

# The influence of carbonate platform interactions with subduction zone volcanism on palaeo-atmospheric CO<sub>2</sub> since the Devonian

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## Abstract

The CO<sub>2</sub> liberated along subduction zones through intrusive/extrusive magmatic activity and the resulting active and diffuse outgassing influences global atmospheric CO<sub>2</sub>. However, when melts derived from  
15 subduction zones intersect buried carbonate platforms, decarbonation reactions may cause the contribution to atmospheric CO<sub>2</sub> to be far greater than segments of the active margin that lacks buried carbon-rich rocks and carbonate platforms. This study investigates the contribution of carbonate-intersecting subduction zones (CISZ) to palaeo-atmospheric CO<sub>2</sub> levels over the past 410 million years by integrating a plate motion and plate boundary evolution model with carbonate platform development  
20 through time. Our model of carbonate platform development has the potential to capture a broader range of degassing mechanisms than approaches that only account for continental arcs.

Continuous and cross-wavelet analyses as well as wavelet coherence are used to evaluate trends between the evolving lengths of carbonate-intersecting subduction zones, non-carbonate-intersecting subduction zones and global subduction zones, and are examined for periodic, linked behaviour with the proxy-CO<sub>2</sub>  
25 record between 410 Ma and the present. Wavelet analysis reveals significant linked periodic behaviour between 60-40 Ma, where CISZ lengths are relatively high and are correlated with peaks in palaeo-atmospheric CO<sub>2</sub>, characterised by a 32-48 Myr periodicity and a ~8-12 Myr lag of CO<sub>2</sub> peaks following CISZ length peaks. The linked behaviour suggests that the relative abundance of CISZs played a role in

affecting global climate during the Palaeogene. In the 200-100 Ma period, peaks in CISZ lengths align with peaks in palaeo-atmospheric CO<sub>2</sub>, but CISZ lengths alone cannot be determined as the cause of a warmer Cretaceous-Jurassic climate. Nevertheless, across the majority of the Phanerozoic, feedback mechanisms between the geosphere, atmosphere and biosphere likely played dominant roles in modulating climate. Our modelled subduction zone lengths and carbonate-intersecting subduction zone lengths approximate magmatic activity through time, and can be used as input into fully-coupled models of CO<sub>2</sub> flux between deep and shallow carbon reservoirs.

## 1 Introduction

The current paradigm of the deep carbon cycle (i.e. the planetary cycling of carbon over million-year timescales) attributes fluctuations in the atmospheric carbon dioxide (CO<sub>2</sub>) to the realm of tectonic forces, where subduction-related emissions (van der Meer et al., 2014; Kerrick, 2001) and metamorphic decarbonation (Lee et al., 2013) are major CO<sub>2</sub> sources, and the processes of silicate weathering (Sundquist, 1991; Kent and Muttoni, 2008), seafloor weathering (Brady and Gislason, 1997; Krissansen-Totton and Catling, 2017) and marine organic carbon burial (Bernier and Caldeira, 1997; Ridgwell and Zeebe, 2005) are major sinks removing CO<sub>2</sub> from the atmosphere. Subduction plays a critical role in this cycle. In a dynamic interplay, oceanic lithosphere is consumed at subduction zones, removing carbon bound in pelagic carbonate seafloor sediments from the exogenic carbon cycle. Simultaneously, CO<sub>2</sub> is emitted through diffuse outgassing and arc volcanism along subduction zones (Keleman and Manning, 2015). Recent studies have found support for links between periods of increased global arc activity and warmer global climates using detrital zircon ages, modelling and experimental techniques, particularly as drivers of greenhouse conditions in the Cambrian (McKenzie et al., 2016; Cao et al., 2017), Jurassic-Cretaceous (McKenzie et al., 2016) and early Palaeogene (Lee et al., 2013; Carter and Dasgupta, 2015; Cao et al., 2017). Moreover, it has been postulated that the relationship between arc activity and climate is periodic, relating to ~50 Myr global flare-ups along extended segments of arcs (Lee and Lackey, 2015) as well as continent assembly and dispersal which cause transitions from intraoceanic-arc- to continental-arc-dominated states (Lenardic et al., 2011; Lee et al. 2013). However, it is difficult to test this hypothesis, especially due to poor preservation of ancient intra-oceanic arc rocks (Bernier, 2004).

Recently, carbon and helium isotope analysis from modern volcanic arc gas has provided evidence that volcanic arcs that assimilate crustal carbonate in their magmas through decarbonation reactions have a greater atmospheric CO<sub>2</sub> contribution than other types of arcs (Mason et al., 2017). Modern crustal carbonate reservoirs are a result of global organic and inorganic carbonate production throughout the Phanerozoic, which has contributed to the build-up of expansive, shallow-water carbonate sequences including ramps and rimmed shelves along continental margins, hereafter referred to as ‘carbonate platforms’ (Kiessling et al., 2003). At different points in Earth’s history, active (from extrusive volcanism) and passive (from intrusive magmatism) emissions from arcs along carbonate-intersecting subduction zones (CISZ) may have dominated global carbon flux from all subduction zones, such as during the Cretaceous (144-65 Ma) where continental arcs are hypothesised to have been longer than modern day lengths and where a greenhouse climate prevailed (Lee et al., 2013; van der Meer et al., 2014; Cao et al., 2017). We investigate this hypothesis using wavelet analysis, which attempts to detect correlations and periodicities in two time series, namely climate proxy data and subduction zone lengths, at any scale or duration (Grinsted et al., 2004).

Specifically, we apply cross-wavelet analysis and wavelet coherence to investigate whether the CO<sub>2</sub> flux from carbonate-intersecting subduction zones is significantly different to the flux from the remainder of subduction zones that do not intersect with buried carbonate reservoirs (non-CISZ) in influencing global palaeo-atmospheric CO<sub>2</sub> concentrations since the Devonian (410 Ma). We define CISZ CO<sub>2</sub> flux as the sum of active volcanism and passive outgassing along arcs that develop at subduction zones which intersect buried carbonate platforms in the overriding lithosphere. Non-CISZ CO<sub>2</sub> flux includes all volcanic CO<sub>2</sub> emissions from all subduction zones that exist where subduction zones are not intersecting carbonate platforms (Figure 1a).

A study by Cao et al. (2017) also endeavoured to apply regional geology in combination with palaeogeographic maps to explore the distribution of continental arcs through space and time in a plate tectonic framework. However, Cao et al. (2017) show conservative estimates of continental arc lengths, and may underestimate the lengths and duration of some arcs. The approach we propose measures

subduction zone lengths as opposed to arc lengths, and therefore may capture some carbonate-intersecting arcs that the Cao et al. (2017) model may miss.

Furthermore, wavelet analysis is used to deconvolve two time series at a time (e.g. our CISZ and non-CISZ lengths with the palaeo-atmospheric CO<sub>2</sub> record by Foster et al. (2017)) to uncover any periodicities or correlations. Compared to other techniques that find time-dependent correlations between two signals such as the windowed Fourier transform, the wavelet transform is preferable because it is localised (bounded) in both time and frequency, whereas Fourier transforms are only localised in frequency (Torrence and Compo, 1998). Hence, the wavelet transform can better constrain correlations in time and is better-suited than the Fourier transform to approximating data with sharp discontinuities, such as those addressed in this investigation.

This paper is accompanied by an open-source ‘subduction zone analysis toolkit’ (Doss et al., 2016), including a model of spatio-temporal carbonate platform accumulation that extends from the Precambrian, to help enable the use of digital plate motion models (e.g. Matthews et al., 2016) and other tools to investigate aspects of the deep carbon cycle.

