Diversity of Pacific Meridional Mode and its distinct impacts on El Niño-Southern Oscillation

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Abstract

Numerous studies have demonstrated that the Pacific Meridional Mode (PMM) plays a vital role in determining El Niño-Southern Oscillation (ENSO) events in the following winter season. However, little attention has been given to significant differences among the spatial patterns of the PMM. Here we show that the PMM exhibits a large diversity in spatial patterns, leading to distinct impacts on ENSO. Based on objective clustering analysis, two distinct spatial patterns of the PMM are detected. Cluster 1 (C1) PMM exhibits a strong sea surface temperature dipole over the subtropical eastern Pacific and mid-latitude central Pacific whereas cluster 2 (C2) features a classic dipole over the subtropical eastern Pacific and equatorial cold tongue regions. We find that the C1 PMM is strongly linked to ENSO events while the C2 PMM has no statistically significant relations with following ENSO. This gives new implications for ENSO dynamics and predictions.

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12	Key points:
13 14	• The Pacific Meridional Mode has strong spatial diversity that can be separated into two groups
15 16	• These two types of the spring PMM have distinct impacts on ENSO events in the following winter
17	• We suggest an optimal pattern of the spring PMM for ENSO prediction
18	

19 Abstract

20 Numerous studies have demonstrated that the Pacific Meridional Mode (PMM) plays a vital role 21 in determining El Niño-Southern Oscillation (ENSO) events in the following winter season. 22 However, little attention has been given to significant differences among the spatial patterns of 23 the PMM. Here we show that the PMM exhibits a large diversity in spatial patterns, leading to 24 distinct impacts on ENSO. Based on objective clustering analysis, two distinct spatial patterns of 25 PMM are detected. Cluster 1 (C1) PMM exhibits a strong sea surface temperature dipole over the 26 subtropical eastern Pacific and mid-latitude central Pacific whereas cluster 2 (C2) features a 27 dipole over the subtropical eastern Pacific and equatorial cold tongue region. We find that the C1 28 PMM is strongly linked to ENSO events while the C2 PMM has no statistically significant 29 relations with following ENSO. This gives new implications for ENSO dynamics and predictions.

30 Key words: PMM diversity, cluster, ENSO

33 **1 Introduction**

The North Pacific Meridional Mode (PMM) is characterized by an anomalous meridional sea surface temperature (SST) gradient coupled with anomalous winds from a cold to warm flank over the eastern North Pacific (ENP; Amaya, 2019; Chiang & Vimont, 2004; Vimont et al., 2003). Previous studies (Chang et al., 2007; Yu & Kim, 2011) have summarized that spring PMM events can trigger the following El Niño-Southern Oscillation (ENSO); the PMM is thus considered a crucial precursor for the prediction of ENSO events.

40 Numerous works have focused on the origin of the PMM and its impact on ENSO, as well 41 as understanding the interactions between them. A branch of the PMM SST warming off coastal 42 California in spring can enhance subtropical convection over the ENP, which can in turn induce 43 westerly anomalies. Wind anomalies associated with this region are further attributed to the 44 warming and southwestward extension of SSTs in the following seasons via the wind-45 evaporation-SST (WES) mechanism (Xie & Philander, 1994) and thereby trigger El Niño events 46 through positive feedbacks over the equatorial Pacific. A seasonal foot-printing mechanism (SFM) 47 was proposed by Vimont et al. (2001, 2003) to explain the potential influence of the North 48 Pacific Oscillation (NPO; Rogers, 1981) on ENSO events. The NPO can induce anomalous SSTs 49 over the subtropical North Pacific by affecting latent heat fluxes. Previous studies (Kao & Yu, 50 2009; Yu et al., 2010) have argued that SST anomalies induced by the SFM resemble the pattern 51 of the PMM SST. These two extratropical SST patterns have therefore been treated as key players 52 in linking the extratropical Pacific to ENSO.

