ENSO flavors in a tree-ring $δ^{18}$ O record of *Tectona grandis*

2 from Indonesia

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1516 **Abstract**

- 17 Indonesia's climate is dominated by the equatorial monsoon system, and has been linked to El
- Niño-Southern Oscillation (ENSO) events that often result in extensive droughts and floods
- over the Indonesian archipelago. In this study we investigate ENSO-related signals in a tree-
- 20 ring δ^{18} O record (1900-2007) of Javanese teak. Our results reveal a clear influence of Warm
- Pool (central Pacific) El Niño events on Javanese tree-ring δ^{18} O, and no clear signal of Cold
- Tongue (eastern Pacific) El Niño events. These results are consistent with the distinct impacts
- 23 of the two ENSO flavors on Javanese precipitation, and illustrate the importance of
- 24 considering ENSO flavors when interpreting palaeoclimate proxy records in the tropics, as
- 25 well as the potential of palaeoclimate proxy records from appropriately selected tropical
- 26 regions for reconstructing past variability of. ENSO flavors.

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1 Introduction

- 29 The tropical warm pool surrounding the Indonesian maritime continent (IMC) is a region of
- 30 homogenous sea surface temperatures where atmospheric deep convection occurs, and plays a
- 31 key role in the regulation of the global tropical climate (Clement et al., 2005; Pierrehumbert,
- 32 1995).

- 1 Indonesia's regional climate is governed by the Australian-Indonesian Monsoon (Wheeler and
- 2 McBride, 2005) and the associated seasonal movement of the Inter Tropical Convergence
- 3 Zone (ITCZ). Variations of the equatorial monsoon system significantly impact the livelihood
- 4 of over 230 million people living in the world's fourth most populated country.
- 5 The El Niño-Southern Oscillation (ENSO) phenomenon contributes to the rainfall pattern of
- 6 the IMC and has been thought to interact with the monsoons (e.g. Hendon, 2003; Lau and
- Nath, 2000). Recent studies have drawn attention to the existence of more than one variant or
- 8 'flavors' of El Niño (the warm phase of ENSO) (Ashok et al., 2007; Kug et al., 2009; Larkin
- 9 and Harrison, 2005; Ren and Jin, 2011; Takahashi et al., 2011). The canonical El Niño
- 10 (Sarachik and Cane, 2010), also referred to as eastern Pacific (EP) El Niño (Kao and Yu,
- 2009) or Cold Tongue El Niño (Kug et al., 2009; Ren and Jin, 2011), exhibits SST anomalies
- 12 localized in the eastern equatorial Pacific. The El Niño variant with maximum SST anomalies
- located in the central equatorial Pacific is referred to as the central Pacific (CP) El Niño (Kao
- and Yu, 2009), Warm Pool (WP) El Niño (Kug et al., 2009; Ren and Jin, 2011), date line El
- Niño (Larkin and Harrison, 2005) or El Niño Modoki (Ashok et al., 2007; Takahashi et al.,
- 16 2011). In this study we use the terms Cold Tongue (CT), and Warm Pool (WP) El Niño (Ren
- and Jin, 2011) to describe these two ENSO flavors.
- 18 Identifying the mechanisms responsible for the CT and WP ENSO flavors is an active field of
- 19 research. At present, there is no consensus on whether a reported increase in the frequency
- and intensity of WP ENSO events in recent decades (Ashok et al., 2007; Kao and Yu, 2009;
- 21 Kug et al., 2009; Lee and McPhaden, 2010) is a result of anthropogenic greenhouse gas
- forcing (Yeh et al., 2009), or natural variability (McPhaden et al., 2011; Newman et al.,
- 23 2011). In addition, the simulation of ENSO flavors in Global Climate Models (GCMs) is still
- subject to limitations in our understanding of the phenomenon. Consequently, there is much
- 25 uncertainty about whether ENSO activity will be enhanced or damped in the future, or if the
- 26 relative frequency of ENSO flavors will change (Collins et al., 2010). Long records of ENSO
- 27 activity are essential for identifying trends and multidecadal changes in the patterns of sea
- 28 surface temperature associated with ENSO, making palaeoclimate reconstructions particularly
- attractive for shedding light onto the past and future of ENSO flavors.
- 30 Recent research on ENSO-proxy teleconnections recommends, that when interpreting proxy
- data, differences in the influence of the two ENSO flavors on SST, precipitation and salinity
- 32 should be taken into account (Karamperidou et al., 2015). Certain regions like Java lie in key
- 33 locations where interannual precipitation variability is significantly correlated to one ENSO
- 34 flavor but not the other (see Fig. 1). Thus, long-term rainfall proxies from Java can be useful

