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Connection between Barents Sea Ice in May and Early Summer Monsoon Rainfall in the South China Sea and Its Possible Mechanism

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Abstract: The impacts of Arctic sea ice on climate in middle and high latitudes have been extensively studied. However, its effects on climate in low latitudes, particularly on summer monsoon rainfall in the South China Sea (SCS), have received limited attention. Thus, this study investigates the connection between the Arctic sea ice concentration (SIC) anomaly and the early summer monsoon rainfall (ESMR) in the SCS and its underlying physical mechanism. The results reveal a significant positive correlation between the Barents Sea (BS) SIC in May and the ESMR in the SCS. When there is more (less) SIC in the Barents Sea (BS) during May, this results in a positive (negative) anomaly of the local turbulent heat flux, which lasts until June. This, in turn, excites an upward (downward) air motion anomaly in the vicinity of the BS, causing a corresponding downward (upward) motion anomaly over the Black Sea. Consequently, this triggers a wave train similar to the Eurasian (SEU) teleconnection, propagating eastward towards East Asia. The SEU further leads to an (a) upward (downward) motion anomaly and weakens (strengthens) the western Pacific subtropical high (WPSH) over the SCS, which is accompanied by a southwest adequate (scarce) water vapor anomaly transporting from the Indian Ocean, resulting in more (less) precipitation in the SCS. Furthermore, the response of ESMR in the SCS to the SIC in the BS is further verified by using the Community Atmosphere Model version 5.3 (CAM5.3). This study introduces novel precursor factors that influence the South China Sea summer monsoon (SCSSM), presenting a new insight for climate prediction in this region, which holds significant implications.

Keywords: Arctic sea ice; South China Sea summer monsoon; rainfall; teleconnection; CAM5.3

1. Introduction

Under the background of enhanced global warming, Arctic surface air temperature has a significant warming trend that is twice that of the global average [1,2]. Correspondingly, Arctic sea ice has changed dramatically, experiencing a trend from flat to abrupt [3]. The IPCC Sixth Report (AR6) notes that in the context of global warming, Arctic sea ice in the late 20th century experienced a sharp decadal-scale melting, which could lead to an ice-free period in the summer of the mid-21st century in the Arctic [4]. Dramatic changes in sea ice can lead to significant repercussions, including the extinction of rare species, the disruption of ecosystems, and the exertion of severe impacts on the climate in various regions across the globe.

Many studies have demonstrated that the anomalies of Arctic sea ice have notable impacts on the climate and weather in the mid-high latitudes of Eurasia, e.g., Eurasian atmospheric circulation, spring snowfall in Eurasia, precipitation in East Asia, extreme



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Copyright: © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). low-temperature events, and rainfall events in China [2,5–9]. Arctic sea ice is closely linked to the East Asian monsoon; for example, a decrease in winter sea ice in the Davis Strait or an increase in sea ice in the Bering Strait could lead to a weaker East Asian winter monsoon (EAWM) [10,11]. Yang et al. [12] conducted numerical experiments and discovered that an abundance of sea ice in the Greenland Sea–Barents Sea region of the Arctic triggers intensified circulation of the East Asian monsoon. Conversely, excessive sea ice in the East Siberian Sea–Beaufort Sea area weakens East Asian monsoon circulation and heightened monsoon activity over the Indian Peninsula. Zhao et al. [13] and Guo et al. [14] conducted research dedicated to investigating the East Asian summer monsoon (EASM). Specifically, they explored the impact of the spring Arctic sea ice concentration (SIC) on the EASM, highlighting the role of European land and anomalous North Pacific Sea surface temperature (SST) as connecting factors. Their work served as a source of inspiration for our study.

Recently, a study has reported that the impact of Arctic sea ice changes also reaches the tropics, which has attracted widespread attention [15]. Although a considerable number of studies have revealed the impact of Arctic sea ice on the weather and climate in mid-high latitudes, only a few studies have identified connections between the Arctic and the tropics: the El Niño-Southern Oscillation (ENSO), the location of the intertropical convergence zone, and the frequency of tropical cyclones in the northwest Pacific Ocean may have a close relation with Arctic sea ice [16–18]. Furthermore, regarding the monsoon in the tropics, Chatterjee et al. [19] noted that the abnormal meridional circulation induced by Arctic sea ice affects the blocking pattern in northwestern Eurasia, thereby exerting an ultimate impact on the extreme precipitation of the Indian summer monsoon. This impact is manifested through its influence on East Asia's subtropical high and high-altitude and low-altitude configuration.