## 15 **2 Modelling subduction zones evolution**

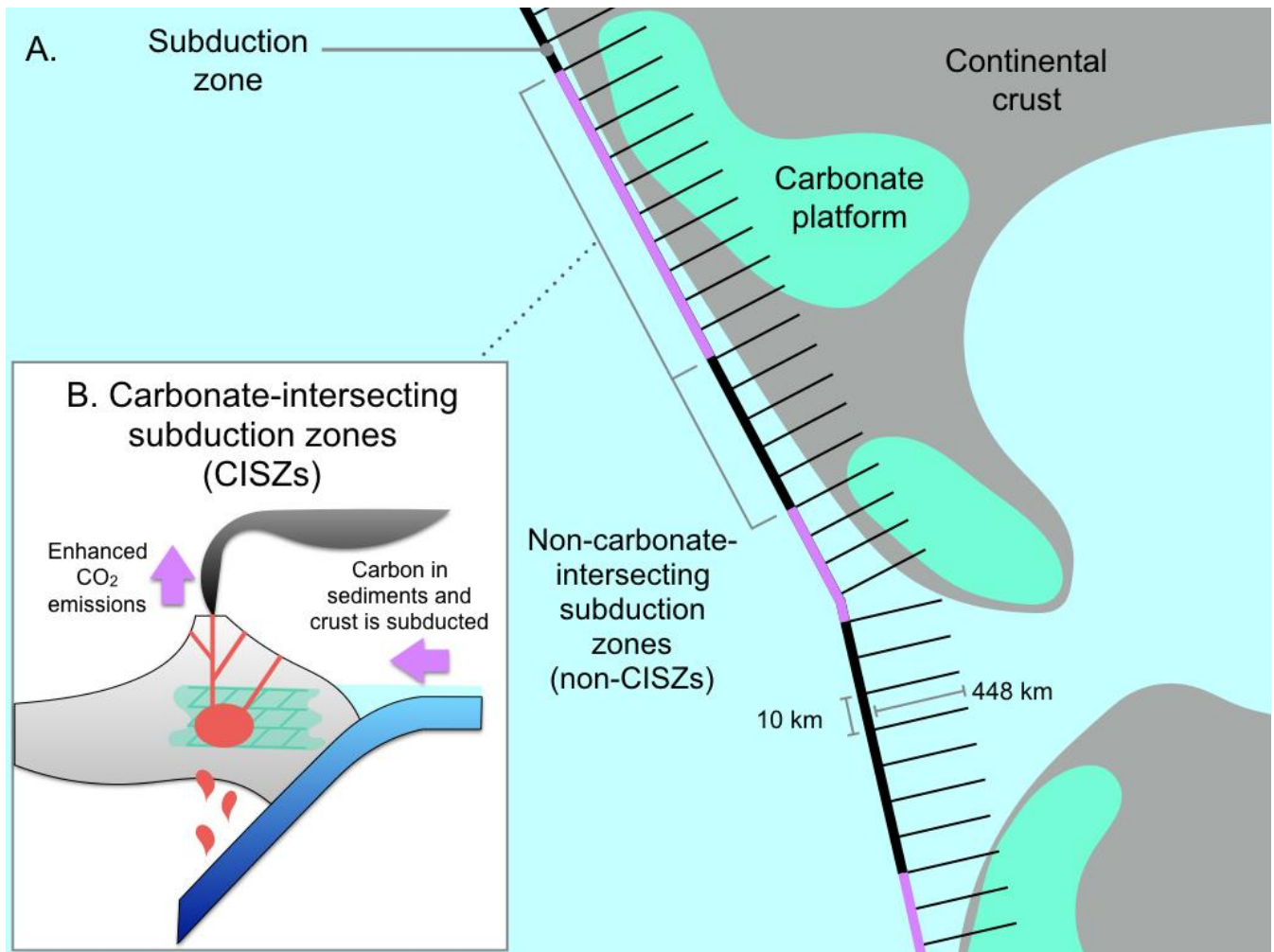
We investigate the combined effect of evolving global subduction zone lengths and the subsequent decarbonation of crustal carbonates by subduction zone melts to create a first-order approximation of the contribution of CO<sub>2</sub> outgassed at CISZs to palaeo-CO<sub>2</sub> levels over the past 410 Myr. An ‘Accumulation Model’ of carbonate platform evolution since the Precambrian represents the long-term persistence and build-up of carbonate platforms in upper continental crust. The plate reconstructions used in this study have been developed through a synthesis of marine and continental geological and geophysical data, including seafloor spreading histories for the post-Pangea timeframe (Seton et al., 2012; Muller et al., 2016), and largely paleomagnetic and continental geological constraints for pre-Pangea times (Domeier and Torsvik, 2014; Matthews et al., 2016). Subduction zones are implemented where the geological record indicates arc volcanism or intrusive magmatism, an active accretionary melange, active orogens associated with subduction zones, formation of supra-subduction zone ophiolites, and other indicators of an active margin. As

our plate reconstructions are global, plate boundary evolution requires continuously evolving topological polygons to capture plate motions (Gurnis et al., 2012), meaning that subduction zones are implemented along entire convergent margins, rather than only where preserved arc volcanics are found. Our plate reconstructions that include continental motions and plate boundary evolution  
5 are available as open-access community resources (<https://www.earthbyte.org/global-plate-models/>).

## **2.1 An ‘Accumulation’ model of carbonate platform development**

Palaeogeographic maps of carbonate platforms spanning the Phanerozoic since the Ordovician from Kiessling et al. (2003) are used to model carbonate platform accumulation through time. The 31 maps  
10 represent the spatial extent of carbonate platforms at the maximum marine transgression within each epoch for the Phanerozoic (Kiessling et al., 2003). Additionally, all instances of carbonate lithologies of Precambrian (4600-541 Ma) and Cambrian age (541-485 Ma) are extracted as point-data from the Palaeobiology Database (304 data points, <https://paleobiodb.org/>), the PaleoReefs Database (19 data points) (Kiessling et al., 2002) and some well-studied carbonates in North China (Meng et al., 2011).  
15 Considering that the spatial extent of the Precambrian carbonate platforms is poorly constrained, we applied a 200 km buffer to the point data from the databases. All carbonate platform geometries are georeferenced to WGS84 co-ordinates in ArcGIS (ESRI, 2011) to be compatible with GPLates, the open-source plate reconstruction software (Boyden et al., 2011). A GPLates file is created to depict carbonate platform accumulation from 410 Ma to present-day using platforms existing since the Precambrian, in  
20 order to better capture buried carbonate platforms at the beginning of the model timeframe. Creating this model involves stitching together all carbonate platform shapefiles and allowing them to persist until present day. Ages had been ascribed based on the Golonka and Kiessling (2002) Phanerozoic timescale. However, owing to new chronostratigraphic data, the geological times ascribed to the existence of carbonate platforms in our model for each epoch are converted to the corresponding times in the latest  
25 chronostratigraphic scheme given in the 2016 version of the International Stratigraphic Chart (Cohen et al., 2013). Subsequently, the static carbonate platform shapefiles are reconstructed with the rotations and plate geometries associated with an older plate motion model (Scotese, 2016), similar to the model used

by Kiessling et al. (2003). In GPlates, the carbonate platform geometries are assigned Plate IDs based upon their overlapping position within the reconstructed continental geometry. Carbonate platforms are rotated to their present-day positions, and Plate IDs associated with the Scotese (2016) model were translated into corresponding Plate IDs from the Matthews et al. (2016) plate motion model. By obtaining  
5 the present-day geometry of the ancient carbonate platforms, attaching these geometries to any other plate motion model becomes straightforward. The evolving carbonate platform model is created by layering each carbonate platform geometry such that it persists to present-day. The ‘Accumulation’ Model we implement in this study embodies the idea that carbonate platforms accumulate in crustal reservoirs through time.



**Figure 1:** (A) Schematic representation of the ~450-km-long cross-profile ‘whiskers’ that are constructed along subduction zones (purple and black), spaced 10 km apart in the direction of subduction. The carbonate polygons (light blue) of the carbonate platform mask have a value of 1 (including those existing on the continental and oceanic crust), and elsewhere the grid values are zero. All whiskers that intersect, at some point along their length, with the carbonate platforms in the mask will contribute 10 km to the total count of carbonate-intersecting subduction zones. (B) Schematic representations of carbonate-intersecting continental subduction zones. Carbonate platforms become buried over time, forming reservoirs in the crust. Through assimilation and decarbonation reactions, arc magmas interact with upper-crustal carbonates and liberate significantly more CO<sub>2</sub> emissions than at non-intersecting continental arcs.

## 2.2 Assumptions and limitations of the Accumulation Model

The Accumulation Model is an end-member scenario of how carbonate platforms evolve through time.

Carbonate accumulation is assumed to accrete on primarily continental lithosphere and persist as mid-crustal carbonate reservoirs from the time of their formation to the present (Fig. 1). Ancient carbonate platforms are known to persist to present-day in surface reservoirs, and can be reconstructed from the geological record as they either outcrop, are sampled by drilling or are interpreted from seismic reflection studies (Kiessling et al., 2003). Some crustal carbonate is inevitably eroded or subducted into the deep mantle, however it is improbable that most reservoirs have been destroyed in this way as most carbonate platforms accumulate on continental margins and are not likely to subduct (Lee and Lackey, 2015). Given limited erosion on passive continental margins, except in the cases of major uplift and deformation through mountain-building, it is far more likely that carbonate platform accretion has exceeded their depletion by erosion or consumption through time (Ridgwell and Zeebe, 2005). Moreover, the existence of fossil reef data as far back as the Precambrian (Grotzinger and James, 2000) favours the notion that extensive portions of platforms have been well-preserved in continents.