- 1 for distinguishing between ENSO flavors, and for studying their relation to monsoon
- 2 variability.
- 3 Over the last decade there have been several attempts to reconstruct continuous time series of
- 4 ENSO variability using different proxy archives such as corals (e.g. Abram et al., 2008;
- 5 Charles et al., 2003; Cobb et al., 2013; Evans et al., 2002; Linsley et al., 2004; Pfeiffer et al.,
- 6 2009; Quinn et al., 2006; Wilson et al., 2006), tree-ring widths (e.g. D'Arrigo et al., 2005;
- 7 Fowler et al., 2012; Stahle et al., 1998) or tree-ring stable isotopes (Sano et al., 2012).
- 8 Furthermore, several multi-proxy reconstructions of ENSO variability are available (e.g.
- 9 Braganza et al., 2009; D'Arrigo et al., 2006; Emile-Geay et al., 2013; Mann et al., 2000;
- Wilson et al., 2010). However, many of these reconstructions are based on extratropical proxy
- records, particularly from tree-ring widths, and thus do not represent ENSO activity directly.
- 12 Tree-ring stable isotopes often provide additional climate information where the more
- commonly used tree-ring proxies (e.g., ring width and maximum latewood density) do not, or
- where the teleconnection signal is weak. In tropical regions, oxygen isotope data from tree
- rings ($\delta^{18}O_{TR}$) are often more sensitive to precipitation than ring width (e.g. Brienen et al.,
- 16 2012; Schollaen et al., 2013). $\delta^{18}O_{TR}$ data are primarily controlled by the isotopic composition
- of precipitation, i.e. the source water, and relative humidity (e.g. Barbour, 2007; McCarroll
- and Loader, 2004). The isotopic composition of precipitation ($\delta^{18}O_{Pre}$) depends on a number
- of factors, the so-called 'kinetic isotope effects' (Araguás-Araguás et al., 2000). One of these
- 20 effects, 'the amount effect', is the inverse correlation between rainfall amount and $\delta^{18}O_{Pre}$
- values, and a crucial driver in determining $\delta^{18}O_{Pre}$ values in the tropics (e.g. Brienen et al.,
- 22 2012; Zhu et al., 2012). Thus $\delta^{18}O_{TR}$ records offer a promising approach to examine monsoon
- 23 activity, and large-scale climate variations such as ENSO.
- 24 In previous studies we investigated relationships between seasonal rainfall variability and
- 25 tree-ring stable isotope records from Javanese teak trees on inter- to intra-annual time scales
- 26 (Schollaen et al., 2014; Schollaen et al., 2013). In this study we explore the signal strength of
- 27 ENSO flavors in our annually resolved $\delta^{18}O_{TR}$ record from Java, the only well replicated,
- centennial δ^{18} O record from Javanese teak in existence. We place particular emphasis on the
- 29 time stability of the teleconnected δ^{18} O/ENSO relationship. To the best of our knowledge this
- 30 is the first time the relationship between tree-ring proxies and the two ENSO flavors has been
- 31 tested. We find a unique WP El Niño signal in the $\delta^{18}O_{TR}$ record from Java, supporting the
- 32 notion that proxies from carefully selected regions are valuable for answering questions of
- past and present ENSO variability, and for constructing reliable ENSO reconstructions.

2 Data and Methods

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2.1 Proxy data and site description

