

El Niño–Southern Oscillation frequency cascade

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The El Niño–Southern Oscillation (ENSO) phenomenon, the most pronounced feature of internally generated climate variability, occurs on interannual timescales and impacts the global climate system through an interaction with the annual cycle. The tight coupling between ENSO and the annual cycle is particularly pronounced over the tropical Western Pacific. Here we show that this nonlinear interaction results in a frequency cascade in the atmospheric circulation, which is characterized by deterministic high-frequency variability on near-annual and subannual timescales. Through climate model experiments and observational analysis, it is documented that a substantial fraction of the anomalous Northwest Pacific anticyclone variability, which is the main atmospheric link between ENSO and the East Asian Monsoon system, can be explained by these interactions and is thus deterministic and potentially predictable.

ENSO | frequency cascade | combination mode | annual cycle | monsoon

The El Niño–Southern Oscillation (ENSO) phenomenon is a coupled air–sea mode, and its irregular occurring extreme phases El Niño and La Niña alternate on timescales of several years (1–8). The global atmospheric response to the corresponding eastern tropical Pacific sea surface temperature (SST) anomalies (SSTA) causes large disruptions in weather, ecosystems, and human society (3, 5, 9).

One of the main properties of ENSO is its synchronization with the annual cycle: El Niño events tend to grow during boreal summer and fall and terminate quite rapidly in late boreal winter (9–18). The underlying dynamics of this seasonal pacemaking can be understood in terms of the El Niño/annual cycle combination mode (C-mode) concept (19), which interprets the Western Pacific wind response during the growth and termination phase of El Niño events as a seasonally modulated interannual phenomenon. This response includes a weakening of the equatorial wind anomalies, which causes the rapid termination of El Niño events after boreal winter and thus contributes to the seasonal synchronization of ENSO (17). Mathematically, the modulation corresponds to a product between the interannual ENSO phenomenon (ENSO frequency: f_E) and the annual cycle (annual frequency: 1 y^{-1}), which generates near-annual frequencies at periods of $\sim 10 \text{ mo}$ ($1 + f_E$) and $\sim 15 \text{ mo}$ ($1 - f_E$) (19).

In nature, a wide variety of nonlinear processes exist in the climate system. Atmospheric examples include convection and low-level moisture advection (19). An example for a quadratic nonlinearity is the dissipation of momentum in the planetary boundary layer, which includes a product between ENSO (E) and the annual cycle (A) due to the windspeed nonlinearity: $v_E \cdot v_A$ (17, 19). In the frequency domain, this product results in the near-annual sum ($1 + f_E$) and difference ($1 - f_E$) tones (19). The commonly used Niño 3.4 (N3.4) SSTA index (details in *SI Appendix, SI Materials and Methods*) exhibits most power at interannual frequencies (Fig. 1A). In contrast, the near-annual combination tones ($1 \pm f_E$) are the defining characteristic of the C-mode (Fig. 1B).

Physically, the dominant near-annual combination mode comprises a meridionally antisymmetric circulation pattern (Fig. 1D). It features a strong cyclonic circulation in the South Pacific Convergence Zone, with a much weaker counterpart cyclone in the Northern Hemisphere Central Pacific. The most pronounced

feature of the C-mode circulation pattern is the anomalous low-level Northwest Pacific anticyclone (NWP-AC). This important large-scale atmospheric feature links ENSO impacts to the Asian Monsoon systems (20–25) by shifting rainfall patterns (*SI Appendix, Fig. S1B*), and it drives sea level changes in the tropical Western Pacific that impact coastal systems (26). It has been demonstrated using spectral analysis methods and numerical model experiments that the C-mode is predominantly caused by nonlinear atmospheric interactions between ENSO and the warm pool annual cycle (19, 20). Local and remote thermodynamic air–sea coupling amplify the signal but are not the main drivers for the phase transition of the C-mode and its associated local phenomena (e.g., the NWP-AC) (20).