Nevertheless, our model assumes that carbonate platforms have not been significantly depleted by sustained mantle-crust interaction through time. We follow this assumption because there is no way to account for their rate of depletion given the complexity of inter-dependent factors such as platform thickness, heat, pressure, composition and the duration of interaction (Johnston et al., 2011). Accounting for the thickness of platforms and the depletion of reservoirs over time are areas of necessary future developments in the model. We accept that our Accumulation Model is a simplification of the carbonate reservoir system and may lead to an overestimation of CISZ lengths. However, this may be a reasonable proxy for the substantial amount of CO<sub>2</sub> emitted via diffuse outgassing that is largely unaccounted for in global estimates of carbon emitted at continental arcs (fore-arc, arc and back-arc settings) (Keleman and Manning, 2015). Given little evidence of carbon storage in arc crust, these estimates provide important

information, if not an upper-bound estimate, of degassing from CISZs, which are hypothesised to be a significant source of atmospheric CO<sub>2</sub> (Keleman and Manning, 2015). While some Precambrian carbonate platforms have been described (Grotzinger and James, 2000), no effort has yet been made to map their occurrence globally. It is beyond the scope of this work to map the global spatio-temporal patterns of Precambrian carbonate platforms, and thus only those point-data captured by the PaleoReef and Paleobiology databases were incorporated into our Accumulation Model. While it is expected that accounting for the entire extent of Precambrian platforms would not drastically change the analysis if Precambrian platforms largely lay over the extent of platforms already accounted for, the Accumulation model nevertheless represents a degree of underestimation of the Earth's crustal carbonate reservoir.

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### **2.3 Measuring global subduction zone lengths with pyGPlates**

We use the open access global plate motion model from Matthews et al. (2016) to analyse the spatio-temporal distribution of subduction zone volcanic arcs in a deep-time tectonic framework and test the hypothesis that subduction zone arc lengths are correlated with atmospheric CO<sub>2</sub> levels. The model spans much of the Phanerozoic as it links the 410-250 Ma Domeier and Torsvik (2014) and the 230-0 Ma Müller et al. (2016) plate motion models. Using open-source and cross-platform plate reconstruction software GPlates (<http://gplates.org/download.html>) and a new pyGPlates Python application programming interface (API) (<https://www.gplates.org/docs/pygplates/>), we measure the length of subduction zones at 1 Myr intervals since 410 Ma and track the length of subduction zones that interact with carbonate platforms (CISZ), the length of all subduction zones that do not intersect carbonate platforms (non-CISZ), and total global subduction zone lengths. Using the pyGPlates workflow (Doss et al., 2016), global subduction zone boundaries were extracted from the Matthews et al. (2016) plate motion model, and subduction zone geometries were adjusted to remove any overlapping line segments that would overestimate subduction zone lengths through time (Doss et al., 2016).



## 2.4 Computing the intersections of carbonate platforms and subduction zones

We test whether subduction zones interacting with carbonate platforms are different from non-intersecting portions of subduction zones in their contribution to global atmospheric CO<sub>2</sub> concentration, and hence we track the lengths of subduction zones that both do and do not intersect with carbonate platforms in the overriding lithosphere. Carbonate platform geometries are converted to polygons using *grdmask* from the development version of Generic Mapping Tools (GMT) (v.5.2.1; Wessel et al., 2015) which create a Boolean-style mask consisting of closed domains with a value of 1 where carbonate platforms existed and 0 elsewhere. We identify polygons proximal to subduction boundaries through time using the exported subduction zone geometries from the pyGPlates workflow. We compute the signed-distance function, positive toward the overriding plate, on the surface of the sphere for all subduction zones and computed where the carbonate platforms lie within +448 km of the trench. The *grdtrack* tool in GMT is used to create large tracks of 448 km-long cross-profiles perpendicular to subduction boundaries at a uniform spacing of 10 km, with ‘whiskers’ pointing in the direction of subduction (Fig. 1a). The whiskers have five evenly-spaced nodes to detect intersections with carbonate platform polygons anywhere along the cross-profiles. The whiskers function as a buffer, allowing us to identify the lengths of subduction zone boundaries within ~450 km perpendicular radius of a carbonate platform polygon. Cross-profiles that overlap with carbonate platform polygons demarcate areas where continental subduction zones interact with crustal carbonates (Fig. 1b).

We statistically determine the 448 km-long inclusion distance by calculating average arc-trench distances using the present-day ‘Volcanoes of the World’ database maintained by the Smithsonian Institution’s Global Volcanism Program (Siebert and Simkin, 2014). From a sample size of 1023 volcanoes, average arc-trench distances are 287 km with a standard deviation of 161 km, such that one standard deviation greater than the mean arc-trench distance gives 448 km. This captures 84% of the location of all present volcanic arcs. While flat slab subduction may cause arc-trench distances in excess of 500 km (Espurt et al., 2008), a 448 km-long whisker length is likely to capture the majority of carbonate intersections through time.

### 3 Linking arc volcanism to palaeoclimate change

Relationships between oscillations in two time series can be examined using a wavelet analysis to elucidate the scales and time intervals where the proxy record and modelled data display correlated, periodic signals. We performed wavelet analysis as a means of identifying localised variations of power between proxy records of CO<sub>2</sub> and modelled CISZ lengths and in turn investigate the temporal evolution of these aperiodic signals. We are able to carry out this analysis as the geophysical data exhibit non-stationarity; dominant periodic signals vary in their frequency and amplitude through time. The continuous wavelet transform (CWT) is particularly useful for this task as it better characterises oscillatory behaviours of signals than discrete wavelet transforms. The CWT was applied to decompose arc lengths and proxy signals into time and frequency space simultaneously using functions (wavelets) that vary in width to discern both the high and low frequency features present (Lau and Weng, 1995; Supplement 3). To examine whether trends in atmospheric CO<sub>2</sub> and CISZ arcs are connected in some way, the cross-wavelet transform (XWT) was carried out between the proxy-CO<sub>2</sub> data (Fig. S1) and each of the modelled data on carbonate-intersecting arc lengths (Supplement 4). The XWT reveals space-time regions where the two datasets coincidentally have high common power as well as calculating the phase relationships between signals, indicating where two series co-vary (Grinsted et al., 2004). Wavelet coherence (WTC) is computed in tandem with the XWT and determines if the time series are significantly interrelated in the frequency domain. All wavelet analysis was carried out for each detrended and filtered time series based on the statistical approach applied to geological and geophysical data by Torrence and Compo (1998) and Grinsted et al. (2004).

#### 3.1 Data filtering

The modelled results and proxy-CO<sub>2</sub> time series were pre-processed for wavelet analysis by detrending and applying a low-pass filter. A moving average filter was applied with a window size of 5 Myr to remove high-frequency signals that may represent noise or other short-term perturbations (Fig. S2). In the time-frequency domain, our focus is on the power in the low-to-mid frequency spectrum and so the moving average filter was designed to remove periods less than 5 Myrs. As a result, the analysis does not

capture any geologically-rapid (few Myrs) changes in CO<sub>2</sub> that may be driven by changes in plate tectonics and carbonate platform-arc interactions.

Rather than comparing estimates from the Accumulation Model with Phanerozoic atmospheric CO<sub>2</sub> models like COPSE (Bergman et al., 2004) or GEOCARBSULF (Berner, 2006), results were compared to the proxy-CO<sub>2</sub> record compiled by Foster et al. (2017) because the unresolved uncertainties in model calculations may have rendered comparisons less meaningful than when comparing with proxy records. The multi-proxy CO<sub>2</sub> dataset presented by Foster et al. (2017) is the most up-to-date compilation of CO<sub>2</sub> data at the highest temporal resolution available (0.5 Myr sampling interval), representing their highest probability estimate of CO<sub>2</sub> at each interval and is the proxy-CO<sub>2</sub> signal used in this study.