We use a tree-ring δ^{18} O chronology from a lowland rainforest in the eastern part of Central 3 Java, Indonesia (07°52'S, 111°11'E; 380 m a.s.l.), spanning the period 1900-2007. The $\delta^{18}O_{TR}$ 4 5 record is built from resin-extracted wood of 7 teak (Tectona grandis) trees, collected from the 6 Donoloyo Cagar Alam (site DNLY in D'Arrigo et al., 2006) shown as green lines in Fig. 2. The according TRW chronology dates back to AD 1714. This $\delta^{18}O_{TR}$ chronology and its 7 dendroclimatological potential as a rainfall indicator has been described in detail in Schollaen 8 9 et al. (2013). Indonesia receives significant rainfall year-round but experiences a distinct wet 10 and dry season. The wet season (approx. October/November to April/May) coincides with 11 movement of the Inter-Tropical Convergence Zone to the Southern Hemisphere, while the dry 12 season (June to September) corresponds with a predominance of dry southeasterly winds from Australia (Aldrian et al., 2007). The isotopic composition of precipitation ($\delta^{18}O_{Pre}$) over Java 13 shows that distinct seasonal changes are linked to rainfall amount resulting in high $\delta^{18}O_{Pre}$ 14 values during the dry season, and low $\delta^{18}O_{Pre}$ values during the rainy season (Fig. 5b, 15 16 Schollaen et al., 2014). Instrumental records (e.g. Aldrian and Susanto, 2003; Allan, 2000; 17 Haylock and McBride, 2001) and reanalysis products (Aldrian et al., 2007; Jourdain et al., 18 2013) show rainfall anomalies in Indonesia are affected by ENSO: During a warm ENSO 19 phase (El Niño events) the tropospheric air flow (Walker Circulation) weakens and the 20 Indonesian Low pressure system migrates eastward into the tropical Pacific, resulting in 21 drought over much of the country. Conversely, a cold ENSO phase (La Niña events) brings 22 excess rain to the region (Sarachik and Cane, 2010). Several analyses of Indonesian rain 23 gauge data show that Indonesian rainfall is poorly correlated with ENSO events during the 24 wet monsoon season, but reveal highest coherence during the dry season and transition 25 months prior to the wet season (June to November) (Haylock and McBride, 2001; Hendon, 26 2003). However, taking the IMC and surrounding oceanic rainfall into account, rainfall during 27 the wet season is also related to ENSO (Fig. 8a, Jourdain et al., 2013). 28 In this study, we further show that precipitation anomalies in Java are sensitive to ENSO 29 flavors. Fig. 1 shows the relationship between precipitation data and the WP and CT ENSO 30 indices (see Sect. 2.2 for definition of the indices) for the IMC and Pacific region. WP El 31 Niños are associated with drought over Java (Fig. 1, upper panel), and have a strong influence 32 on the Australian-Indonesian monsoon system (e.g. Kumar et al., 2006; Taschetto and England, 2009). On the other hand, Java lies on the nodal line of influence of CT El Niños 33 34 (Fig. 1, lower panel), which makes it a key location for obtaining records able to distinguish

- between the two ENSO flavors. The average regression coefficient between monthly
- 2 precipitation anomalies over Java and the WP ENSO index is -0.83 mm/day, while for CT
- 3 ENSO it is -0.03 mm/day (non-significant).
- 4 The growing season for teak in Central and Eastern Java occurs mostly during the wet season,
- 5 from October to May (Coster, 1928, 1927; Geiger, 1915; Schollaen et al., 2013). In all
- 6 subsequent analysis, we use the southern hemisphere convention, which assigns to each tree
- 7 ring the year in which radial growth begins (Schulman, 1956). Thus lag-0 refers to the year n
- 8 where tree growth starts: Oct_n -Sep_{n+1}. Lag-1 refers to Oct_{n-1} -Sep_n.

2.2 Definition of ENSO flavors

- In the following, we use the global SST dataset of Kaplan et al. (1998). To calculate indices
- for the two ENSO flavors we use the coordinate transform of the NINO3-NINO4 phase space
- proposed by Ren and Jin (2011) and shown in Equation 1.

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$$N_{CT} = N_3 - \alpha N_4 \atop N_{WP} = N_4 - \alpha N_3, \quad \alpha = \begin{cases} 2/5 \ if \ N_3 \cdot N_4 > 0 \\ 0 \ otherwise \end{cases}$$
 (1)

- 14 where N_{CT}, N_{WP} are the indices for CT and WP ENSO , and N₃, N₄ are the NINO3 and
- NINO4 indices, i.e. the SST anomaly averaged over the regions [5N-5S, 150W-90W] and
- 16 [5N-5S, 160E-150W] respectively. The timeseries of the two indices N_{CT} , N_{WP} are shown in
- 17 Figure 2a and b (January values). When a Warm Pool event occurs (e.g. 1994-95), SST
- anomalies are mostly concentrated in the NINO4 region, and therefore the N_{CT} index resulting
- 19 from Equation 1 is very small. In contrast, the N_{WP} index, which is dominated by the NINO4
- anomalies, is large and, thus, the event is classified as a Warm Pool event. The opposite
- occurs during large Cold Tongue events (e.g. 1976-77, 1982-83, and 1997-98): NINO3
- 22 anomalies dominate NINO4, and thus the N_{WP} index is very small compared to N_{CT}, and the
- event is classified by Equation 1 as a Cold Tongue event. As shown in detail in Ren and Jin
- 24 (2011), the two indices are able to capture the SST anomaly patterns that characterize the two
- 25 ENSO flavors, as well and their variability in the 20th century. No significant differences were
- 26 found when using alternative indices (Ashok et al., 2007; Takahashi et al., 2011) for
- 27 calculating ENSO flavors (not shown here). Distinguishing between the two corresponding
- 28 types of La Niña events, as advocated by Kao and Yu (2009) and Ashok and Yamagata
- 29 (2009), may not be necessary because the SST and precipitation patterns of the two La Niña
- 30 types are not very distinctive (Kug and Ham, 2011) and the SST anomalies during La Niña
- 31 events generally tend to propagate westward. Therefore a single index (NINO4) suffices to