53 More recently, PMM has also been considered as a crucial factor to induce ENSO 54 diversity (Yu et al., 2010, 2017; Yang et al., 2018). Stuecker (2018) found that the PMM and 55 central Pacific (CP) ENSO can excite mutually, implying a positive feedback between these two 56 phenomena. Yu & Fang (2018) recently proposed that the SFM could significantly contribute to

57 central Paicific ENSO events while the charge–discharge mechanism has a greater influence on 58 conventional ENSO events. The SFM contributes to SST anomalies over the subtropical ENP 59 while the charge–discharge mechanism modulates SST anomalies over the cold tongue (CT) 60 region, where the SST anomalies of the PMM show significant varibility. The connection 61 between these anomalies and both conventional and CP ENSO events also implies spatial 62 differences in anomalous PMM SST patterns.

63 Although previous studies have documented possible physical processes of the PMM in 64 exciting ENSO events, it has been seldom discussed how efficiently the PMM can induce ENSO 65 events. Park et al. (2013) showed that only 5 positive events among 12 were linked to El Niño 66 events in the following year and argued that the spatial pattern of the NPO might be a critical 67 parameter for controlling the evolution of ENSO. We noted from their study that the PMM 68 patterns shown are visibly different between the two groups. As shown in Figure 1a, we found 69 that approximately 40% (13) of all PMM events (33) are strongly related to ENSO events. By 70 further tracking these two groups of PMM events, we found that the main differences were 71 concentrated on their anomalous SST patterns (Fig. 1d and 1f), which may lead to different roles 72 in inducing ENSO events. Previous studies have shown the ubiquity of diversity in ENSO 73 (Ashok et al., 2007; Kug et al., 2009; Yeh et al., 2009; Wang et al. 2019a) and the Madden Julian 74 Oscillation (Wang et al. 2019b). The PMM could also exhibit diversity in its spatial patterns, 75 which would further result in distinct behavior affecting the ENSO events.

Here, we propose a method to objectively delineate the diversity of the PMM and its impact on ENSO events. The reanalysis datasets and clustering method used to classify PMM events in this study are introduced in Section 2. The diversity of PMM and its impacts on ENSO are described in Section 3. A brief summary and discussion is presented in Section 4.

80 2 Data and Methodology

Extended Reconstructed SST version 5 (ERSST.v5; Huang et al., 2017) data were downloaded from the National Oceanic and Atmospheric Administration with a horizontal resolution of 2° for the 1951-2018 period. Atmospheric circulation data with a 2.5°×2.5° horizontal resolution, including sea level pressure (SLP) and winds at 850 hPa for the same period were downloaded from National Centers for Environmental Prediction/National Centers for Atmospheric Research reanalysis version I (NCEP/NCAR V1; Kalnay et al., 1996).

87 The raw PMM was download from the University of Wisconsin-Madison 88 (http://www.aos.wisc.edu/~dvimont/MModes/RealTime/PMM.RAW.txt), which contains both 89 interannual and interdecadal variabilities (Liu et al., 2019). A fast Fourier transform method is 90 used to filter out decadal variability (> 10 years) from both the reanalysis data and the PMM 91 index. We confirmed that the results of the cluster analysis were not significantly changed when 92 applied to non-filtered data. To exclude the impact of previous ENSO events on the spring (February-May averaged; FMAM) PMM event, we linearly removed the previous November-93 94 December-January (NDJ) ENSO (Nino3.4; 5°S-5°N, 120°W-170°W) signal from the PMM time 95 series as in Ashok et al. (2007). We also tested the removal of simultaneous ENSO signals, 96 finding that the result was consistent (Fig. S1).

An objective K-Means clustering method (Wang et al., 2019a, b; Wilks, 2011) was used to classify diverse PMM patterns. Firstly, we linearly removed the previous NDJ Nino3.4 signal from FMAM SSTs. Secondly, 33 PMM events were selected based on a criterion of ± 0.7 standard deviation of the filtered FMAM PMM index and all negative PMM events were transformed to positive ones such that we were not required to separate positive and negative PMM events into two groups, allowing us instead to focus on pattern diversity. Thirdly, SSTs over a fixed domain (20°S-40°N, 150°E-60°W) were selected and fed into a clustering model 104 using squared Euclidean distance to measure the similarity between each cluster member and the 105 corresponding cluster centroid. The silhouette criterion, whose value varies from -1 to 1, was 106 utilized to assess the skill of cluster analysis. A high silhouette value implies that the member has 107 a high similarity with its own cluster but a lower similarity with its neighboring clusters 108 (Kaufman & Rousseeuw, 2009).