Even though ENSO and the C-mode are not independent, their patterns and spectral characteristics are fundamentally different, which has important implications when assessing the amplitude and timing of their regional climate impacts (Fig. 1). Here we set out to study the role of nonlinear interactions between ENSO and the annual cycle (10) in the context of C-mode dynamics. Such nonlinearities can, in principle, generate a suite of higher-order combination modes, which would contribute to the high-frequency variability of the atmosphere—in a deterministic and predictable way.

Idealized Frequency Experiments

To investigate the nonlinear atmospheric response to interannual ENSO SSTA, in the presence of the annual cycle, we use a similar experimental setup as in ref. 20. The eastern tropical Pacific SSTA pattern (Fig. 2A) is multiplied by a sinusoidal interannual time series (e.g., Fig. 2B for one experiment example) to derive the spatiotemporal evolution of the anomalous boundary forcing for a suite of atmospheric general circulation model (AGCM) experiments using the Community Earth System Model (CESM) Community Atmosphere Model version 4 (CAM4) (27) in a T42 horizontal resolution with 26 vertical levels (details in *SI Appendix, SI Materials and Methods*). The total boundary forcing comprises the observed SST annual cycle additional to the aforementioned ENSO anomalies. In the following, the warm

Significance

This study identifies a mechanism to generate atmospheric variability on near-annual and subannual timescales. Responding nonlinearly to both the El Niño–Southern Oscillation (ENSO) and the annual cycle in sea surface temperatures, the atmosphere develops a wide range of deterministic spectral peaks and corresponding spatial patterns. It is demonstrated that the resulting deterministic variability, which projects onto one of the major modes of East Asian Monsoon variability, exhibits similar predictability as ENSO.

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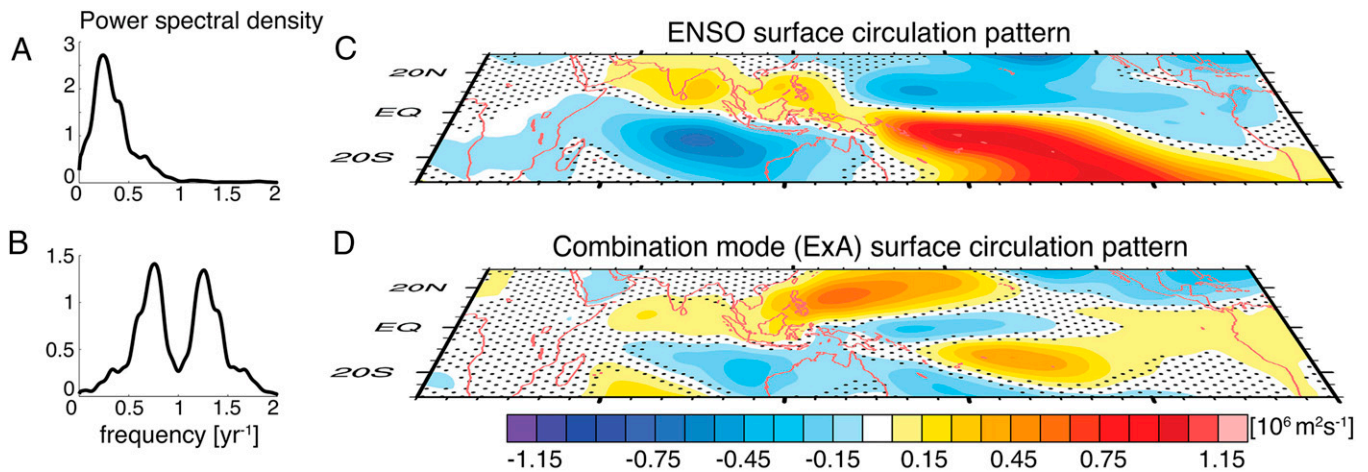


Fig. 1. Schematic for the ENSO (E) and combination mode (ExA) anomalous surface circulation pattern and corresponding spectral characteristics. (A) Power spectral density for the normalized N3.4 index of the Hadley Centre Sea Ice and Sea Surface Temperature data set version 1 (HadISST1) 1958–2013 SSTA using the Welch method. (B) As in A but for the theoretical quadratic combination mode (ExA). (C) Regression coefficient of the normalized N3.4 index and the anomalous JRA-55 surface stream function for the same period (ENSO response pattern). (D) Regression coefficient of the normalized combination mode (ExA) index and the anomalous JRA-55 surface stream function (combination mode response pattern). Areas where the anomalous circulation regression coefficient is significant above the 95% confidence level are nonstippled.

pool annual cycle time evolution is given the variable $A(t)$, and the ENSO time evolution is given the variable $E(t)$.