- 1 capture La Niña events, as shown in Figure 2c, and a coordinate transform of two indices (as
- 2 in equation 1 above) is not necessary.
- 3 For subsequent analyses we use the January (Jan_{n+1}) indices for the ENSO flavors, for the
- 4 timespan 1900–2007. We focus on the month January as that represents the month with
- 5 highest precipitation during the rainy season at the study site. Here, our $\delta^{18}O_{TR}$ record
- 6 correlates the best with regional rainfall data (Schollaen et al., 2013). We classify each year as
- 7 CT, or WP when N_{CT}, or N_{WP} are greater than one standard deviation of the respective
- 8 monthly index. We classify a year as La Niña (LN) when NINO4 is negative by less than one
- 9 standard deviation of the monthly NINO4 index. Table 1 shows the list of years classified as
- 10 CT, WP, and LN according to the above criteria.

2.3 ENSO signal assessment

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- 12 To assess the long-term temporal stability of the ENSO signal, running 31-year correlations
- 13 were calculated between the $\delta^{18}O_{TR}$ record and the varying ENSO flavors. A Kalman filter
- analysis was also used as a time-dependent regression-modeling tool to test the temporal
- stability of the relationship between the $\delta^{18}O_{TR}$ record and the two ENSO flavors. In contrast
- 16 to the running correlation procedure, the Kalman filter method uses maximum likelihood
- estimation to objectively test for the identification of time-dependence between predictor and
- predicted variables (see Visser and Molenaar (1988) for details, and Cook et al. (2002), Cook
- 19 et al. (2013) or Wilson et al. (2013) for examples).
- 20 Furthermore, probability density functions of the correlation between $\delta^{18}O_{TR}$ variability and
- 21 the different ENSO phases (WP, CT and LN), as well as during neutral conditions, were
- 22 calculated. We classify neutral conditions when CT or WP are not greater than one standard
- 23 deviation of the respective monthly index and when LN is negative by more than one standard
- 24 deviation of the monthly NINO4 index. Finally, the spectral properties of the $\delta^{18}O_{TR}$ proxy
- 25 time series were analyzed (Schulz and Mudelsee, 2002) and wavelet coherency analysis
- performed (Grinsted et al., 2004; Torrence and Compo, 1998).

3 Results

- Monthly and seasonal correlations between the Javanese $\delta^{18}O_{TR}$ record (Fig. 2, green line in
- 29 all plots) and ENSO flavors (see section 2.2) were computed for both the concurrent year
- 30 (lag-0) and the year prior to tree growth (lag-1) (Table 2). Statistically significant (95% level
- or higher) positive correlations were found between WP El Niño and the concurrent rainy
- season (Oct_n-May_{n+1}, r=0.26). Correlations are strongest with Jan_{n+1} (r=0.35), the period of
- maximum rainy season precipitation. Furthermore, there is a significant correlation with lag-1