109 **3 Results**

110 Previous studies have documented a statistically significant correlation between the spring 111 PMM and the following winter ENSO index (Anderson, 2003, 2007; Larson & Kirtman, 2014). 112 Figure 1a shows the spring PMM and the following winter Nino3.4 indices with interdecadal 113 variability removed. The correlation is 0.28 for the period 1951-2018 and 0.45 for the period 114 1979-2018, both exceeding 95% confidence levels. The significant lag correlation indicates that 115 the PMM is probably a good predictor of ENSO events. However, we evaluated 33 PMM events 116 with amplitudes greater than 0.7 standard deviation and found that 13 cases (6 positive and 7 117 negative cases marked with green bars in Figure 1a) corresponded to respective ENSO events, 118 whereas the other 20 cases (10 positive and 10 negative in red bars) were not directly related to 119 ENSO (Fig. 1a). This indicates that some PMM events are strongly related to ENSO but others 120 did not lead to the triggering of ENSO, implying the PMM-ENSO relationship is diverse. 121 Furthermore, we studied composites of spring and winter SST anomalies for these 33 cases (Fig. 122 1b-1g). The spring PMM events show a clear tripole SST pattern with large anomalies centered 123 over the southern CT, ENP and central North Pacific regions (Fig. 1b), but the following ENSO 124 signal is weak (Fig. 1c).

125 To clarify the relationship between PMM and ENSO, we conducted a composite analysis 126 by dividing PMM events into two groups: the first group is strongly related to ENSO events (blue

127 bars) and the second is not (red bars; Fig. 1d-1g). An important feature shown is the significant 128 difference in spring PMM patterns between the two groups (Fig. 1d and 1f). When the positive 129 PMM precedes El Niño, the SST anomalies in spring show a clear dipole pattern in the northern 130 subtropical region but insignificant negative SST anomalies over the CT region (Fig. 1d). While 131 the PMM is not linked to ENSO development, the SST pattern shows an interhemispheric dipole 132 over the eastern Pacific. In addition, subtropical positive SST anomalies in Figure 1d extend to 133 the southwest as far as the equator over the CP, but negative SST anomalies are dominant over 134 the CT region in Figure 1f, mainly over the southeastern Pacific Ocean.

135 Abovementioned different SST patterns suggest potential spatial diversity in the PMM, 136 which could further lead to distinct impacts on ENSO events (Fig. 1e and 1g). To validate our 137 hypothesis and justify the corresponding analysis, a K-Means clustering method was utilized to 138 objectively classify 33 PMM events into 2 clusters. The composites of the PMM events for the 139 two clusters are shown in Figure 2, with different clusters displayed in the left and right panels. 140 Cluster 1 (C1) positive PMM events in Figure 2a are characterized by significant positive SST 141 anomalies elongated from the CP to the subtropical ENP and negative SST anomalies over the 142 subtropical CP region. C1 SST anomalies correspond to significant equatorial westerly anomalies 143 in the CP and easterly anomalies in the CT regions (Fig. 2a). Similarly, negative C1 events show 144 a strong negative SST anomaly extending from the CP to subtropical ENP, coupled with 145 significant equatorial easterly wind anomalies in the central-western Pacific, and a positive SST 146 anomaly in the subtropical North Pacific (Fig. 2b). However, the spatial pattern of cluster 2 (C2) 147 PMM events (Fig. 2d and 2f) is distinct from that of C1. C2 PMM events feature a hemispheric 148 dipole of SST anomalies over the southern tropical and northern subtropical eastern Pacific (Fig. 149 2d and 2f). Due to the development of strong SST anomalies over the CT region, easterly anomalies are dominant over the whole equatorial Pacific during positive phases while westerly
anomalies during negative phases. These are clearly distinguished from their respective
anomalous convergent and divergent patterns in C1 events (Fig. 2a and 2b).