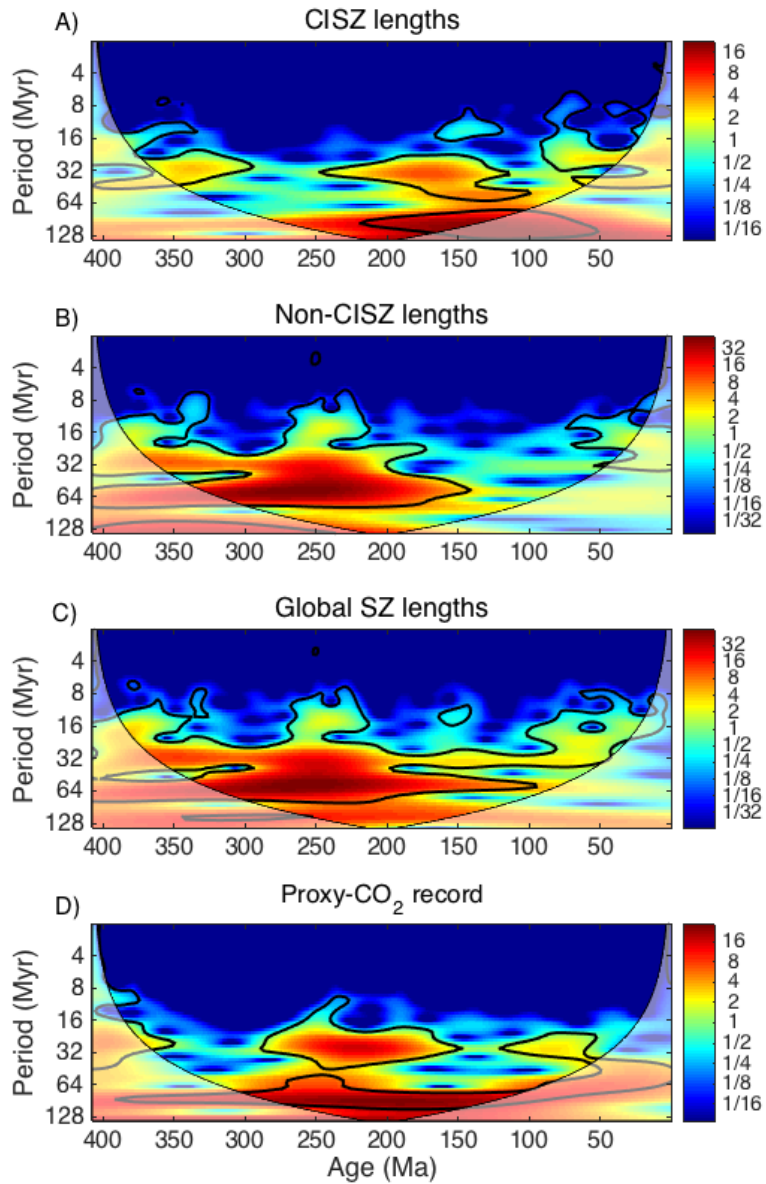
## 4 Results

### 4.1 Continuous Wavelet Transform (CWT)

The wavelet power spectrum in the CWT shows the spatio-temporal distribution of amplitudes of correlation between the time series and a Morlet wavelet of a specific scale. Areas outside the cone of influence (COI) are not localised in time and are thus unreliable for constraining the duration of periodicity. For this reason, results within the 5% significance level outside the COI (in white translucent regions of the wavelet power spectra) are ignored.

There is significant wavelet power in the 24-48 Myr waveband (period length) for CISZ lengths, which is intermittent in time yet dominates for time intervals (365-295 Ma, 250-115 Ma, 90-35 Ma) (Fig. 2a). Significant wavelet power also exists in the 48-64 Myr waveband from 175-100 Ma and in the 72-128 Myr waveband from 220-120 Ma. In contrast, periodic signals of length ~ 24-32 Myr and 48-64 Myr have the highest wavelet power and are significant in the non-CISZ time series from ~360-150 Ma (Fig. 2b), which are notably absent from the CISZ time series. Total global subduction zone lengths have two clear and persistent signals through time, primarily in the 24-32 Myr and 48-64 Myr wavebands (Fig. 2c). Significant, high wavelet power in the 16-32 Myr waveband exists in the proxy-CO<sub>2</sub> time series from

280-150 Ma, as well as from 125-50 Ma (Fig. 2d). The ~96 Myr waveband has the highest wavelet power at the 5% significance level in the proxy-CO<sub>2</sub> time series from 300-120 Ma (Fig. 2d). There is overlap in periodic behaviour between the CISZ, non-CISZ, global subduction zone and CO<sub>2</sub> proxy data in the 16-32 Myr wavebands.



**Figure 2:** Continuous wavelet transforms (CWT) for four time series: (a) carbonate-intersecting subduction zone (CISZ) lengths, (b) non-CISZ lengths, (c) global subduction zone lengths and (d) the proxy-CO<sub>2</sub> data from Foster et al. (2017). Thick black contours designate the 5% significance level against a red noise background spectrum. The cone of influence (white translucent region) is where edge effects distort the spectrum, meaning that results in this region are not reliable. The colour bar indicates the range of wavelet power in the wavelet power spectrum, with hotter colours corresponding to the maximum peaks in wavelet power. Note the logarithmic scale of the period (Myr) axis.

## 4.2 Cross-wavelet Transform (XWT) and wavelet coherence (WTC)

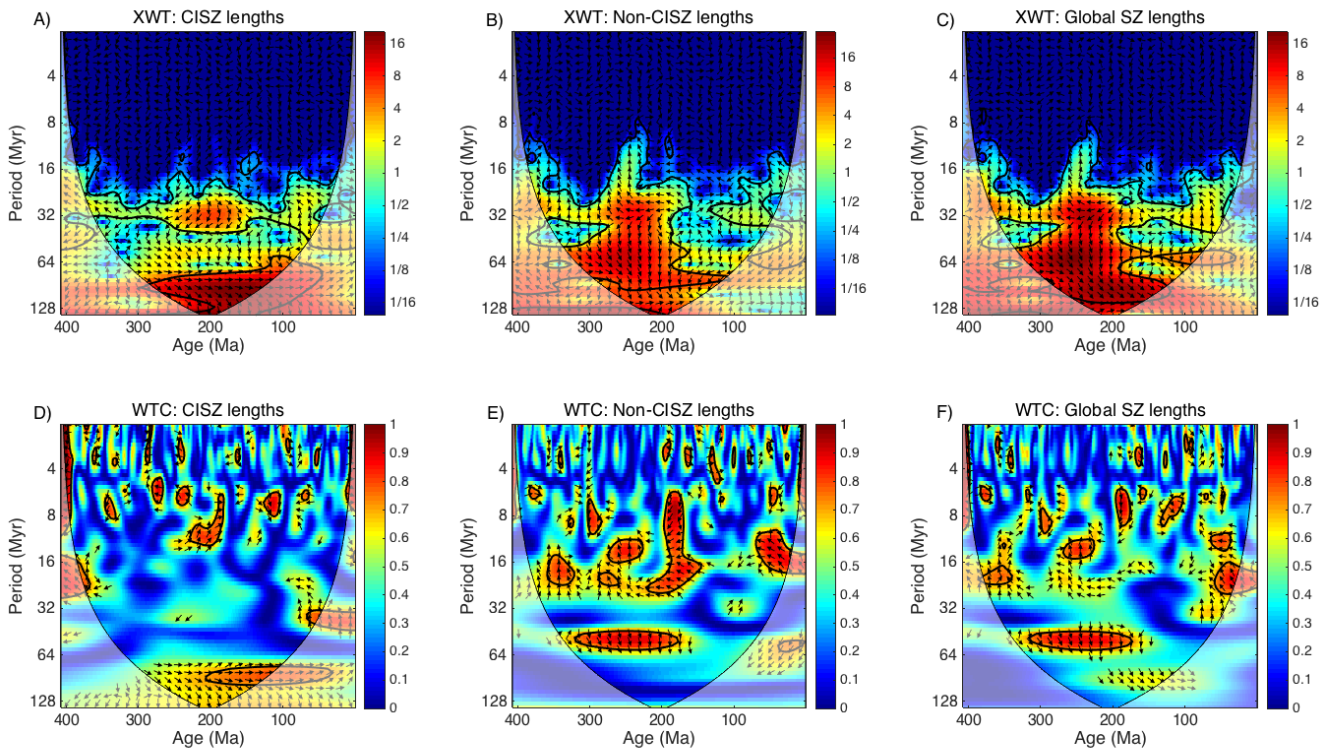
The periodic components common in the subduction zone length time series and the proxy-CO<sub>2</sub> record were investigated further using XWT and WTC (Fig. 3). The XWT highlights areas of common high wavelet power between two CWTs, whereas the WTC finds the correlation between two CWTs in time, highlighting persistent and significant periodic signals even if cross wavelet power is low (Grinsted et al., 2004). Phase-locked arrows within the 95% confidence contours in the WTC (arrows that do not change direction through time) are the strongest indicator of a persistent periodic signal. Generally, the WTC analysis between subduction zone lengths and the proxy-CO<sub>2</sub> record do not highlight significant and prolonged coherence through time, but rather, highlight time intervals where periodic behaviour was significant and stable.