The aforementioned nonlinear processes are an essential part of general circulation models such as CESM CAM4. For an SST boundary forcing that includes only ENSO (E) and the annual cycle (A), the nonlinear interaction during these processes can be expanded with a Taylor expansion, as a sum of terms $\sum_{n=0}^k \alpha_n (k-n) E^n A^{k-n}$. If we consider only the linear response ($k=1$) as well as quadratic ($k=2$) and cubic ($k=3$) interactions, the following frequencies are generated in the atmospheric response to the SST forcing: the ENSO forcing frequency (f_E), its noninteraction overtones ($2f_E$ and $3f_E$), and the quadratic interaction terms ($1 \pm f_E$), as well as the cubic interaction terms

($1 \pm 2f_E$ and $2 \pm f_E$). Here 1 denotes the annual (A) cycle frequency ($f = 1 \text{ yr}^{-1}$) and 2 denotes the semiannual (SA) cycle frequency ($f = 2 \text{ yr}^{-1}$).

For our experiments, we chose five different discrete idealized ENSO SSTA forcing frequencies (f_E) spanning the observed interannual band (Fig. 1A): $3/7 \text{ yr}^{-1}$, $2/5 \text{ yr}^{-1}$, $3/10 \text{ yr}^{-1}$, $3/13 \text{ yr}^{-1}$, and $3/16 \text{ yr}^{-1}$. These choices were motivated by an intended separation of all ENSO forcing frequencies and the resulting ENSO/annual cycle nonlinear interaction frequencies (SI Appendix, Table S1). We also added additional sinusoidal frequency experiments that have some overlapping forcing and interaction frequencies, $f_E = 1/2 \text{ yr}^{-1}$, $1/3 \text{ yr}^{-1}$, and $1/4 \text{ yr}^{-1}$, to investigate the role of frequency overlapping in estimating the functional form of the atmospheric response. The expected response frequencies for these experiments, as well as the respective number of ensemble members for each experiment, are listed in SI Appendix, Table S1. The cubic ENSO noninteraction term (frequency $3f_E$) is omitted in the following analysis, as its amplitude is near zero.

When analyzing the nonlinear atmospheric response to the combined ENSO/annual cycle forcing, we focus here on the anomalous low-level NWP-AC because it acts as the crucial bridge between ENSO variability and the East Asian Monsoon system (20). To characterize this anomalous circulation, we define the anomalous surface wind stream function averaged over the NWP region ($120^\circ\text{E}–160^\circ\text{E}$, $5^\circ\text{N}–20^\circ\text{N}$, Fig. 2) as our circulation index NWP-AC(t) for each experiment (as in ref. 20). To remove the noise (unforced internal atmospheric variability), the ensemble mean indices are calculated and reduplicated to give a time series of the same length as the original indices, which is labeled NWP-AC(t). This time series can be considered as the deterministic atmospheric response in the region to the combined ENSO/annual cycle SST boundary forcing.