153 Based on the different spatial patterns of these two types of PMM events, we refer to C1 as the 154 western PMM (WPMM) and C2 as the eastern PMM (EPMM) events. The silhouette values of 155 C1 and C2 PMM events are shown in Figure 2c and 2f with positive and negative PMM cases 156 marked in red and blue, respectively. The silhouette values of C1 are, on average, higher than 157 those of C2, indicating that the C1 shows a higher degree of "similarity" and that the spatial 158 patterns of positive and negative WPMM events are more symmetric than the EPMM events. It is 159 worth noting that 5 El Niño events occurred in positive WPMM years where only one event 160 followed a positive EPMM phase. Moreover, only one La Niña event was involved in a positive 161 WPMM phase (Fig. S2a and Table S1) and no false alarms for El Niño events were observed 162 during our studying period, indicating that WPMM events are a better precursor for predicting 163 ENSO events.

164 Table S1 gives the details of ENSO events related to the PMM. Five of the seven positive C1 165 events were clearly linked to the occurrence of El Niño and four of the eight negative C1 events 166 were related to La Niña; each individual PMM case is shown in Figure S2. However, only one 167 positive EPMM event out of the nine cases studied was followed by an El Niño event, whereas 168 three of the nine negative EPMM events were followed by La Niña. It was also noted that the 169 positive EPMM event followed by an El Niño case corresponded to the only negative silhouette 170 value in C2 (Fig. 2f), meaning that this event was not a conventional EPMM event pattern. 171 Furthermore, 2 positive EPMM and 3 negative EPMM events were even followed by La Niña 172 and El Niño events, respectively, indicating false (or opposite) alarms. These results suggest that 173 relationships between PMM and ENSO are highly dependent on the pattern of the PMM.

174 Figure 3 shows the NDJ SST and 850 hPa wind anomalies corresponding to positive and 175 negative PMM events for two clusters. As expected from Table S1, the central-eastern Pacific is 176 covered by strong SST anomalies with prevailing westerly anomalies during the positive phase of 177 WPMM. The positive SST and westerly wind anomalies gradually developed from the CP with 178 strong off-equatorial signals during the developing phase (Fig. S3a). However, EPMM events do 179 not show any significant SST anomalies in the following winter (Fig. 3c and 3d), since strong 180 negative SST anomalies exist during May-June-July (Fig. S3c). Similarly, negative WPMM 181 events are followed by negative SST anomalies in the central and eastern Pacific with easterly 182 anomalies (Fig. S3b). It is also found that SST anomalies are more significant in the equatorial 183 CP. Yu and Fang (2018) previously suggested that PMM events are more closely related to the 184 development of CP SST anomalies than eastern Pacific SST anomalies, however, EPMM events 185 do not show a strong signal in the equatorial CP.

186 The strong linkage of WPMM to ENSO development can be explained by its pattern in 187 the equatorial western Pacific. As shown in Figure 3a, strong westerlies prevail in the western 188 Pacific. Since these westerlies are accompanied by positive equatorial CP SSTs, they can persist 189 and be intensified via strong air-sea interactions. The western Pacific westerlies induce 190 downwelling Kelvin waves, which play a role in recharging heat content in the central and 191 eastern Pacific (Kug et al. 2010). In addition, these low-frequency westerly anomalies provide a 192 preferable condition for easterly vertical shear of strong westerly wind events (Kug et al., 2009, 193 2010; Sooraj et al., 2009), a typical pattern of El Niño onset. Therefore, they evolve into a typical 194 El Niño pattern in the following summer and develop further until the end of the calendar year 195 (Fig. 3). However, positive SST anomalies resulting from the positive EPMM are confined to the off-equatorial Pacific (Fig. 2d), which cannot trigger coupled equatorial patterns such as equatorial westerlies and positive CP SST anomaly (Fig. 3c). Without the equatorial western Pacific signals, El Niño tends not to develop. In addition, the prevailing negative SST anomalies and their associated easterlies in the eastern Pacific may play a counteracting role in El Niño development. Consequently, EPMM events are significantly related to El Niño development.