While a prolonged interval of high joint power in the XWT spectra between CISZ lengths and proxy-CO<sub>2</sub> exists in the 24-48 Myr waveband (Fig. 3a), this is not found to be coherent through time in the WTC (Fig. 4d). However, the ~96 Myr waveband is coherent from 200-100 Ma and likewise, the 32-48 Myr waveband is coherent from 60-40 Ma (Fig. 3d). Portions of these regions lie outside the COI and are thus cannot be well-localised in time. Other areas of high coherence are not linked to significant cross-spectral power in the XWT.

East-pointing arrows that are phase-locked in the WTC in the ~96 Myr waveband indicate in-phase peaks, such that local maxima in CISZ lengths and paleo-atmospheric CO<sub>2</sub> are aligned over the 200-100 Ma time interval (Fig. 3d). Between 60-40 Ma, coherent behaviour between CISZ lengths and the proxy-CO<sub>2</sub> record is characterised by a 32-48 Myr periodicity and CISZ lengths lead CO<sub>2</sub> peaks by ~90° (~8-12 Myr) (Fig. 3d). Over a similar time interval, coherent behaviour is found between the proxy-CO<sub>2</sub> record and global subduction zones. Between ~60-20 Ma in the 16-24 Myr waveband, CO<sub>2</sub> peaks lag by 5-8 Myr behind peaks in global subduction zone lengths (Fig. 3f). However, cross-wavelet power is stronger between the CO<sub>2</sub> record and CISZ lengths compared to global subduction zone lengths over the 60-20 Ma interval (Fig. 3a, 3c).

Non-CISZ lengths and proxy-CO<sub>2</sub> record share broad areas of high common power (Fig. 3b), yet the most significant region in the WTC is the 12-16 Myr waveband from 275-225 Ma (Fig. 3e), corresponding to a significant area of the XWT. In this region, north-pointing phase arrows indicate a 90° (~3-4 Myr) lag

of peaks in the proxy-CO<sub>2</sub> record compared to peaks in non-CISZ lengths. Similarly, peaks in the proxy-CO<sub>2</sub> record lag global subduction zone lengths by 3-4 Myr in a cyclic period of 12-16 Myr (Fig. 3e). South-pointing phase-locked arrows indicate that CO<sub>2</sub> peaks are leading peaks in non-CISZ lengths (48-64 Myr waveband, 315-185 Ma) and west-pointing arrows indicate anti-phase behaviour (where peaks in one time series coincide with troughs of another time series) (16-32 Myr, 210-150 Ma), both of which do not support causal relationships.



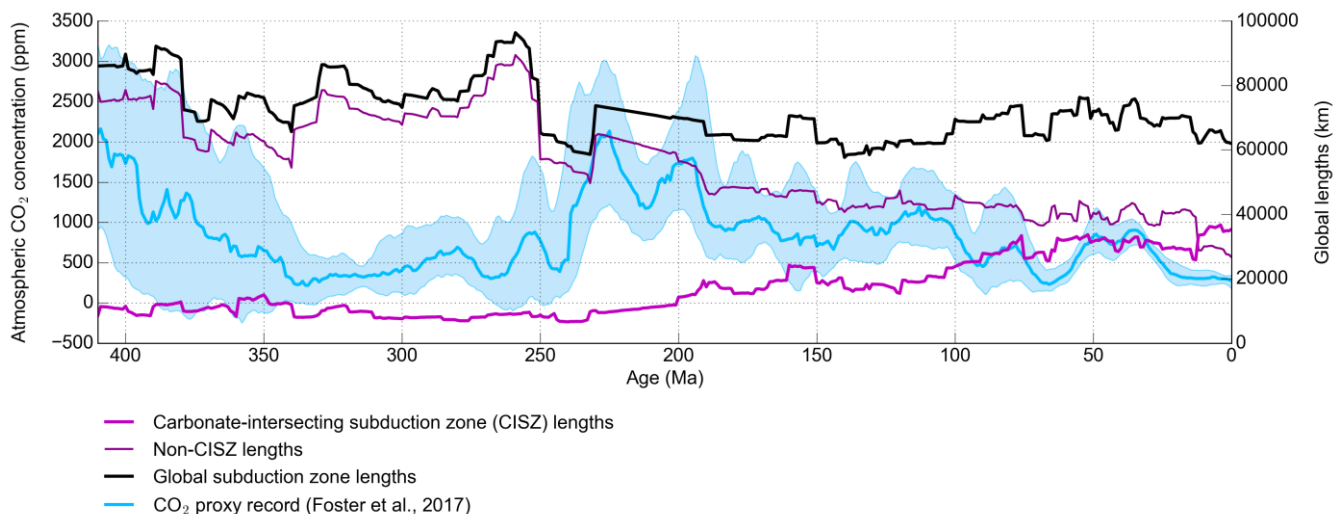
**Figure 3:** The cross-wavelet transforms (XWT) (top) and wavelet coherence (WTC) (bottom) for (a,d) CISZ, (b,e) non-CISZ and (c,f) global subduction zone lengths respectively and the proxy-CO<sub>2</sub> record (Foster et al., 2017). Thick black contours designate the 5% significance level against a red noise spectrum. The white translucent region designates the cone of influence (COI). The colour bar indicates the magnitude of cross-spectral power for the XWT, and for the WTC it represents the significance level of the Monte Carlo test. The arrows indicate the phase relationship of the two time series in time-frequency space, where east-pointing arrows indicate in-phase behaviour, west-pointing arrows indicate anti-phase behaviour, north-pointing arrows indicate that the peaks in subduction zone lengths leads the CO<sub>2</sub> peaks and south-pointing arrows indicating that CO<sub>2</sub> peaks lead peaks in subduction zone lengths.

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Similar to the XWT for non-CISZ lengths, the XWT shows that global subduction zone lengths and the proxy-CO<sub>2</sub> record share regions of high joint wavelet power (Fig. 3c). Nevertheless, extended horizontal

regions in the WTC with south-pointing arrows indicate that CO<sub>2</sub> peaks lead subduction zone lengths (48-64 Myr waveband, 315-185 Ma) and areas of coherence coincide with areas of low cross-spectral power (wavebands <16 Myr and 16-24 Myr waveband 380-340 Ma), undermining the potential of causal relationships (Fig. 3f).

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**Figure 4:** Graph of total global lengths of subduction zones (black) compared with lengths of all subduction zones that intersect with buried crustal carbonate platforms (magenta, thick) and those subduction zone lengths that do not intersect crustal carbonate platforms (dark magenta, thin). The proxy-CO<sub>2</sub> record (blue) from Foster et al. (2017) with upper and lower bounds (blue envelope) are displayed for comparison.

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### 4.3 Comparing carbonate-intersecting arc length and palaeo-CO<sub>2</sub> trends

At present day, our estimates of CISZ and global subduction zone lengths reach approximately 35,300 km and 62,000 km respectively. CISZ lengths show an increasing trend over time, especially from 220 Ma to present when lengths reliable reach above 10,000 km globally. From 250 Ma, accumulated carbonate platforms consistently intersect ~70% of total global subduction zone lengths (Fig. 4). Coherence analysis suggests that CISZ lengths and palaeo-atmospheric CO<sub>2</sub> peaks may not be well correlated prior to 200 Ma. Indeed, CISZ lengths make up a small proportion of global subduction zones prior to 200 Ma, beginning at 8,600 km at 410 Ma and increasing to over 14,000 km only after 200 Ma (Fig. 4). During some time windows, periodic behaviour may be correlated. These two areas of significance highlighted by the XWT

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and WTC analysis are between 200-100 Ma, and 60-40 Ma (Fig. 3a, 3d). Between 200 and 100 Ma, WTC highlights linked periodic behaviour between CISZ lengths and the proxy-CO<sub>2</sub> record for a period length of ~96 Myr (Fig. 3d). CISZ lengths increase non-uniformly over this period from ~14,300 km to ~23,800 km, whereas palaeo-atmospheric CO<sub>2</sub> levels drop from ~1,700 parts per million (p.p.m.) to ~860 p.p.m.. Over the 60-40 Ma period, where WTC analysis found that CISZ lengths lead CO<sub>2</sub> peaks by ~8-12 Myr (Fig. 3d), CISZ lengths show small-scale oscillations between 28,400 km and 33,700 km compared with broader, defined peaks in atmospheric CO<sub>2</sub> (Fig. 4). Note that WTC analysis also found coherence with the proxy-CO<sub>2</sub> and global subduction zone lengths over a similar period (~60-20 Ma), where peaks in global subduction zone lengths lead peaks in CO<sub>2</sub> by ~5-8 Myr in a 16-24 Myr cycle (Fig. 3f).