- January precipitation (Jan_n r=0.22), indicating a WP El Niño influence on tree growth in the
- 2 following year. Statistically significant negative correlations were found for La Niña events in
- January (Jan $_{n+1}$, r=-0.25) (Table 2). No positive correlation was found between the tree-ring
- 4 proxy and the CT ENSO index (Table 2). As noted, the CT ENSO flavor has a weaker
- 5 influence over Java (Fig. 1), therefore we expected the lag-0 correlation to be insignificant.
- 6 For reference, we also present the correlation with the standard ENSO index NINO3.4, which
- 7 shows no significance.
- 8 Although the $\delta^{18}O_{TR}$ record correlates significantly (p<0.05) with ENSO flavors, the response
- 9 is not stationary. Fig. 2 presents the running 31-year correlation and Kalman filter analysis
- 10 between the varying ENSO flavors and the tree-ring proxy for the period of highest
- 11 correlation (see Table 2). The teleconnection with Jan_{n+1} WP ENSO is strong and significantly
- positive from the 1950s until present, with running correlations reaching 0.6, and an r of 0.45
- for AD 1950-2007 (p<0.001) (Fig. 2a). However, before 1950 the correlation falls to zero,
- and even becomes negative. The Kalman filter time-varying regression coefficients (beta
- weights) follow the same trend as the correlation values and reinforce the time dependency of
- the teleconnection. From 1950 onwards, the lower limits do not cross zero, which means that
- 17 the beta weights are considered statistically significant. However, the correlation weakens
- slightly again in the beginning of the 21th century. The relationship with Jan_{n+1} NINO4 (used
- 19 here to primarily capture La Niña events) (Fig. 2c) is also time dependent with weak
- 20 correlations before 1950 and after 2000, but a significant negative relationship in the second
- 21 half of the century with r=-0.37 (p<0.01).
- The fingerprints of the ENSO flavors in the $\delta^{18}O_{TR}$ record can be seen in the probability
- 23 density function (PDF) of $\delta^{18}O_{TR}$ anomalies (Fig. 3) conditioned on ENSO phase. The $\delta^{18}O_{TR}$
- 24 probability mass for WP El Niño is skewed towards positive anomalies associated with dry
- conditions. By contrast, the PDF for CT El Niño events exhibits bimodality with peaks in
- both positive and negative $\delta^{18}O_{TR}$ anomalies, suggesting this record is not a good proxy for
- 27 CT El Niño variability.
- To further investigate expressions of ENSO variability in the $\delta^{18}O_{TR}$ record we performed
- spectral analysis (Fig. 4a). Spectral analysis of the $\delta^{18}O_{TR}$ record reveals a broad peak at 2–4
- 30 years, falling within the classic ENSO bandwidth (Sarachik and Cane, 2010) as well as
- 31 significant, decadal-to-multidecadal variability (12.5 years). Wavelet coherence analysis
- 32 between the proxy record and the WP ENSO and CT ENSO index (Fig. 4b,c) indicates that
- 33 the coherence varies in time across most spectral bands. The periods of greatest coherence in

- 1 time occur on inter-annual timescales (2-4 years), again spanning the classic ENSO
- 2 bandwidth. We found no significant coherence with CT ENSO index as expected.

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4 Discussion

- 5 The positive correlation pattern between the $\delta^{18}O_{TR}$ record and the WP ENSO index, as well
- 6 as the negative correlation with La Niña events, supports the conclusion in Schollaen et al.
- 7 (2013) that the formation of annual δ^{18} O in Javanese teak trees is dominated by precipitation
- 8 patterns. El Niño events are linked to drought conditions over the IMC coinciding with
- 9 increased δ^{18} O values in the tree-ring proxy (Figs 2, 3). The opposite occurs during La Niña
- 10 events.
- 11 The PDFs illustrate a clear WP El Niño and a less strong La Niña signal, with really dry years
- linked to WP El Niños. In contrast, no clear CT El Niño signal is preserved in the $\delta^{18}O_{TR}$
- 13 record, as indicated by the bimodality in the corresponding PDF. The different seasonal
- rainfall signals (wet and dry season rainfall) in the $\delta^{18}O_{TR}$ record are damped in the annually
- 15 resolved proxy due to seasonally alternating isotope signatures in $\delta^{18}O$ of precipitation
- 16 (Schollaen et al., 2013). Thus, CT El Niño signals seem to be obscured when followed by a
- 17 La Niña event. This is the case for the strong CT El Niño event in 1982/83 that was followed
- by a La Niña, resulting in a low $\delta^{18}O_{TR}$ value (Fig. 2b, 2c). High-resolution intra-annual
- $\delta^{18}O_{TR}$ analyses help to disentangle the contrasting isotope effects of dry and rainy season
- rainfall patterns, as demonstrated in Schollaen et al. (2014). We conclude that the annually
- 21 resolved tree-ring proxy is suitable for distinguishing between WP El Niño and La Niña, but
- 22 not for CT El Niños. Correlation tests (Table 2) with a standard ENSO index (such as
- NINO3.4) show no correlation with the tree-ring record, as this index captures mixed signals
- 24 from both ENSO flavors. Overall, the strongest and most significant ENSO signal in the tree-
- 25 ring proxy data is that of WP El Niño.
- Our analysis shows that the teleconnections described above are not stationary (Figs 2, 4).
- 27 There is a drop in correlation in the first half of the 20th century. One can speculate this
- 28 weakening teleconnection is related to the pattern of relatively weak and irregular ENSO
- activity in the middle of the 20th century (Tudhope et al., 2001). Arguably, there may be other
- 30 factors (e.g. Indian Ocean Dipole Mode) determining wetter or drier conditions in this period
- and the ENSO phenomenon may play a secondary role. In recent decades, a climate regime
- transition has preceded periods of strong and sustained ENSO events (e.g. O'Kane et al.,
- 2014), leading to a stronger ENSO fingerprint in the $\delta^{18}O_{TR}$ record. Furthermore, Chang et al.