201 It is well known that the PMM is a useful predictor for ENSO, but PMM events are not 202 always followed by ENSO development, suggesting the existence of some false alarms. Thus far, 203 we showed that there is a preferable pattern of PMM for ENSO development. Our finding 204 suggests that false alarms from PMM information can be reduced if we considered the pattern 205 diversity of the PMM. Following previous methods (Kug et al., 2007; Zhu et al., 2015), we 206 attempted to reconstruct the PMM index based on the two types of spatial SST patterns and 207 comparison with the original PMM index. These new PMM indices depending on PMM diversity 208 are calculated by projecting the C1 and C2 SST patterns shown in Figure 2 into SST anomalies 209 each year (FMAM), and refer to WPMM and EPMM indices, respectively. The correlation 210 coefficient between the ENSO indices and the original PMM index is 0.28 (Fig. 4a); although this 211 is significant, it is difficult to use for prediction. Out of the 33 PMM events defined based on the 212 original PMM events, 13 cases resulted in ENSO development while another 6 PMM events (3 213 positive and 3 negative cases) were followed by the opposite phases of ENSO. Furthermore, the 214 last 14 PMM events were not linked to ENSO events. Using WPMM events, the correlation 215 increases significantly, reaching 0.64 between the WPMM and ENSO indices (Fig. 4b). We 216 found that WPMM captures 17 ENSO events among the 27 studied WPMM events (14 positive 217 and 13 negative cases) based on 0.7 standard deviation. In detail, 71.4% of positive WPMM 218 events (10 cases) eventually induce El Niño and 53.8% of negative PMM events (7 cases) lead to La Niña, indicating that the hit rate is 63% on average, which is higher than the 39.4% based on the original PMM index. Moreover, WPMM contains only 2 false alarms among the 27 events, which is an improvement relative to the 6 false alarms in the original PMM events. Furthermore, we also reconstructed the PMM index based on C2 SST patterns, finding that the correlation between EPMM and ENSO is -0.22 (Fig. 4c). This indicates that EPMM cannot be used for ENSO prediction.

225 4 Conclusion and Discussion

226 Most previous studies have emphasized that the PMM has a crucial role in triggering 227 ENSO events, however, it has seldom been noticed that the PMM is diverse. This diversity may 228 contribute to its variable impacts on ENSO. Based on the SST patterns, an objective clustering 229 method was used to classify PMM events. We found that PMM cases can be separated into two 230 groups. The WPMM is characterized by a dipole SST anomaly over the west part of ENP 231 whereas the EPMM dominates the CT and coastal SST anomalies in the ENP. Moreover, we 232 showed that approximately 60% of C1 PMM events (5 positive and 4 negative events among 15 233 C1 PMM cases) are significantly linked to ENSO events, while C2 PMM events are less notably 234 related to ENSO. To utilize our findings for ENSO prediction, we reconstructed WPMM and 235 EPMM indices and found that the WPMM index can accurately predict ENSO events with the 236 higher hit rate (63%) and with fewer false alarm than the original PMM index. The EPMM index 237 constructed based on C2 PMM SST patterns showed an insignificant negative relationship with 238 ENSO, implying that the EPMM SST pattern is not a good predictive framework for ENSO 239 events and requires further investigation.