At 258 Ma, non-CISZ lengths reach a peak of 86,424 km as global subduction zone lengths reach 95,500 km, followed by palaeo-atmospheric CO<sub>2</sub> reaching a peak of 880 p.p.m. at 252 Ma. This result coheres with cyclic behaviour found in the WTC, where peaks in non-CISZ and global subduction zone lengths precede local CO<sub>2</sub> maxima by 3-4 Myr in the 275-225 Ma timeframe (Fig. 3e). In the same interval, a peak at 230 Ma in total subduction zone lengths and non-CISZ lengths (73,700 km and 63,600 km respectively) precede a peak at 226 Ma in the proxy-CO<sub>2</sub> record (~2,100 p.p.m.).

## 5 Discussion

With growing global reservoirs of carbonate platforms since 250 Ma, we expect to see linked, periodic behaviour in the most recent past compared to 410-250 Ma if the length of CISZs have had a dominant climate-forcing effect. Indeed, our wavelet analysis highlights that CISZ lengths and the proxy-CO<sub>2</sub> record have aligned local maxima from 200-100 Ma, and found that ~96 Myr cyclical behaviour between the two time series is linked in that time interval. Furthermore, if results found outside the COI could be localised better in time, it is possible that the cycle extends further toward the present day. Our result that increased CISZ lengths 200-100 Ma drove the Jurassic-Cretaceous peak in atmospheric CO<sub>2</sub> is consistent with the latest COPSE model results where a peak and decline of atmospheric CO<sub>2</sub> and global temperature in the 200-0 Ma interval was driven by a peak and decline in volcanic degassing (Lenton et al., 2018). At this time, the breakup of Pangaea drove increased subduction zone lengths with continental dispersal, and

thus increased CISZ lengths, especially at the northern edge of the Mongol-Okhotsk plate and in the Tethyan tectonic domain (Fig. 5c). However, Brune et al. (2017) found that continental rifting has the potential to drive massive CO<sub>2</sub> emissions, especially from the 160-100 Ma time interval. Furthermore, degassing of basalt flows from the central Atlantic magmatic province (CAMP) ~ 200 Ma has also been postulated to have driven climate change, as well as the end-Triassic extinction (Davies et al., 2017).

As multiple feedback mechanisms between the geosphere, biosphere and atmosphere are at play in the 200-100 Ma timeframe, it is unclear whether subduction zone lengths had a dominant or auxiliary effect in controlling increased atmospheric CO<sub>2</sub>. Moreover, from 60-40 Ma, a 32-48 Myr cyclicity prevailed, characterised by local maxima in CISZ lengths lead peaks in CO<sub>2</sub> by ~8-12 Myr (Figs. 3a, 3d). The implications of this result are discussed in Section 5.2.

From the WTC (Figs. 3e, 3f), we observe that local maxima in non-CISZ lengths and global subduction zone lengths are found to lead local maxima in palaeo-atmospheric CO<sub>2</sub> by 3-4 Myr in a 12-16 Myr cycle, in the Permian-Triassic interval (275-225 Ma). While this indicates that a trend in global subduction zone and non-CISZ lengths may have had a climate forcing effect in the 275-225 Ma timeframe, multiple tectonic and non-tectonic events may have also influenced greenhouse conditions. It is during this time that massive volcanism from the Siberian traps and Emeishan LIP were particularly important in the sudden increase in atmospheric CO<sub>2</sub> (Renne et al., 1995, Johansson et al., 2018). Contemporaneously, it has also been suggested that an asteroid impact (Kaiho et al., 2001), oceanic anoxia (Wignall and Hallam, 1992) and a release of oceanic methane hydrates (Kump et al., 2005) all contributed to elevated atmospheric CO<sub>2</sub> and the warmer climate at the Permian-Triassic boundary.

Overall, we find that multiple tectonic and non-tectonic forcings are at play during the 275-225 Ma and 200-100 Ma time intervals where CISZ lengths appeared to have a dominant effect on atmospheric CO<sub>2</sub>. Moreover, CISZ lengths and the proxy-CO<sub>2</sub> record are largely found to be independent with no strong leading relationship in the signal phase offset that is consistent through time. While there are several regions in all XWT of significant common power between the proxy-CO<sub>2</sub> record and our subduction zone time series, the regions were not coherent in the WTC and could not be distinguished from random coincidence. For example, the prolonged ~32 Myr cyclic trend in CISZ lengths appearing in the XWT (Fig. 3a) was not found to be consistent in time in the WTC (Fig. 3d). Additionally, in some time intervals,

phase arrows in the WTC did not support the climate-forcing effect of subduction zone lengths. Ultimately, our study does not support the hypothesis that carbonate-intersecting arcs have had a sustained and dominant influence on atmospheric CO<sub>2</sub> levels over the past 410 Myr. Instead, carbonate-intersecting subduction-derived magmatism is likely to have episodic control on atmospheric CO<sub>2</sub>, perhaps related to the inception or abandonment of major regional continental subduction zones. However, potential issues with the large uncertainties in the proxy record, complexities in reconstructing pre-Pangea subduction zones and carbonate platforms, as well as the requirement to filter the time series may influence this result.

### **5.1 Present day subduction zone estimates**

At present day, our estimates of CISZ lengths are approximately 2.4 times greater than the recent calculations of present day global continental arc lengths by Cao et al. (2017) (62,000 km and 15,000 km respectively). Cao et al. (2017) focussed on measuring the extent of continental volcanic arcs, whereas our investigation encompasses the total segment lengths of all subduction zones, including those that intersect carbonate platforms. Therefore, our analysis tends to capture a broader range of CO<sub>2</sub> degassing mechanisms along subduction zones, including diffuse outgassing from fore-arcs, back-arcs and volcanic arcs along faults, fractures and fissures, in addition to arc volcanoes. This is because melt is ubiquitous along subduction zones, and there is very little carbon storage along arcs (Keleman and Manning, 2015). For this reason, our approach differs from that of Cao et al. (2017), as we are attempting to capture additional mechanisms of CO<sub>2</sub> escape along continental subduction zones, as opposed to only those directly associated with volcanic arcs, and our estimates may be regarded as an upper bound on total CO<sub>2</sub> emissions at subduction zones.

### **5.2 Implications for Palaeogene Climate**

Wavelet analysis also reveals coherent behaviour in the 60-40 Ma interval where local maxima in CISZ lengths consistently precede local maxima in palaeo-atmospheric CO<sub>2</sub> by ~8-12 Myr in a 32-48 Myr cycle. Between 60-40 Ma, subduction zone lengths also were found to have local maxima preceding local maxima in palaeo-atmospheric CO<sub>2</sub> by ~5-8 Myr in a 16-24 Myr cycle. However, cross wavelet power is stronger between CISZ lengths and the CO<sub>2</sub> record, suggesting that CISZ volcanism on a global scale had

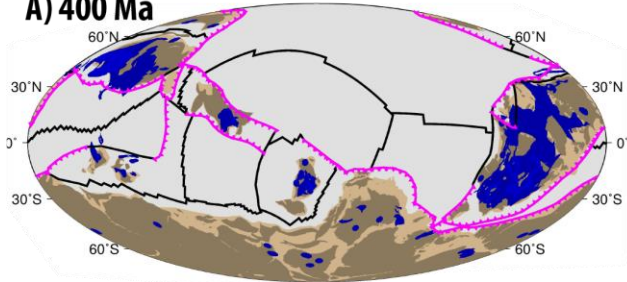
marginally more effect on climate 60-40 Ma than global subduction zone volcanism. The results may indicate that increases in global subduction zone lengths and CISZ lengths may have contributed to the Early Eocene climatic optimum (EECO) 53-51 Ma, where temperatures were  $14 \pm 3^\circ\text{C}$  warmer than the pre-industrial period (Caballero and Huber, 2013). While climate interactions and feedbacks leading to the greenhouse state remain uncertain, climate sensitivity to  $\text{CO}_2$  forcing is likely (Anagnostou et al., 2016).

