Low-resolution Australasian palaeoclimate records of the last 2000 years

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Abstract. Non-annually resolved palaeoclimate records in the Australasian region were compiled to facilitate investigations of decadal to centennial climate variability over the past 2000 years. A total of 675 lake and wetland, geomorphic, marine, and speleothem records were identified. The majority of records are located near population centres in southeast Australia, in New Zealand, and across the maritime continent, and there are few records from the arid regions of central and western Australia. Each record was assessed against a set of a priori criteria based on temporal resolution, record length, dating methods, and confidence in the proxy–climate relationship over the Common Era. A subset of 22 records met the criteria and were endorsed for subsequent analyses. Chronological uncertainty was the primary reason why records did not meet the selection criteria. New chronologies based on Bayesian techniques were constructed for the high-quality subset to ensure a consistent approach to age modelling and quantification of age uncertainties. The primary reasons for differences between published and reconstructed age–depth models were the consideration of the non-singular distribution of ages in calibrated ¹⁴C dates and the use of estimated autocorrelation between sampled depths as a constraint for changes in accumulation rate. Existing proxies and reconstruction techniques that successfully capture climate variability in the region show potential to address spatial gaps and expand the range of climate variables covering the last 2000 years in the Australasian region. Future palaeoclimate research and records in Australasia could be greatly improved through three main actions: (i) greater data availability through the public archiving of published records; (ii) thorough characterisation of proxy–climate relationships through site monitoring and climate sensitivity tests; and (iii) improvement of chronologies through coretop dating, inclusion of tephra layers where possible, and increased date density during the Common Era.

1 Introduction

1.1 Background

Elucidation of climate system variability and long-term change requires a spatially and temporally robust baseline of natural climate conditions. This is particularly relevant for Australasia, where climate variability has strong agricultural, socioeconomic, and environmental impacts (Head et al., 2014; Kiem et al., 2016; van Dijk et al., 2013). The Intergovernmental Panel on Climate Change (IPCC) previously supported a 2000-year baseline to establish climate variability for Earth (Masson-Delmotte et al., 2013). This time period is ideal for providing an effective context for three primary reasons: (i) shifts in global boundary conditions are believed to be minor and well constrained over this time frame; (ii) the last 2 millennia contain periods of relatively warm and cool climate anomalies, which offers the
opportunity to study regional responses to global and/or regional climate fluctuations; and (iii) the majority of high-resolution proxy climate records occur within this period, which provides reconstructions of climate at individual sites and across geographic regions with increased chronological certainty (PAGES2k Consortium, 2013; Neukom and Gergis, 2012).

The International Geosphere–Biosphere Programme-led Past Global Changes (PAGES) Regional 2k initiative was established in 2008 to coordinate and synthesise regional- and continental-scale reconstructions spanning the last 2000 years. This network also provides a way to exchange ideas and test hypotheses about recent palaeoclimates that can be queried using consistent quality-controlled data sets. The PAGES initiative encourages the use of rigorous, multi-method approaches to compare variability, patterns, and timing of changes across regions (Kaufman, 2014). The Aus2k working group investigates Australasian climate variability over the last 2000 years, hereafter referred to as the Common Era (CE).

Data derived from natural archives for the purpose of investigating climate variability fall into two categories: high resolution (monthly to annually resolved) and low resolution (non-annually resolved). High-resolution archives, such as tree rings, corals, varved sediments, and some ice cores, have been used to reconstruct regional and global temperature trends over the Common Era (PAGES2k Consortium, 2013; Gergis et al., 2016; Mann, 2007; Mann and Jones, 2003). In addition to several advantages of using annually resolved data, such as chronological precision and temporal resolution, annually resolved data possess some limitations when examining the past 2 millennia. These limitations can include the confined spatial coverage inherent to the high-resolution data network and difficulties in capturing low-frequency variability (Anchukaitis and Tierney, 2012). The limitations of interpreting low-frequency signals in high-resolution archives are exemplified with tree rings, for which multiple short, individual series are used to compile longer composite chronologies. The applied standardisation techniques used to construct the composite chronologies can restrict meaningful long-term signal retention, referred to as the “segment length curse” (Cook et al., 1995).

Due to the limited potential of reconstructing multi-decadal and longer-term variability from high-resolution archives, it is important to complement the resulting reconstructions with non-annually resolved, low-resolution records (Moberg et al., 2005). Previous studies have explored combining high- and low-resolution archives in the Australasian region to investigate a range of climate variables and atmospheric circulation patterns (Goodwin et al., 2013, 2014; Lorrey et al., 2007, 2008). Annually resolved records in the Southern Hemisphere (including Australasia) have been identified, reviewed, vetted, and augmented (Neukom and Gergis, 2012), but no equivalent synthesis of non-annually resolved records in the Australasian region currently exists.