Although we showed the PMM diversity and its distinct impacts on ENSO, it is not clear what induced this diversity. Previous studies have documented that the NPO has different spatial

242 structures and that an eastward shift of the NPO may favor ENSO occurrence in the following 243 year while the classic NPO pattern with an elongated southern lobe is less related to ENSO 244 occurrence (Park et al. 2013; Sung et al., 2019; Yeh et al., 2018). We also found that the NDJ SLP 245 patterns preceding FMAM PMM are considerably different (Fig. S4). Clearly, WPMM events are 246 related to strong NPO events with a significant eastward shift (Fig. S4a and S4b), consistent with 247 Park et al (2013) and Yeh et al (2018). However, unlike previous studies, we found that EPMM 248 events are less linked to NPO events (Fig. S4c and S4d). Negative EPMM events are associated 249 with significantly negative SLP anomalies over North America but weak positive anomalies 250 south of 40°N (Fig. S4d). In addition to the impact of NPO, it is also possible that PMM diversity 251 may be connected with SST variability in other basins. For example, some studies have 252 emphasized that the tropical Atlantic SST can modulate off-equatorial SST and wind variabilities 253 along the Pacific ITCZ (Ham et al., 2013; Ham & Kug, 2015; Park et al., 2018; 2019a,b), where 254 the action center of the PMM is located. Moreover, previous studies also found the decadal 255 variation of the PMM is related to the Pacific Decadal Oscillation (PDO; Newman et al., 2016). 256 In this study, however, the decadal variability of the PMM was screened out before the analyses. 257 The mechanism responsible for PMM diversity and its relationship with decadal modes should be a focus of future research. 258

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265	https://www.esrl.noaa.gov/psd/data/gridded/data.noaa.ersst.v5.html. The NCEP/NCAR reanalysis
266	version I (v1) data is from
267	https://www.esrl.noaa.gov/psd/data/gridded/data.ncep.reanalysis.pressure.html. The PMM index
268	is got from http://www.aos.wisc.edu/~dvimont/MModes/RealTime/PMM.RAW.txt.
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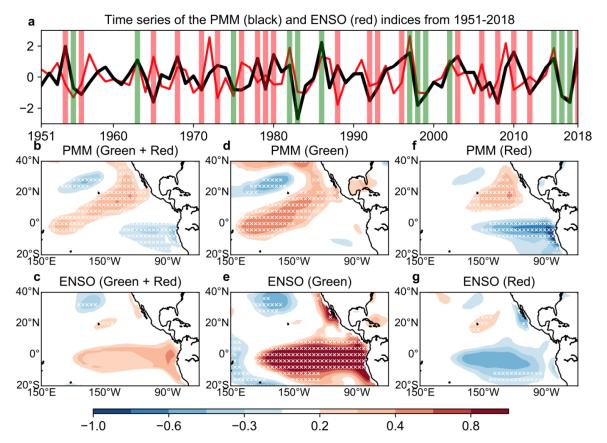
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393 Figure 1. Time series (a) of the PMM and ENSO indices from 1951-2018 and the spring 394 (FMAM; b, d and f) and winter (NDJ; c, e and g) SST anomalies between positive and 395 negative PMM years. (a) Normalized PMM (black line) and following NDJ averaged 396 Niño3.4 (red line) indices for the period 1951-2018. Green and red bars indicate PMM 397 events larger than ± 0.7 standard deviation. Green bars represent the 13 (6 positive and 7 398 negative) PMM events associated with ENSO occurrence while red bars represent the other 399 20 (10 positive and 10 negative) PMM events (i.e., a total of 33 PMM events). (b) the 400 composite of SST anomalies from 16 positive and 17 negative PMM events; (c) 401 corresponding NDJ SST anomalies based on 33 PMM events; (d) composite of SST 402 anomalies of 13 PMM events shown as green bars; (e) composite of NDJ SST anomalies 403 based on the 13 PMM years represented by green bars; (f) same as (d) but for the 20 PMM 404 events indicated by red bars; (g) same as (e) but for the 20 PMM years shown as red bars. 405 White crosses represent areas of SST above 95% significance level.