Higher-Order Combination Modes

The power spectra for the NWP-AC(t) indices for a selected number of experiments (blue lines in SI Appendix, Figs. S2A, S3A, and S4A) show that most of the variance can be attributed to the quadratic combination tone peaks ($1 \pm f_E$). However, clear deterministic peaks are also evident for the ENSO noninteraction frequencies (f_E , $2f_E$) as well as for the higher-order combination tones. The ensemble averaging has removed nearly all of the internally generated atmospheric noise from the circulation

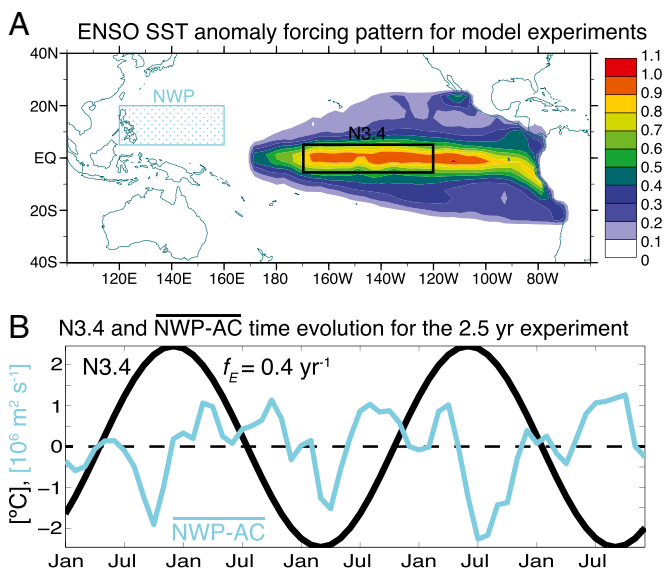


Fig. 2. (A) ENSO SST anomaly forcing pattern for the AGCM experiments. The amplitude of the anomaly pattern is given by the colored shading (no units). The N3.4 (black) and NWP (cyan) regions are marked by two boxes. (B) The time evolution of the N3.4 SST anomaly index (black) and the anomalous ensemble mean circulation index NWP-AC(t) (cyan) for the 2.5-y experiment.

indices, leaving only the modes that originate from the ENSO/annual cycle interactions for our analysis.

Distinctively different anomalous low-level atmospheric circulation patterns (Fig. 3 G–K) are associated with the individual frequency components (Fig. 3 A–E), adding together to the full response pattern (Fig. 3L). Most of the meridionally antisymmetric response can be attributed to the ENSO interactions with either the annual or semiannual cycle. These distinct pattern and associated timescales demonstrate that ENSO’s impact extends far beyond its interannual timescale and canonical response pattern (Fig. 1 A and C).

The very clearly identifiable peaks (SI Appendix, Figs. S24, S34, and S44) at the theoretically expected frequencies (SI Appendix, Table S1) motivate us to use a least square optimization approach to determine the following amplitude ($\alpha_n(k-n)$) and phase (ϕ_m) coefficients for each experiment. The reconstruction $\Psi_c(t)$ is based on the linear, quadratic, and cubic Taylor expansion (the curly brackets indicate the associated frequencies with each term),

$$\Psi_c(t) = \underbrace{\alpha_{10} \times E(t)}_{f_E} + \underbrace{\alpha_{20} \times \hat{E}(t)^2}_{2f_E} + \underbrace{\alpha_{11} \times E(t) \times \cos(\omega_A t - 2\pi\phi_1)}_{1 \pm f_E} + \underbrace{\alpha_{21} \times \hat{E}(t)^2 \times \cos(\omega_A t - 2\pi\phi_1)}_{1 \pm 2f_E} + \underbrace{\alpha_{12} \times E(t) \times \cos(\omega_{SA} t - 2\pi\phi_2)}_{2 \pm f_E},$$

where ω_A denotes the angular frequency of the annual cycle and ω_{SA} denotes the angular frequency of the semiannual cycle.