The South China Sea summer monsoon (SCSSM) is a crucial element of the EASM. Its onset serves as a signal for the shift in atmospheric circulation from winter to summer patterns, marking the commencement of the EASM and the start of the rainy season in China [20–23]. Hu et al. [24] indicated that ENSO, which is considered the most important influencing factor, has weakened its relationship with SCSSM in recent decades. Thus, more attention should be paid to the relationship between extratropical factors and SCSSM. Hu et al. [23] mentioned that Arctic oscillation (AO) in March contributed to a warm sea surface by forming a low-level cyclone anomaly over the northwest Pacific Ocean, and the cyclonic anomaly sustained throughout the whole spring and moved towards the equator, favoring the conditions for the onset of SCSSM. However, the relationship between Arctic sea ice and the SCSSM is still not fully understood.

Overall, previous studies have predominantly approached the response of the weather and climate in middle and high latitudes to Arctic sea ice anomalies, while there is a scarcity of studies examining the response in the tropics and the possible physical mechanisms, particularly concerning the relationship between Arctic sea ice and the SCSSM, which remains unclear. Hence, it is essential to establish a connection between the Arctic and the tropics. In the present study, we find a significant correlation between the May SIC in the Barents Sea (BS) and the following early summer monsoon rainfall (ESMR) in the South China Sea (SCS). This finding implies that the May SIC in the BS may serve as a potential prediction source of the ESMR in the SCS. Meanwhile, the mechanism between them will also be examined. The remainder of this paper is structured as follows: Section 2 introduces the data, methods, and numerical model. Section 3 focuses on the influence of sea ice on ESMR in the SCS. The linkage between sea ice in the BS and ESMR in the SCS is discussed in Section 3.1. Section 3.2 shows the mechanisms of how sea ice anomalies in BS influence the ESMR in the SCS. The numerical simulation results are given in Section 3.3. Finally, the summary and discussion are presented in Section 4.

2. Materials and Methods

2.1. Data

The monthly reanalysis datasets used in this study are from the National Centers for Environmental Prediction–National Center for Atmospheric Research (NCEP–NCAR), with a horizontal resolution of $2.5^{\circ} \times 2.5^{\circ}$ and 17 vertical layers extending from 1000 to 10 hPa [25] for seven parameters, namely, geopotential height (GPH), zonal (U) and meridional (V) winds, vertical velocity (Omega), specific humidity (q), latent heat net flux, and sensible heat net flux. Monthly SIC data are from the Met Office Hadley Centre, with a horizontal resolution of $1.0^{\circ} \times 1.0^{\circ}$ [26]. Monthly precipitation data are from the Center for Climate Prediction (CPC) Merged Analysis of Precipitation (CMAP) data, with a horizontal resolution of $2.5^{\circ} \times 2.5^{\circ}$ [27]. This global monthly precipitation dataset, established by CPC, integrates diverse sources of precipitation data such as ground rainfall observations, satellite-based precipitation measurements, and NCEP–NCAR reanalysis data. Encompassing a comprehensive global coverage, this dataset exhibits enhanced quality compared to individual data sources. All datasets span from 1979 to 2023.

2.2. Definition of the SCSSM Index

Various definitions of the SCSSM index have been proposed, including the wind field, the average wind field between the high (200 hPa) and low (850 hPa) levels, convection, outgoing long-wave radiation (OLR), divergence difference between high (200 hPa) and low (850 hPa) levels, and the combined definition of these meteorological elements [22,28–30]. Each method of definition has its drawbacks, leading to discrepancies in the results. Due to its location in the tropics, it is widely accepted that all summer monsoon precipitation within the tropical monsoon area is regarded as monsoon precipitation. Parthasarathy et al. [31] used the amount of summer rainfall to define the intensity of the Indian summer monsoon. Based on previous studies [32,33] and monitoring by the National Climate Center of China Meteorological Administration, the average onset time of the SCSSM is around the fourth pentad of May, the standardized series of total precipitation in June in the South China Sea ($105^{\circ}-122^{\circ}$ E, $5^{\circ}-22^{\circ}$ N) is used as the early summer monsoon rainfall index of the South China Sea ($ESMR_{SCS}$) in this study.

