13c show that the seasonal means are quite small for the entire period and that the interannual variability has no correspondence with other time series in Fig. 13a, b. In fact, their correlations with the time series in Fig. 13a, b are insignificant. The seasonal means of the persistent components R(3) and R(4) (Fig. 13c, d) have magnitudes comparable to that of the total OLR anomaly (Fig. 13a). R(3) has a correlation of 0.7 with the total OLR anomaly, a correlation of -0.45 with the IMR index and a correlation of 0.91 with NINO3.4 for 1979–2002. The difference in the correlation between OLR and that with IMR comes mainly from the disagreement between the rainfall index and OLR index during 1998–2001 (Fig. 13a), the same period during which the OLR anomaly has better correspondence with the NINO3.4 index (Fig. 13b). The correlation between R(4) and the total OLR anomaly is quite low (0.23) while R(3) + R(4) increases the correlation to 0.75. The relation between SST and atmospheric variables found in the intraseasonal time scales by Hendon



Fig. 11 Time series of daily R(1,2), R(5,6), R(3) and R(4) area averaged over India (as in IMR index). The time series are shown for JJAS of **a** weak monsoon year 1987 (*top*) and **b** strong monsoon year 1988 (*bottom*)

and Glick (1997) and by Woolnough et al. (2000) are based on band-pass filtered data and do not separate the persisting components and intraseasonal oscillations as done in this study.

Although the interannual variability of R(4) is not well correlated with the Indian monsoon, it plays a significant role during certain years (e.g., 1994). The relative values of the all-India averages of daily R(3) and R(4) throughout the JJAS season for all years were examined. The daily all-India averages of R(3) and R(4) are plotted in Fig. 14 for three each of weak, strong and normal monsoon years. R(3)has seasonally persistent variation consistent with all the weak years (Fig. 14a) and for most of the strong years except 1994 (Fig. 14c). For normal years, R(3) is persistent with strong anomalies of same sign throughout the season and reflects the variation of NINO3.4 (Fig. 14e). The variation of R(4) during weak and strong years (Fig. 14b, d) is not consistent with the variations of the total OLR anomaly except for 1987 (weak) and 1994 (strong). During normal years, R(4) varies as R(3) during 1999 but with opposite anomalies during other years (Fig. 14f). During the severe drought year of 2002, the persistent drought condition is reflected by R(3) (Fig. 14a) but not by R(4) (Fig. 14b). Although there was a long break during 2002, which was

Fig. 12 JJAS seasonal means of OLR RCs for **a** weak monsoon year 1987 (*left panels*) and **b** strong monsoon year 1988 (*right panels*). Units are in W m⁻². The RC plotted in each panel is identified at the *top right corner*. Note the difference in scales. The scales for R(1,2)and R(5,6) are given by the *top side bars* and those for R(3) and R(4) are given by the *bottom bars*

(a) Weak Monsoon 1987 JJAS Seasonal Anomaly







Fig. 13 Time series of JJAS seasonal means of **a**, **b** total OLR anomaly, c R(1,2), R(5,6), and **d** (R(3) and R(4) area averaged over India (IMR region). The time series of JJAS seasonal IMR index a and NINO3.4 index b are also plotted. The indices and variables plotted are identified at the top of each panel. The IMR index is plotted with opposite sign for easy comparison with the OLR index. The scales for the OLR anomalies are given at left. The scales for IMR index and NINO3.4 index are given at right in standard deviation units



captured by R(1,2), the seasonal mean of R(3) is still several times greater than that of either R(1,2) or R(5,6).

5 Summary and conclusions

Daily observed OLR data were analyzed to understand the intraseasonal space-time structure of convection over the monsoon region that includes the Indian subcontinent and the Indian Ocean. The main results of this study show that there are two dominant intraseasonal oscillatory modes and two seasonally persisting large-scale standing patterns over the larger Indian monsoon region. A direct relation between convection variability over the larger monsoon region and the rainfall over India was also established. The oscillatory modes explain the active and break cycles of the monsoon. The seasonal mean monsoon is determined mainly by the two persisting standing patterns, one with the ENSO signature and the other with a dipole pattern over the Indian Ocean.