Because of the single sinusoidal ENSO frequency forcing (ω_E) with a given phase (ϕ_E), we can write the ENSO time series $E(t)$ with a given amplitude (α_E) in the following form (the second equation has been adjusted to guarantee a zero mean):

$$E(t) = \alpha_E \times \cos(\omega_E t - 2\pi\phi_E),$$

$$\hat{E}(t)^2 = E(t)^2 - 0.5 = \alpha_E^2 \times 0.5 \cos[2(\omega_E t - 2\pi\phi_E)].$$

We find that for the cases with nonoverlapping response frequencies, the estimated regression coefficients agree very well (SI Appendix, Table S2). We use these five experiments to calculate the averaged coefficients. The estimates clearly diverge for the experiments with $1/2 \text{ yr}^{-1}$ and $1/3 \text{ yr}^{-1}$ forcing frequencies, as the frequencies from different terms overlap (SI Appendix, Table S1). Using the averaged coefficients $\alpha_n(k-n)$ and ϕ_m (last line in SI Appendix, Table S2), we now reconstruct our theoretical index time series for each experiment, which includes all of the terms (linear, quadratic, and cubic) listed in the equations above. We find very high correlations ($R > 0.9$), high spectral coherence, and phase relationships between our reconstructions Ψ_c (refer to *Materials and Methods* for the reconstruction nomenclature) and the ensemble mean indices (SI Appendix, Figs. S2, S3, and S4 and Table S3), with the largest contribution to the correlation coming from the quadratic combination tones. Furthermore, we see that the full reconstruction captures well the NWP – AC(t) spectrum (Fig. 3F).

Application of the Concept

These results motivate us to test if we are also able to identify these higher-order combination tones in (i) an AGCM experiment

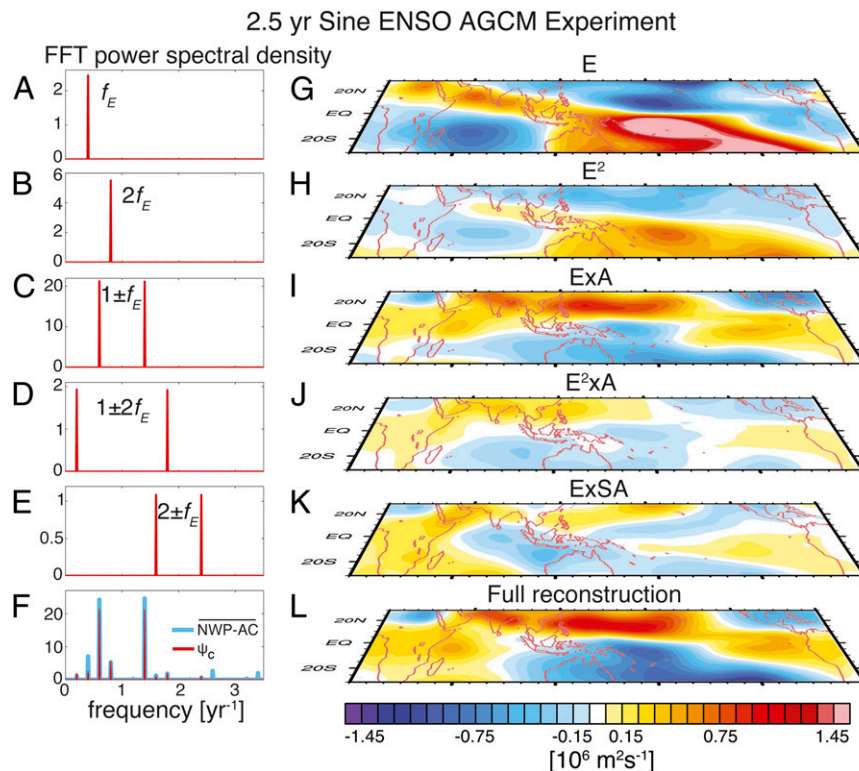


Fig. 3. (A–E) Power spectral density for the individual reconstruction components for the 2.5-y Sine ENSO AGCM experiment using the averaged coefficients using the fast Fourier transform (FFT) method. (F) Power spectral density for the anomalous ensemble mean circulation index NWP – AC(t) for this experiment (light blue lines) and the full reconstruction (red lines) using all of the terms depicted in A–E. (G–K) Regression coefficient of the normalized respective reconstruction component and the anomalous surface stream function of this experiment: (G) E, (H) E^2 , (I) ExA, (J) $E^2 \times A$, and (K) ExSA. (L) Regression coefficient of the normalized full reconstruction time series and the anomalous surface stream function of this experiment.

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