2.3. Plumb's Wave Activity Flux

Wave activity flux (WAF) proposed by Plumb [34] is used to detect the propagation of Rossby waves. Based on the method, we calculated the two-dimensional Plumb's WAF. The WAF formula is as follows:

$$F_{s} = \frac{P}{P_{0}} \cos \varphi \times \begin{pmatrix} v'^{2} - \frac{1}{2\Omega \operatorname{asin} 2\varphi} \frac{\partial(v'\phi')}{\partial \lambda} \\ -u'v' + \frac{1}{2\Omega \operatorname{asin} 2\varphi} \frac{\partial(u'\phi')}{\partial \lambda} \end{pmatrix}$$
(1)

where F_s denotes the horizontal stationary WAF (m²s⁻²). *P* is the pressure, P_0 is the baseline pressure (1000 hPa), and (φ , λ) represents (latitude, longitude). (a, Ω) indicate the radius of the Earth and the Coriolis parameter, respectively. The variables marked with a superscript of "1" represent zonal deviation, which means u' and v' are the zonal deviation of zonal wind and meridional wind, respectively, while ϕ' is the zonal deviation of GPH.

2.4. Vertical Integral of Water Vapour Flux

According to Ding et al. [35], the formula for calculating the vertical integral of water vapor flux is as follows:

$$Q = \int_{P2}^{P1} \frac{Vq}{g} dp \tag{2}$$

Vector *Q* can be decomposed into latitudinal water vapor transport component Q_{λ} and meridional water vapor transport component Q_{ψ} :

$$Q_{\lambda} = \int_{P2}^{P1} \frac{uq}{g} dp \ Q_{\psi} = \int_{P2}^{P1} \frac{vq}{g} dp \tag{3}$$

where (φ , λ) represents (latitude, longitude), and (u, v) are the latitudinal and meridional winds, respectively. *P*2 symbolizes the surface air pressure at 1000 hPa while *P*1 is set as 300 hPa. Additionally, g denotes gravitational acceleration, and q represents the specific humidity of each atmospheric layer.

2.5. Composite Analysis and Student's t-Test

In this paper, the composite analysis is computed by subtracting the year of abnormally negative sea ice (NSIC) from the year of positive sea ice (PSIC) years. The significance tests have been conducted on the results of both composite and regression analyses. The calculation formula is as follows:

$$t = \frac{\overline{X}_1 - \overline{X}_2}{\sqrt{\frac{(n_1 - 1)s_1^2 + (n_2 - 1)s_2^2}{n_1 + n_2 - 2}} + \left(\frac{1}{n_1} + \frac{1}{n_2}\right)}$$
(4)

Among them, \overline{X}_1 , \overline{X}_2 , s_1^2 , s_2^2 , n_1 , n_2 represent the mean, variance, and sample size of two samples, respectively. The aforementioned formula follows a t-distribution with $n_1 + n_2 - 2$ degrees of freedom, for the confidence level α ; if $|t| \ge t_{\alpha}$, it can be inferred that there exists a statistically significant disparity in the mean values between the two populations [36].

2.6. Numerical Model

To verify the possible physical mechanism of SIC changes influencing the SCSSM obtained from the observed analysis, this study utilizes the Community Atmosphere Model version 5.3 (CAM5.3) within the Community Earth System Model (CESM) [37], which was developed and released by the NCAR in 2012. This flexible model not only functions independently but also allows coupling with various components, including the ocean, land, and sea ice. Compared with previous versions, CAM5.3 incorporates a refined physical parameterization scheme characterized by a novel shallow convection approach that enhances the precision of convective precipitation representation [38]. Numerous studies demonstrate the robust suitability of CAM for regional climate studies for Eurasia [39,40]. The finite-volume dynamical core configured with a horizontal resolution of 1.9° latitude $\times 2.5^{\circ}$ longitude (f19_f19), and 30 vertical hybrid levels are selected. More details about the model can be found in the research conducted by Neale et al. [37].