- 1 (2004) reveal an interdecadal trend of increasing correlations between Indonesian monsoon
- 2 rainfall and ENSO beginning in the late 1970s.
- 3 The $\delta^{18}O_{TR}$ record is a rainfall indicator for wet and dry season rainfall, albeit largely
- 4 dominated by the wet season signal (Schollaen et al., 2013). Note, that the "amount effect"
- 5 leads to different isotopic signatures in $\delta^{18}O_{TR}$ values during wet and dry season. Thus, the
- 6 dry season rainfall signal, which tends to have the highest coherence with ENSO, is damped
- 7 in the annually resolved $\delta^{18}O_{TR}$ record by the following wet season signal. This may explain
- 8 the low correlation between the tree-ring proxy and June to November ENSO indices. To
- 9 distinguish the causes of inter-annual rainfall variability across Java future work needs to
- 10 focus on high-resolution $\delta^{18}O_{TR}$ records.

5 Conclusions

- 12 In this study we used a $\delta^{18}O_{TR}$ chronology from teak (*Tectona grandis*) that correlates
- significantly with regional precipitation over Java (Schollaen et al., 2013) to examine various
- manifestations of ENSO. This is the first time a high-resolution $\delta^{18}O_{TR}$ record is used to
- detect signals of ENSO flavors in palaeoclimatic data as argued by Karamperidou et al.
- 16 (2015). These results indicate the potential for generating reconstructions of different ENSO
- 17 flavors from high-resolution intra-annual δ^{18} O records from appropriately selected regions,
- 18 such as Java. Such palaeoclimatic records may help answer the many remaining questions
- 19 surrounding the diversity of ENSO activity and past ENSO variability. In addition, the
- 20 conclusions of our study call for caution when attempting to interpret proxy records using
- 21 ENSO indices that are not able to distinguish between the two flavors (e.g. single standard
- indices such as NINO3.4). As shown here, single ENSO indices may capture mixed signals
- 23 from both flavors, resulting in lower correlations with proxies and thus confounding
- 24 paleoclimate reconstruction attempts. Furthermore, performing model-proxy comparisons
- using single ENSO indices may be misleading. For example, in multi-proxy reconstructions
- 26 where proxies from different regions can be synthesized to reconstruct past ENSO variability
- it is important to account for the distinct (and often of opposite sign) influence of two flavors:
- 28 convoluting their signals by using a single ENSO index can lead to potential misinterpretation
- of significant changes in past ENSO variability, as in the case of mid-Holocene (6ka BP)
- 30 coral proxies from the central Pacific (Karamperidou et al., 2015).
- Last, our study calls for more emphasis on sampling long-term terrestrial $\delta^{18}O_{TR}$ records at
- 32 seasonal and monthly resolution from selected regions such as northern or eastern Indonesia.
- 33 Such high-resolution terrestrial $\delta^{18}O_{TR}$ records may have stronger correlations with ENSO

- 1 flavors, and thus be appropriate for robust reconstructions of wet and dry season rainfall and
- 2 of past variability of the two ENSO flavors.

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- Table 1. Classification into ENSO flavors and phase based on Jan_{n+1} values (see section 2.2).
- Note the use of the southern hemisphere convention (Schulman, 1956), i.e. year n refers to
- $3 \quad Jan_{n+1}.$

ENSO	Years										
classification											
WP	1900	1902	1904	1907	1913	1927	1929	1939	1941	1957	1958
	1968	1978	1979	1987	1990	1994	2001	2002	2003	2004	
CT	1905	1911	1914	1918	1919	1923	1925	1930	1940	1965	1972
	1976	1982	1986	1991	1997						
LN	1909	1916	1917	1920	1924	1933	1938	1942	1949	1955	1970
	1973	1975	1983	1988	1998	1999	2000	2005	2007		

1 Table 2. Correlation values between the annually resolved $\delta^{18}O_{TR}\,record$ and climate months

- 2 of different ENSO flavors and the standard NINO3.4 and La Niña index (NINO4*(-1)) for the
- 3 period from the year prior to growth (lag-1) to the current year (lag-0) and seasonal means
- 4 (calculated over the 1900-2007 period). (**: p < 0.001, *: p < 0.01, bold: p < 0.05).