The two oscillatory modes have broad spectral peaks centered at 45 and 28 days. During a cycle of these

nonlinear oscillations, both modes reveal the development, maturity and demise of active and break monsoon phases. These OLR oscillatory modes show good correspondence with the rainfall patterns over India in depicting the active and break phases. The 45-day OLR mode is more intense than the 28-day mode. In both the modes, when there is convection over the Indian subcontinent, the equatorial Indian Ocean is dry, and vice versa. The spatial scale of the oscillatory modes extends to the western Pacific with some differences between the two modes. During the peak of the active (break) monsoon period over India, the convection (dry) anomalies of the 45-day mode have a zonal extent ranging 60°E-160°E while the 28-day mode exhibits a quadrupole structure with convection (dry) anomalies over India. The two oscillatory modes with different time scales combine together, perhaps in a nonlinear manner, to determine the space-time evolution of the intraseasonal variability over the larger monsoon region.

In both the oscillatory modes, after a weak convection or dry anomaly zone appears in the equatorial Indian Ocean, it intensifies and expands in both zonal and meridional Fig. 14 Daily time series of R(3) (*left panels*) and R(4) (*right panels*) area averaged over the IMR region for JJAS. *Top panels* (**a**, **b**) show the time series for three weak monsoon years and the *middle panels* (**c**, **d**) show three strong monsoon years. *Bottom panels* (**e**, **f**) show 3 years in 1990s when the rainfall over India is normal. The years are indicated in each panel



directions covering a large part of the Indian subcontinent also. Later this convection or dry zone contracts over India with the southern edge moving north. The 45-day mode shows both eastward and northward movement in $(0^{\circ}N-10^{\circ}N)$ and only northward movement north of $10^{\circ}N$. The 28-day mode has only northward movement over the Indian Ocean and the Indian subcontinent, whereas over the West Pacific, the northward movement is also associated with westward propagation. These propagation characteristics must be interpreted carefully after taking into consideration the in-situ expansion and contraction of convection or dry anomalies.

The oscillatory modes fluctuate about the two standing modes that persist with the same pattern throughout the monsoon season. One of these modes (mode 3) covers the entire region with anomalies of same sign except for a small region in the western Pacific. The spatial structure of mode 3 is related to ENSO and the correlation with NINO3.4 index is very high. The other seasonally persisting standing pattern (mode 4) has a dipole pattern over the Indian Ocean along with anomalies over the entire zonal extent north of 10°N with the same sign as those over the western part of the dipole. The strength of the JJAS seasonal mean OLR anomalies is mainly determined by the two persisting standing patterns (modes 3 and 4) while the contribution from the oscillatory modes is small. The interannual variability of the seasonal mean of total OLR anomaly is best correlated with the ENSO mode.

The persisting ENSO mode and the dipole mode vary mostly with the same sign throughout the monsoon season. The seasonal mean monsoon rainfall over India is strongly related to the ENSO mode most of the years. Although the interannual variability of the dipole mode is not well correlated with the seasonal mean rainfall over India, it plays a crucial role during certain years, such as 1994 and 1997. Although 1997 was a very strong El Niño year, the Indian rainfall was normal. This observation was generally interpreted as a breakdown of the ENSO-monsoon relation. However, this study has shown that the ENSO-related convection mode was still stronger with positive anomalies throughout 1997 but was offset by the dipole mode which persisted with negative anomalies. The most notable result of the MSSA is to distinguish these different modes and point to a possible connection to the oceanic variability.

The results of this study further confirm the hypothesis by Charney and Shukla (1981) that there is potential longterm predictability of monsoon because of the response due to slowly varying boundary forcings. The role of the intraseasonal oscillatory modes cannot be ignored. During the years when the combined effect of seasonally persisting components is relatively weak, the role of oscillatory modes may become important in determining the seasonal mean monsoon. While the indication of the relation between the persisting standing patterns and the oceanic variability is strong, the influence of ocean on the intraseasonal modes also needs investigation. Since the atmospheric dipole mode that emerged in this study is strong during JJAS, it remains to be seen if it is related to the development of the SST dipole in the Indian Ocean that is prominent during the subsequent season. A thorough analysis of the relation between the SST and the OLR modes will be presented in another paper.

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