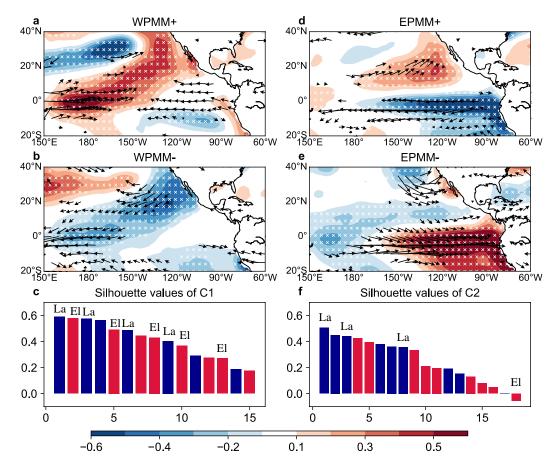
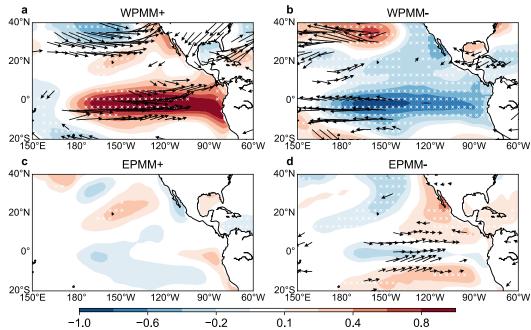


Figure 2. Two clusters of PMM events and silhouette values of each event. Cluster 1 (C1; left panel) (a) positive and (b) negative PMM events; cluster 2 (C2; right panel) (c) positive and (d) negative PMM events; silhouette values for (e) C1 and (f) C2 PMM events. White crosses in a, b, d and e represent areas of anomalous SST fields above 90% confidence level based on a two-tailed t test; black arrows indicate the composite of 850 hPa winds (m/s) above 90% confidence level. Red (blue) bars in (c) and (f) represent the positive (negative) PMM events, respectively. "El" and "La" marked above the bars in (c) and (f) indicate that El Niño or La Niña events occurred during the respective positive and negative PMM phases.



418
419 Figure 3. Composites of NDJ averaged SST anomalies and wind anomalies at 850hPa based
420 on different types of PMM years. (a) Composite NDJ SST anomalies during C1 positive
421 PMM years; (b) same as (a) but for C1 negative PMM years; (c) same as (a) but for C2
422 positive PMM years; and (d) same as (b) but for negative C2 PMM years. White crosses and
423 black arrows indicate area above 90% confidence level.

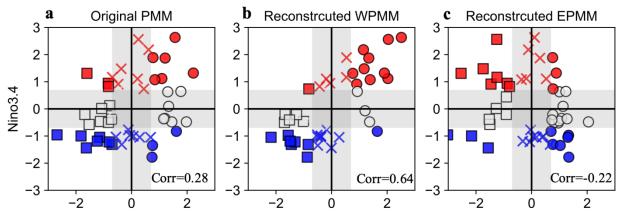


Figure 4. Scatter diagrams of ENSO index and original (reconstructed) PMM index based
on C1 and C2 spatial patterns for the period 1951-2018. (a) Scatter plot of ENSO and
original PMM indices; (b) scatter plot of ENSO index and WPMM index reconstructed based
on the C1 SST pattern; and (c) scatter plot of ENSO index and EPMM index reconstructed
based on the C2 SST pattern. Significant El Niño and La Niña events are colored red and
blue, respectively. Significant positive and negative PMM events are marked by circles and
rectangles, respectively.

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Supporting Information for

Diversity of Pacific Meridional Mode and its distinct impacts on El Niño-Southern Oscillation

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Table S1 Figures S1 to S4 **Table S1.** Positive and negative PMM (WPMM and WPMM) events chosen based on the criterion of ± 0.7 standard deviation. Red represents El Niño years; blue denotes La Niña years.

	Positive	Negative
WPMM	1963 , 1980, 1986, 1997 ,	1955 , 1956, 1971, 1975 ,
	2002 , 2010, 2015	1979, 1999 , 2008, 2016
EPMM	1954, 1968, 1973 , 1978,	1965 , 1976 , 1983 , 1992,
	1982 , 1988 , 1996, 2003,	1993, 1998 , 2006 , 2012,
	2018	2017