3. Results

3.1. Relationship between Arctic Sea Ice and the ESMR_{SCS}

Firstly, the Empirical Orthogonal Function (EOF) analysis used here is to capture the primary spatiotemporal variations of ESMR_{SCS} (Figure 1). The first mode of EOF (EOF1) is significantly separated and accounts for 37.63% of the total variance, which passes the North test [41]. EOF1 reflects the primary variation characteristics of ESMR_{SCS}, exhibiting a spatial distribution pattern that is relatively uniform across the SCS (Figure 1a). The corresponding principal component (PC1) shows a substantial interannual variation of ESMR_{SCS} (Figure 1b).



Figure 1. The (**a**) spatial distribution and (**b**) principal component of the leading EOF mode for ESMR_{SCS}.

To investigate the relationship between the ESMR_{SCS} and Arctic sea ice, Figure 2a shows the regression of the ESMR_{SCS} onto the Arctic SIC in May from 1979 to 2023. The existence of a notable correlation between ESMR_{SCS} and Arctic SIC in May, preceding the monsoon onset, is particularly evident in the Barents Sea (BS) region. On this basis, calculate the correlation coefficients between SIC in the BS from July of the previous year to June of the current year and ESMR_{SCS}, respectively (Figure omitted). The result reveals that the correlation coefficient between the anomaly of May SIC_{BS} (the Sea ice concentration in Barents Sea) and the ESMR_{SCS} has reached a value of 0.34, which is significant at the 95% confidence level (Figure 2b). Consequently, this study specifically selects the May SIC in the BS region (66° – 75° N, 35° – 55° E) as the key region to investigate the influence on the ESMR_{SCS}.



(a) Reg Arctic sea ice on ESMR_{SCS}

Figure 2. (a) Regression of the May Arctic SIC (shadings; %) onto the ESMR_{SCS} (Dotted areas are significant at 90% confidence level; The red box denotes the BS region: $66^{\circ}-75^{\circ}$ N, $35^{\circ}-55^{\circ}$ E); (b) time series of ESMR_{SCS} (blue line) and SIC_{BS} (red line).

The correlation analysis results indicate that more SIC_{BS} in May is associated with increased ESMR_{SCS} and vice versa. Six years of positive SIC_{BS} (PSIC, greater than 1 standard deviation of the normalized SIC_{BS} in Figure 1b) including 1979, 1981, 1985, 1987, 1998, and 1999, and eight years of negative SIC (NSIC, lower than -1 standard deviation of the normalized SIC_{BS} in Figure 1b) including 1989, 1990, 1992, 1995, 1996, 2020, 2022, and 2023 are selected to further investigate composite analysis. Figure 3 shows the differences in the atmospheric circulation over the SCS between PSIC and NSIC years. The presence of cyclones signifies local convergence, and the coexistence of low-level and high-level convergence creates favorable conditions for precipitation. The noticeable anomalies in wind divergence (convergence) at 200 hPa (Figure 3a) and a (an) cyclonic (anticyclone) anomaly at 850 hPa over the region (Figure 3b) are concurrently accompanied by a substantial upward (downward) motion of air throughout the troposphere over the SCS (Figure 3c) during abnormally positive (negative) SIC_{BS} years. Many studies found that the western Pacific subtropical high (WPSH) was closely related to the monsoon activities and corresponding precipitation change in East Asia [42–44]. Figure 3b shows the positions of the WPSH characteristic lines 5880 gpm for the PSIC years, climate state, and NSIC years, respectively. In comparison to the climatology of the WPSH, the WPSH in the NSIC years is located westward towards the SCS, whereas it is located eastward during the PSIC years. This finding is consistent with the results of Yu et al. [45], which demonstrated that the SCSSM was weaker (stronger) during the western (eastern) years of the WPSH. With respect to the climatology, there are two notable water vapor transport channels for the SCS, with one from the Bay of Bengal region of the Indian Ocean in the southwest and another from the northwest Pacific region (Figure 4a). The water vapor transporting from the Indian Ocean is especially pronounced when the SIC_{BS} exhibits positive anomalies (Figure 4b). Such atmospheric circulation anomalies provide favorable conditions for more rainfall in June in the SCS.