Climate months	WP El Niño	CT El Niño	NINO3.4	La Niña
lag1 lag0				
$Oct_{n-1} \mid Oct_n$	0.12 0.21	-0.18 -0.03	-0.10 0.08	0.00 -0.14
$Nov_{n-1} \mid Nov_n$	$0.17 \mid 0.17$	-0.23 - 0.01	-0.13 0.05	0.00 -0.12
$\mathrm{Dec}_{\mathrm{n-1}} \mid \mathrm{Dec}_{\mathrm{n}}$	$0.18 \mid 0.18$	-0.20 0.04	-0.11 0.10	-0.01 -0.15
$Jan_n \mid Jan_{n+1}$	0.22 0.35**	-0.19 -0.01	-0.07 0.12	-0.06 -0.25 *
$Feb_n \mid Feb_{n+1}$	0.15 0.29*	-0.15 -0.06	-0.07 0.09	-0.05 -0.21
$Mar_n \mid Mar_{n+1}$	0.05 0.21	-0.17 -0.12	-0.10 0.02	0.03 -0.12
$Apr_n \mid Apr_{n+1}$	0.14 0.21	-0.21 - 0.09	-0.12 0.01	-0.02 -0.15
$May_n \mid May_{n+1}$	0.12 0.20	-0.14 -0.11	-0.06 -0.01	-0.03 -0.12
$Jun_n \mid Jun_{n+1}$	0.14 0.08	-0.07 -0.06	0.00 -0.03	-0.08 -0.03
$Jul_n \mid Jul_{n+1}$	$0.12 \mid 0.16$	-0.02 -0.08	0.05 -0.03	-0.09 -0.10
$\operatorname{Aug}_n \mid \operatorname{Aug}_{n+1}$	0.11 0.10	-0.02 -0.07	0.07 -0.03	-0.10 -0.05
$Sep_n \mid Sep_{n+1}$	0.17 0.01	-0.05 -0.05	0.03 -0.06	-0.11 0.02
peak wet season (Jan _{n+1})	0.35**			-0.25*
$\mathrm{Dec}_{\mathrm{n}} ext{-}\mathrm{Feb}_{\mathrm{n+1}}$	0.27*			-0.21
wet season (Oct_n-May_{n+1})	0.26*			

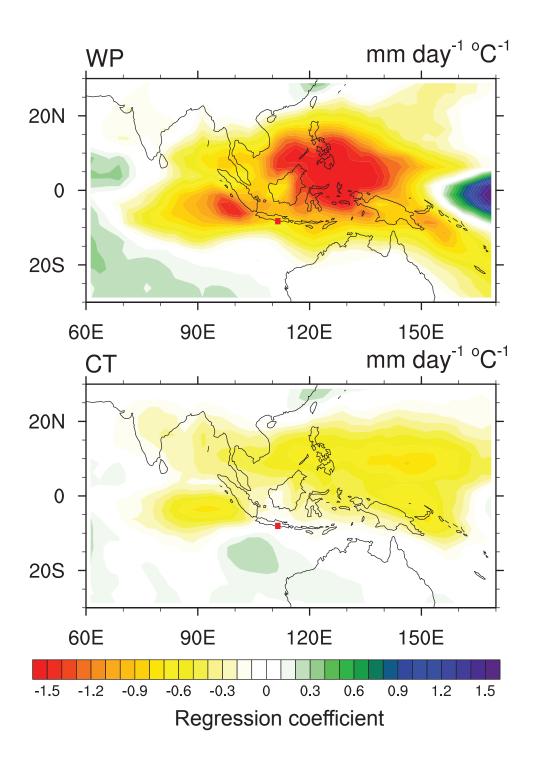


Figure 1. Regression coefficients (mm day⁻¹ °C⁻¹) of monthly precipitation on the Warm Pool (WP) and the Cold Tongue (CT) ENSO index. The two indices are computed as per Ren and Jin (2011) (1). Precipitation data are from the GPCP (Adler et al., 2003), for the period 1987-2010. The tree-ring site is marked with a red square.