The termination of arc volcanism particularly along the Sundaland margin, where a large area of carbonate platforms are buried, contributed  $\sim 3,000$  km to the global reduction in CISZ lengths by  $\sim 7,000$  km between 75-65 Ma (Figs. 5e, 5f). The resumption of subduction along the Sunda-Java trench at 65 Ma described by Zahirovic et al., (2016) as well as the emplacement of a set of carbonate platforms in the lower latitudes at 63 Ma explain the modelled results of an increase in CISZ lengths at 63 Ma which persist until present day (Fig. 5f). The EECO occurred approximately 10 Myr later, supporting the 8-12 Myr lag in peaks of a  $\sim 32$ -48 Myr periodicity found by the CISZ- $\text{CO}_2$  XWT and WTC (Fig. 3a).

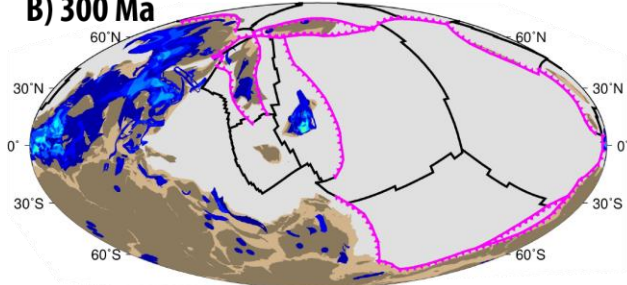
Our analysis shows a concomitant increase in global subduction zone lengths (Fig. 4), which cannot be ruled out as an explanatory source of climate forcing. However, modern volcanic  $\text{CO}_2$  output from arcs in Indonesia, Papua New Guinea, parts of the Andes and Italian Magmatic Province are strongly influenced by carbonate assimilation (Mason et al., 2017) and volcanoes in those regions currently contribute significantly to global atmospheric  $\text{CO}_2$  flux (Carter and Dasgupta, 2015). Assuming a similar subduction style, this result gives plausibility to the idea that volcanic activity along the Sunda-Java trench during the Palaeogene was also significantly contributing to global  $\text{CO}_2$  output.

Previous studies have suggested that global arc  $\text{CO}_2$  contributed to the baseline warm climate of the Late Cretaceous and late Palaeogene, due to the greater size of carbonate reservoirs in continents and the increased continental arc lengths (Lee et al., 2013; Carter and Dasgupta, 2015; McKenzie et al., 2016; Cao et al., 2017). Our results agree well with the hypothesis, as a relative increase in carbonate-intersecting subduction zone lengths has been linked to a peak in atmospheric  $\text{CO}_2$  from 60-40 Ma, contributing to enhanced  $\text{CO}_2$  degassing. However, it cannot be determined from this study whether the increase in global subduction zone lengths is more important than the relative increase in the lengths that intersect carbonate platforms.

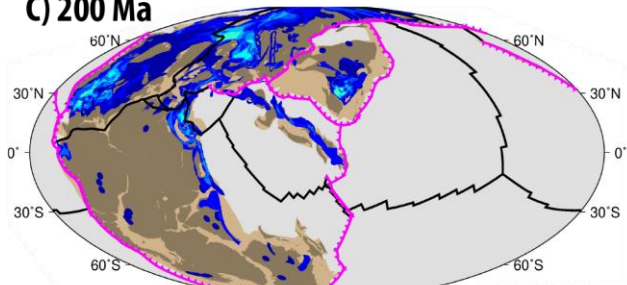
**A) 400 Ma**



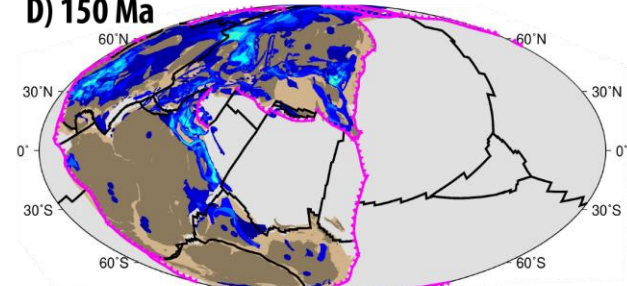
**B) 300 Ma**



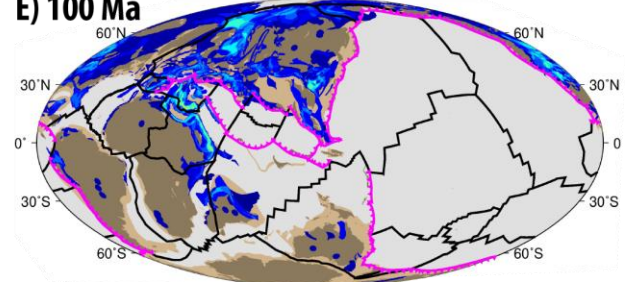
**C) 200 Ma**



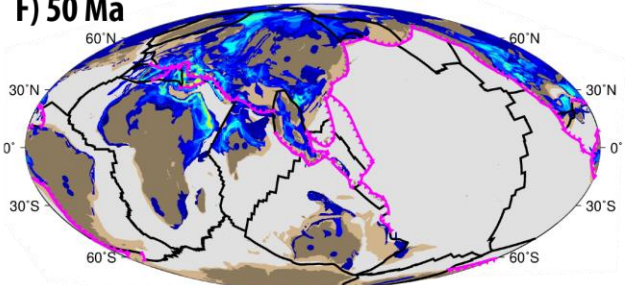
**D) 150 Ma**



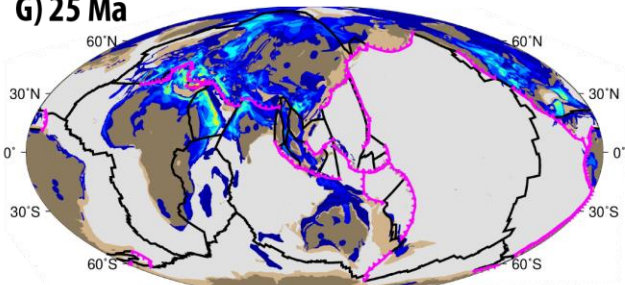
**E) 100 Ma**



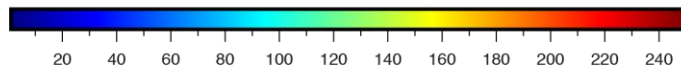
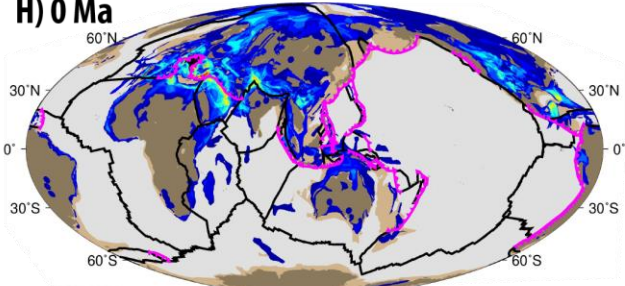
**F) 50 Ma**



**G) 25 Ma**



**H) 0 Ma**



**Carbonate Platform Duration (Myr)**

**Figure 5:** Plate reconstructions with plate boundaries (black), subduction zones (purple) and distributions of carbonate platforms. Carbonate platforms are distributed according to the Accumulation Model at key intervals from 400 Ma to present day. Colour bar corresponds to the duration of time that the carbonate platforms were actively developing for in the crust. In addition, we set Precambrian and early Phanerozoic carbonate occurrences to appear at the beginning of the model timeframe, as the reconstructions do not yet extend beyond Devonian times.

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### 5.3 Limitations of wavelet analysis

Wavelet analysis is inherently sensitive to the shape of signals, and as such, adjustment of filtering and processing techniques introduces variations in the results. A 5 Myr moving average window filter was chosen to remove high-frequency noise, yet it may have moved trends forward in time, which ultimately changes whether peaks overlap or not and adds uncertainty to results. Peaks in the XWT were robust in that they were found to appear in XWT plots regardless of the intensity of smoothing, yet the significance contours differed strongly due to smoothing. For instance, with a longer low-bandpass filter, small-scale oscillations <5 Myrs were removed, reducing areas of significant power in the shorter wavebands. Similarly, when experimenting with a high-bandpass filter, significant regions were directed away from the longer periodicities of >64 Myrs to shorter periodicities. The low-bandpass filter was chosen to remove the noise for smaller periodicities where fluctuations were less likely to represent trends instead possibly represent artefacts of interpolation, and as a result, this study cannot evaluate short-term relationships between climate and subduction zone volcanism.