Figure 3. The differences of velocity potential (shadings; $10^6 \text{ m}^2 \text{s}^{-1}$) and divergence wind (vectors; ms^{-1}) at 200 hPa (**a**), GPH (shadings; gpm) and horizontal winds (vectors; ms^{-1}) at 850 hPa (**b**), and isobaric vertical velocity (Pa s⁻¹, negative values indicate upward air movement and positive values indicate downward air movement) averaged over 100° – 130° E (**c**) between PSIC and NSIC years. The lines in (**b**) represent the PSIC (red line), climatology (black line), and NSIC (blue line) years WPSH characteristic line of 5880 gpm, respectively. The isobaric vertical velocity is scaled by 1000. Dotted areas are significant at the 90% confidence level.

3.2. Possible Mechanism of SIC_{BS} in May Affecting the ESMR_{SCS}

Exploring the mechanism of the SIC_{BS} in May influencing the $ESMR_{SCS}$ is crucial for further confirming the linkage between them. Screen et al. [46] suggested that the reduction in sea ice may lead to changes in surface heat fluxes and further potentially affect the atmospheric circulation. Figure 5a,b shows the difference in turbulent heat flux (THF, sum of sensible heat flux and latent heat flux) in May and June in the Arctic region between PSIC and NSIC years. The positive anomaly observed over the BS indicates that the May SIC can significantly influence the atmosphere (Figure 5a) and vice versa. The positive anomaly of THF extends westward and covers the western area of the BS, which indicates that the net THF is upward in these regions (Figure 5b). Consequently, thermal conditions around the BS have changed, which is a process of sea ice affecting the atmosphere. For additional clarity, Figure 5c depicts the anomaly in isobaric vertical velocity. The THF anomaly at high latitudes induces ascending air motion in the BS, while descending air motion predominates in the mid-latitudes around the Black Sea region. This leads to the establishment of a meridional circulation cell anomaly.







Figure 5. The differences of turbulent heat flux $(W \cdot m^{-2})$ in May (**a**) and June (**b**) between PSIC and NSIC years; (**c**) The difference isobaric vertical velocity (Pa s⁻¹) averaged over 10° – 50° E between PSIC and NSIC years. The isobaric vertical velocity is scaled by 1000. Dotted areas are significant at the 90% confidence level.

Figure 6 depicts the regression of circulation anomalies at 500 hPa and Rossby wave propagation at 200 hPa on SIC_{BS}. Three centers of atmospheric circulation anomalies are situated in the Black Sea region, the Iranian Plateau, the Tibetan Plateau region, and the Mongolian Plateau region, showing a "positive, negative, positive" anomalies pattern from west to east, respectively, which is similar to the structure of the Eurasian pattern (EU) teleconnection (Figure 6a). The anticyclonic anomaly over the Black Sea acts as the source, and the eastward propagation of the wave activity flux (WAF) corresponds to the precipitation anomaly in the SCS (Figure 6b). The positions of the anomaly centers align closely with those in Figure 6a.



Figure 6. Regression of (a) GPH (shadings; gpm) and horizontal wind (vectors; ms^{-1}) at 500 hPa and (b) stream function (shadings; 10^{-6}) and WAF (vectors; $m^2 s^{-2}$) at 200 hPa on the SIC_{BS} (The dotted area indicates that the GPH and stream function were statistically significant at the confidence level of 90%. Red "A" and blue "C" in (a) represent anticyclonic and cyclonic circulations, respectively. Vectors in (b) represent that the WAF was statistically significant at the confidence level of 90%.)