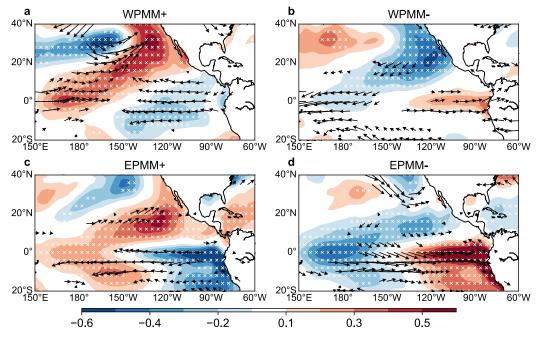


Figure. S1. Clustering analysis with simultaneous El Niño signal removed. The cluster 1 (C1) (a) positive and (b) negative western PMM (WPMM) events; and cluster 2 (C2) (c) positive and (d) negative eastern PMM (EPMM) events. The white crosses represent composite of SST (℃) with area above 90% confidence level based on two-tailed t test and the black arrows indicate the composite of 850hPa winds (m/s) above 90% confidence level.

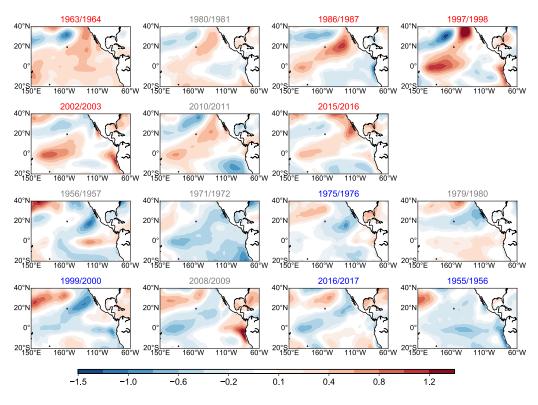


Figure S2. The spring SST anomalies of 15 individual C1 PMM events. The year marked by red (blue) color represents the El Niño (La Niña) year, respectively.

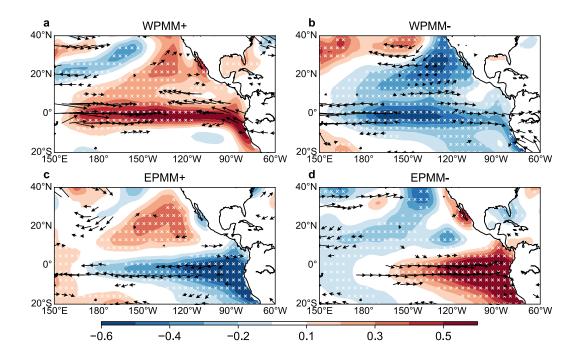


Figure S3. Composites of May-June-July (MJJ) averaged SST and 850hPa wind anomalies based on different types of PMM years. (a) The composite MJJ SST anomalies during positive WPMM years; (b) same as (a) but for negative WPMM years; (c) the composite MJJ SST anomalies during positive EPMM years; and (d) same as (c) but for negative EPMM years. The white crosses represent area above 90% confidence level based on Student's and the black arrows indicate the composite of 850hPa winds (m/s) above 90% confidence level.

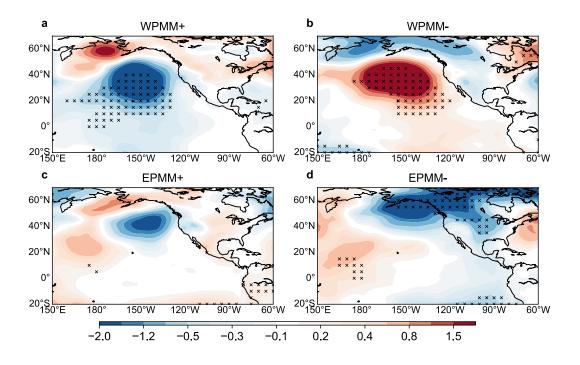


Figure S4. The composite of previous NDJ SLP anomaly based on FMAM PMM events for the period 1950-2018. (a) the NDJ SLP anomalies based on C1 positive PMM events; (b) same as (a) but for C1 negative PMM cases; (c) same as (a) but for C2 positive PMM years; (d) same as (b) but for C2 negative PMM years.