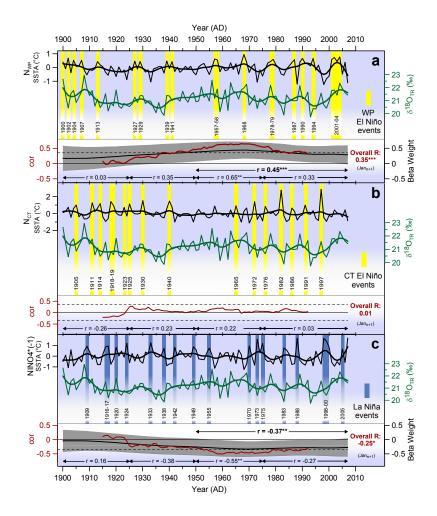


Figure 2. Time series of the $\delta^{18}O_{TR}$ chronology (green) and the January (Jan_{n+1}) indices of (a) Warm Pool ENSO (N_{WP}), (b) Cold Tongue ENSO (N_{CT}), and (c) negative NINO4 index (NINO4*(-1), used here as a La Niña index. The WP and CT ENSO indices are computed as per Ren and Jin (2011) (1). Thick lines denote 10-year cubic smoothing spline. In the lower part of each figure the running 31-year correlation (red) is shown. Dashed horizontal line indicates the 95% confidence level. Also shown are the results from a Kalman filter analysis (black line) used as a dynamic regression-modeling tool. Grey shading denotes \pm 2 standard error limits of the beta weights. Where the limits do not cross zero, the regression relationship are considered statistically significant (p=95%). ENSO events based on classification of Table 1 are highlighted in yellow (El Niño) and blue (La Niña), respectively. (***p < 0.001, **p < 0.01, *p < 0.05).

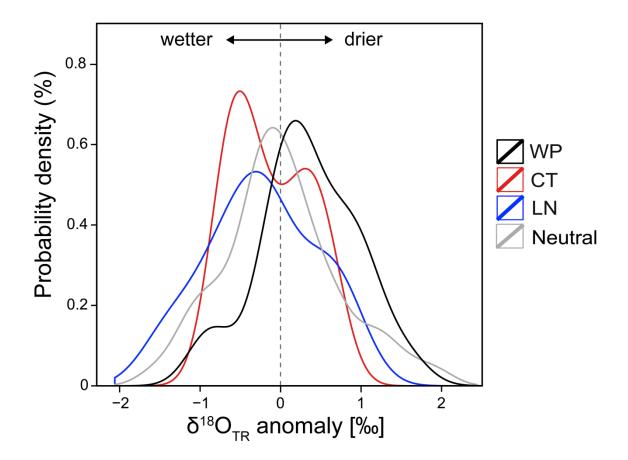


Figure 3. Probability density function of tree-ring δ^{18} O variability conditional on different ENSO phases: Warm Pool El Niño (WP, black line), Cold Tongue El Niño (CT, red line), La Niña (LN, blue line) and neutral conditions (grey line). For the construction of the PDF, we use January-February (Jan_{n+1}Feb_{n+1}) time-averaged values; the events considered for each conditional PDF are shown in Table 1.

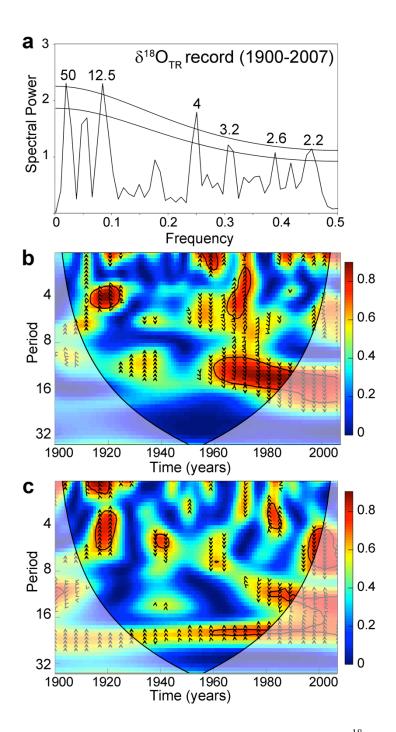


Figure 4. (a) Spectral analysis (Schulz and Mudelsee, 2002) of the $\delta^{18}O_{TR}$ chronology from 1900 to 2007. 90% and 95% confidence levels are indicated. (b) Wavelet coherence transform comparing shared variance as a function of frequency between $\delta^{18}O_{TR}$ record and Warm Pool (WP) ENSO index (Jan_{n+1}) and (c) Cold Tongue (CT) ENSO index (Jan_{n+1}) for 1900 to 2007. The wavelet coherence illustrating temporal frequency coherence between the time series at given periods. The thick black contour designates where time series share significant coherence (p=95%) and the cone of influence where edge effects might distort the picture is shown as a lighter shade. Arrows indicate the phase relationship between series with in-phase pointing right and antiphase pointing left.