In the middle latitudes of Eurasia, considering the "positive, negative, positive" pattern of atmospheric circulation anomalies, we applied the methodology for defining the EU teleconnection index adopted by Wallace et al. [47] to define the similar-EU teleconnection index for identifying the Similar-Eurasian teleconnection pattern (SEU):

$$SEU = \frac{1}{4}GPH(35^{\circ}N, 15^{\circ}E) - \frac{1}{2}GPH(30^{\circ}N, 55^{\circ}E) + \frac{1}{4}GPH(45^{\circ}N, 90^{\circ}E)$$
(5)

where GPH denotes the geopotential height anomaly at 500 hPa. The relationships between the SEU index, the SIC_{BS}, and the ESMR_{SCS} were investigated, revealing correlation coefficients of 0.38 and 0.30, respectively, significant at the 95% and 90% confidence levels. This suggests that the SEU exhibits a certain correlation with SIC_{BS} and ESMR_{SCS}, potentially serving as a "bridge" linking the Arctic and the tropic in this study.

To further explain the formation of the rainfall anomalies over the SCS, the vertical velocity anomalies associated with the SIC_{BS} and SEU are shown in Figure 7. It can be found that the SIC_{BS} and SEU are closely related to the vertical velocity over the SCS (Figure 7a,b). Thus, we defined the vertical velocity index Omega_{SCS} for the whole layer (1000 hPa–100 hPa) in the SCS and computed its correlation with SIC_{BS}, SEU, and ESMR_{SCS} as -0.35, -0.52, and -0.77, respectively. All these correlations are significant at the 95% confidence level, and their time series are depicted in Figure 7c. Evidently, the sea ice anomaly affects the vertical velocity over the SCS by exciting the SEU teleconnection wave train, which subsequently influences the precipitation of the summer monsoon in the

SCS. Furthermore, according to the monthly average 500 hPa Western Pacific Subtropical High Area (WPSHA) index and Western Pacific Subtropical High Intensity (WPSHI) index released by the Climate Diagnosis Office of the National Climate Center of China Meteorological Administration, their correlations with the SEU and ESMR_{SCS} are shown in Table 1. The findings indicate a significant negative correlation between the SEU and ESMR_{SCS} with both the area and intensity of the WPSH. These results suggest that the SEU influences the atmospheric circulation and precipitation over the SCS by impacting the extent and strength of the WPSH. Additionally, the correlation coefficient between the SEU and the GPH of the cyclonic anomaly in the SCS at 500 h Pa is -0.53. These findings further confirm that the SEU serves as a "bridge", connecting Arctic sea ice and monsoon rainfall.



Figure 7. Regression of vertical velocity (shadings; ms⁻¹) averaged over 100°–130° E on the (**a**) SIC_{BS} and (**b**) SEU (The dotted areas are statistically significant at the confidence level of 90%); (**c**) time series of ESMR_{SCS}, SIC_{BS}, SEU, and Omega_{SCS}.

Table 1. Correlation coefficients of the area and intensity of WPSH with SEU and ESMR_{SCS}.

	SEU	ESMR _{SCS}
WPSHA	-0.36	-0.32
WPSHI	-0.33	-0.28

All the correlation coefficients in Table 1 are significant at the 90% confidence level.

3.3. Numerical Experiments

To investigate the response of atmospheric circulation anomalies to SIC_{BS}, the CAM5.3, the atmospheric module of the Community Earth System Model 1.2.2 (CESM 1.2.2), with a horizontal resolution of $1.9^{\circ} \times 2.5^{\circ}$ and a total of 30 vertical layers [37], was used to verify the physical mechanism proposed based on the observed analysis. Firstly, we ran a

control experiment for 30 years by the forcings of seasonal-varying climatology. Then, we conducted two sensitivity experiments named HBS and LBS for 12 months from January to December. For each sensitivity experiment, the abnormal increase and decrease in sea ice in the BS in May are respectively forced, and all other external variables are held constant. On January 1, the initial conditions were different, and the average results of 30 sets of ensemble tests were obtained for analysis. The detailed simulation scheme and SIC forcing distribution are given in Table 2.

ExperimentsNumbersYearsDescriptionHBS301The May SIC in the BS (66°-75° N,35° E-55° E) is
the mean SIC of PSIC years, while other regions are
climatological SIC/SST. For other seasons, the
model is forced by climatological SIC/SST.LBS301

mean SIC of NSIC years.