Our analysis technique cannot quantify the error that propagates from uncertainty in the proxy-CO<sub>2</sub> record and subduction zone length signal through to the correlation uncertainty. Firstly, the Foster et al. (2017) proxy-CO<sub>2</sub> record is a maximum probability estimate of atmospheric palaeo-CO<sub>2</sub> from a wider 95% confidence envelope. While the uncertainties appear to be time-localised, the uncertainty in CO<sub>2</sub> concentrations in the proxy record could not be captured by our method of extracting only one time series for analysis. Similarly, the Matthews et al. (2016) tectonic plate model represents one interpretation of geological data which becomes sparse for deeper geological time, especially for pre-Pangea times (before ~250-200 Ma). As there are no comparable models, we cannot quantify uncertainty in our subduction length signals. Therefore, we acknowledge that our comparison of two time series with large uncertainties are insufficient in constraining periodic behaviour and future research should involve comparing our estimates with other models and data.

XWT analysis describes areas with high power which can be misleading when the XWT spectrum is not normalised. For instance, areas of high joint power were found where relatively flat peaks in the CISZ length data occurred simply because of the large amplitude of peaks in the proxy-CO<sub>2</sub> data. The vast differences in magnitude do not necessarily constitute a causative relationship. WTC analysis does not present this problem because the spectrum is normalised, and hence periodicities with strong power were not necessarily found to be coherent (Maraun and Kurths, 2004). The combination of both measures somewhat circumvents the problem of misleading peaks in the XWT, but not all. Given that wavelet analysis is very sensitive to magnitude and timing of peaks, the fact that the uncertainty in our modelled estimates of subduction zone lengths are not well-constrained introduces variability in correlative relationships. Wavelet analysis, like other signal processing techniques, is limited by the length of the time series data investigated. Periods of greater than half the time series length cannot be examined using this method (Winder, 2002). Therefore, very-long oscillations on the scale of 250 Myr or more could not be derived from our data. One reason for examining patterns on 250 Ma periods is due to the very-long-term nature of supercontinent cycles. The accretion of supercontinents such as Pangea and Rodinia are associated with shortened continental subduction zone lengths, whilst continental break-up and dispersal initiates subduction on the edges of continents, and thus increases continental subduction zone lengths (Donnadieu et al., 2004; Lenardic et al. 2011; Lee et al., 2016). These changing modes of supercontinent break-up or accretion have the potential to influence climate. Given that supercontinent cycles exceed 200 Myr in length and exert a large effect on the length of continental arcs (Lee et al., 2013), applying this analysis to plate reconstructions that capture multiple supercontinent cycles (e.g. Meredith et al., 2017) to investigate whether such long-term linkages exist between atmospheric CO<sub>2</sub> and global subduction zone emissions.

#### **5.4 Limitations of model assumptions**

The extent to which our models are representative of subduction zone CO<sub>2</sub> emissions is limited by some issues with the subduction zone quantification approach. The subduction zone modelling attempted to approximate atmospheric CO<sub>2</sub> flux at subduction zones without directly measuring it by assuming a constant CO<sub>2</sub> flux and a unit-correspondence of subduction zone lengths to volcanoes, vents or fissures.

Both assumptions are problematic. There are several dynamic factors that govern subduction-zone-CO<sub>2</sub> flux such as convergence rates (van der Meer et al., 2014), the composition and volume of subducted sediments (Rea and Ruff, 1996), convergence obliquity (Kerrick and Connolly, 2001), slab volume flux (Fischer, 2008), the relative contribution of metamorphic decarbonation in the crust and in the mantle wedge (Keleman and Manning, 2015) and the efficiency of decarbonation (Johnston et al., 2011). The model does not account for these factors and assumes that the parameters of CO<sub>2</sub> flux have remained constant in time. In addition, the number of volcanoes or vents per unit length of subduction zones is neither constant through time nor correlated, at least for the circum-Pacific arc and Central American arc (Kerrick, 2001). Furthermore, the Accumulation Model has no way to account for carbonate platform thicknesses, and thus cannot account for the realistic depletion of crustal carbonate reservoirs through time. The inability of the model to incorporate the complexity of depleting carbonate platforms may lead to sampling bias during continental collisions. This highlights an area of future improvement, including the utilisation of subduction zone geodynamic-geochemical modelling (e.g. Gonzales et al., 2016) by tracking different CO<sub>2</sub> reservoirs in a geodynamic context.

Furthermore, uncertainty cannot currently be measured using our GPlates modelling approach. Uncertainty propagates through the plate motion model over deeper reaches of geological time, such that it is currently impossible to quantify uncertainty of all possible configurations of subduction zones, especially in the pre-Pangea timeframe. Moreover, there is a much greater uncertainty in the dynamic mechanisms of carbon cycling along subduction zones, and quantification of all geochemical decarbonation reactions is still in infancy (Gonzales et al., 2016). For these reasons, formal uncertainties cannot yet be quantified for models of subduction zone carbon cycling. Taking all limitations into consideration, the Accumulation Model still provides a first-order approximation of changing subduction zone lengths through time and the interaction with (buried) carbonate platforms as an indicator of CO<sub>2</sub> degassing, especially during the Palaeogene..

## 25 **6 Conclusions**

Wavelet analysis is a useful tool in elucidating coherent, phase-related periodicities between the CO<sub>2</sub> record and various climate forcing factors. Furthermore, our Accumulate model has the potential to



capture a broader range of degassing mechanisms, and thus provide an upper bound of total CO<sub>2</sub> emissions at subduction zones.

Our analysis has revealed that carbonate-intersecting subduction zone volcanism is likely to have contributed to the greenhouse excursion of the Early Eocene climatic optimum, with the CISZs along the Sunda-Java trench representing the largest contribution to atmospheric CO<sub>2</sub>. At other times, our analysis reveals potentially causal relationships between CISZ, non-CISZ and global subduction zone lengths and atmospheric CO<sub>2</sub> trends, but the effect of subduction zones could not be disambiguated from other tectonic and non-tectonic climate forcings.

This analysis lends partial support to the idea that, at certain times, carbonate-intersecting subduction zone volcanism is more important than non-carbonate intersecting activity in driving atmospheric CO<sub>2</sub>, yet the climate system is vastly complex and the result could mean that other processes have dominated climate feedback mechanisms through time, such as the proliferation of terrestrial plant life (Algeo et al., 1995), silicate weathering (Kent and Muttoni, 2008) and the emplacement of large igneous provinces (Belcher and Mander, 2012).

Generally, an absence of constraints on carbon-climate interactions in deep-time makes it difficult to test hypotheses about greenhouse and icehouse climate states. Clearly, more robust reconstructions of climate-forcing processes are needed to improve our understanding of the deep carbon system. It is suggested that further investigations be carried out at specific time intervals to eliminate the uncertainty around the time periods within the COI at the end of the data series (between 410-350 Ma and 50-0 Ma). With adjustments to the parameters and assumptions governing the carbonate platform evolution models, the data can be used as input into fully-coupled planetary-scale climate and carbon cycle box models. This would provide the most comprehensive and self-consistent approach to understand the contribution of emissions at subduction zones to the deep carbon cycle.

## Code and data availability

The subduction zone toolkit by Doss et al. (2016) was developed as a product of this research and has been made publicly available for use with open-source plate reconstruction software, GPlates. The toolkit includes all proxy CO<sub>2</sub> data, pyGPlates and bash scripts as well as the Matthews et al. (2016) plate model.

- 5 Both the Signal Processing Toolbox™ and Wavelet Coherence Toolbox™ for MATLAB® were used in analysis and the production of figures. The Wavelet Coherence Toolbox™ can be found at <http://noc.ac.uk/marine-data-products/cross-wavelet-wavelet-coherence-toolbox-matlab>, while the Signal Processing Toolbox™ can be found at <http://au.mathworks.com/help/signal/index.html>.

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## **Author Contribution**

Sebastiano Doss and Jodie Pall developed the Subduction Zone toolkit together and carried out modelling experiments under the supervision of Dietmar Müller and Sabin Zahirovic. Figures were prepared by Jodie Pall and Sebastiano Doss, and the toolkit repository was prepared by Sebastiano Doss. Jodie Pall  
5 conducted wavelet analysis with assistance from Rakib Hassan. Jodie Pall also prepared the manuscript with contributions from all co-authors.

## **Competing interests**

The authors declare that they have no conflict of interest.

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