Table 2. Descriptions of numerical experiments using the CAM5.3 atmospheric model.

We present the experimental results by HBS minus LBS, in which the circulation anomalies respond to SIC_{BS} in the sensitivity experiment and the comparison with the observed results is shown in Figure 8. The results show that the positive anomaly SIC in the BS will lead to a "positive, negative, positive" anomaly pattern structure in the middle latitudes of Eurasia. Coincidentally, there is a cyclonic anomaly at 850 hPa in the SCS with a positive rainfall anomaly. For the key mechanisms for SIC_{BS} influencing ESMR_{SCS}, in which the SEU serves as the bridge to link them, the numerical simulations are consistent with the observational results, albeit with deviations in the central locations. The above illustrates that the experiments simulated the atmospheric circulation links between SIC changes in the BS and the ESMR in the SCS.



Figure 8. The observed (a,c)/simulated (b,d) differences of GPH (shadings; gpm) and horizontal wind (vectors; ms⁻¹) at 500 h Pa and horizontal wind (vectors; ms⁻¹) at 850 h Pa and rainfall (shadings; mm day⁻¹) between the PSIC and NSIC years/HBS and LBS experiments.

4. Conclusions and Discussion

4.1. Conclusions

Based on the NCEP/NCAR reanalysis dataset, the CAMP precipitation dataset, and the Hadley Center SIC dataset, we found that there is a certain positive correlation between the May SIC_{BS} and the ESMR_{SCS}, and we further analyzed the specific influence mechanism of the two as follows: When the SICBS is abnormally positive (negative) in May, the local net THF anomaly is directed upwards (downwards), causing the ocean to release energy to the atmosphere, which is a process of ice affecting the atmosphere and vice versa. This initiates an upward (downward) air motion anomaly around the BS region at high latitudes, accompanied by a downward (upward) air motion anomaly in the mid-latitudes of the Black Sea region, resulting in the formation of a meridional circulation cell anomaly. Subsequently, this circulation pattern facilitates the transmission of Arctic signals to East Asia through the SEU teleconnection at mid-latitudes. The teleconnection of the SEU influences the vertical upward (downward) motion and the extent and intensity of the WPSH in the SCS. These changes impact the atmospheric circulation, resulting in the development of a (an) cyclone (anticyclone) anomaly in the middle and lower layers, and the southwest water vapor anomaly transport from the Indian Ocean served as an extra vapor source for ESMR_{SCS}. Collectively, these factors all ultimately lead to the positive (negative) anomaly of ESMR_{SCS}. To gain a deeper understanding of the observations, numerical experiments were performed using the CAM5.3. The results support the observed physical mechanism in which the SEU in the middle latitudes of Eurasia plays a crucial bridge role.

4.2. Discussion

Previous studies on the relationship between Arctic sea ice and monsoons mostly focused on subtropical monsoons such as EAWM [10,11] and EASM [12–14]. It has been suggested that European land, anomalous North Pacific SST, and the Silk Road tele-connection could potentially act as conduits for transmitting the Arctic sea ice influence on regions at mid-to-low latitudes [13,14,39]. This study pays special attention to the linkage between the tropical SCSSM and the Arctic SIC in the pre-monsoon period and the possible mechanisms of their connection, proposing the result of the SEU teleconnection as a "bridge", which establishes the connection between the Arctic and the tropics, and provides a new insight for forecasting the SCSSM.

The above diagnostic analysis revealed the influence of the Arctic sea ice anomaly on the ESMR in the SCS through the SEU teleconnection. Nevertheless, a more specific mechanism needs to be further analyzed, and it is unclear whether there are other influencing factors. Meanwhile, it is essential to note that the melting rate of SIC has substantially accelerated due to the intensifying global warming. Thus, further analysis is needed to explore whether the close connection between the SICBS and ESMRSCS will change in the future before the ice-free condition occurs in the BS and then consider the potential impact of Arctic regional circulation and whether new "connecting bridges" will emerge after the ice-free condition occurs in the BS in the future, which would be an interesting issue.

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