Low-resolution sedimentary archives available within Australasia include lacustrine, fluvial and wetland sediments (including peat), marine sediments, speleothems, and geomorphic features (e.g. moraines, dunes) across diverse climate settings. These archives have multiple strengths for use in palaeoclimate reconstructions. First, the typical length of low-resolution records (> 500 years) is longer than many available annually resolved records. Data processing techniques for low-resolution sedimentary archives also tend to preserve low-frequency climate signals, i.e. those over multi-centennial and longer time frames. Second, low-resolution archives have a greater potential to be more widely distributed in comparison to annually resolved archives for most regions (Anchukaitis and Tierney, 2012). This is especially true in the ocean-dominated Southern Hemisphere. For example, marine sediment cores can provide records of oceanic variability without the tight climatic and bathymetric constraints of coral records. Other low-resolution archives such as speleothems and lake sediments can provide continuous records from climate regions spanning arid regions (Gliganic et al., 2014; Quigley et al., 2010) to the tropics (Crausbay et al., 2006; Rodysill et al., 2013). Third, the climate signals preserved in low-resolution records can differ from those found in annually resolved records, meaning that a wider range of long-term climate changes, as well as differing types of climate variability, can be reconstructed through their inclusion in multi-proxy syntheses.

1.2 Aims

To date, Australasia has hundreds of published low-resolution palaeoclimate records. However, a comprehensive palaeoclimate record database has not been compiled and evaluated for suitability to contribute to the examination of climate variability during the Common Era. In this study, low-resolution palaeoclimate data sets for Australasia were compiled and assessed for their suitability for quantitative climate reconstruction efforts. Records were assessed against a set of predetermined quality metrics to develop a subset of suitable records that could then be presented in a flexible, consistent format to facilitate future palaeoclimate investigations in the region. The four objectives of this study are to (i) identify Australasian palaeoclimate records spanning the last 2000 years, (ii) evaluate each record against the criteria set out by the global PAGES2k network, (iii) recalibrate age–depth models of the resulting subset of records using Bayesian techniques, and (iv) discuss merits and shortcomings of existing palaeoclimate reconstructions while providing recommendations for future palaeoclimate record collection and development for the Australasian scientific community.

The work compliments a recent review of all annually resolved records in the Southern Hemisphere cover-
ing the Common Era (Neukom and Gergis, 2012), as well as other subregion synthesis efforts in Australasia (Freeman et al., 2011; Gouramanis et al., 2013; Lorrey et al., 2007, 2008, 2010). The outcomes of this study will be helpful to researchers by identifying the most reliable low-resolution records in the Australasian region for climate model–palaeoclimate data intercomparisons in the Southern Hemisphere (Phipps et al., 2013).

2 Data and methods

Records published before 2017 were identified through inspection of citation databases, reference lists of past review papers, online public data repositories, personal communication with authors, and a general inquiry to all Australasian Quaternary Association members. Data were retrieved from the NOAA palaeoclimate database (https://www.ncdc.noaa.gov/data-access/paleoclimatology-data), the Neotoma database (https://www.neotomadb.org), the PANGAEA data publisher (https://www.pangaea.de/), and directly from record creators.

2.1 Defining Aus2k low-resolution palaeoclimate data criteria

For this study, all assembled records were screened against a set of selection criteria for the purpose of identifying a high-quality subset for the use of the PAGES Aus2k working group. The selection criteria, outlined below, follow those designated by the international PAGES Regional 2k initiative (http://pastglobalchanges.org/ini/wg/2k-network/data). For inclusion, a record was required to meet the following five criteria:

i. The proxy must be related to one or more climate variables, as stated in a peer-reviewed publication.

ii. The record must extend continuously for at least 500 years out of the last 2000 years.

iii. The record must have an age model based on at least two to three chronological anchors.

iv. The record must have an average sample resolution between 2 and 50 years per sample or analysis.

v. The collection location must fall within the region that has been identified by PAGES Aus2k to influence Australasian climate (90°E–140°W, 10°N–80°S) (Gergis et al., 2016). The Australasian region includes tropical Southeast Asia because of the dynamical influences of the Indo-Pacific region on the Australasian monsoon (Meehl and Arblaster, 2002), as well as the Australian–New Zealand sector of the Southern Ocean and Antarctica because of oceanographic and atmospheric teleconnections (Hall and Visbeck, 2002; van Ommen and Morgan, 2010).

The application of each criterion was justified on several grounds. First, records must have a published, peer-reviewed interpretation of the relationship between the measured proxy and climate variable(s). This provides quality control through the traditional peer review process by palaeoclimate specialists. Second, the overall length and average sample resolution have been selected for the purpose of reconstructing climate variability at a range of timescales over the Common Era. It is important that the data have sufficient resolution to capture fluctuations at multi-decadal scales and that they are long enough to capture an appropriate number of cycles in the study period (Chen and Grasby, 2009). Third, the low-resolution records must have reasonable chronological constraints. Reasonable was defined by PAGES2k as containing at least one chronological control point near the youngest part of the record, another near 1 CE or the end of the record (whichever is younger), and, for records greater than 1000 years in length, an additional date near the middle of the record. Many records, primarily in the marine realm, extend beyond the Common Era. Dates outside this period were retained to constrain interpolation uncertainties at age model extremes. The final requirement is that records must be publicly available, which contributes towards the transparency and reproducibility of results. All of the records identified within the Aus2k region have been previously published, but very few were publicly available. One of the tasks undertaken by the Aus2k working group was to ensure that all records were stored in public archives. All Aus2k data sets are available through the NOAA palaeoclimate archive or PANGAEA data publisher (https://www.pangaea.de/) (Table 1).

Preservation of metadata relating to the Aus2k data sets will assist future computer-driven, multi-record comparisons and reconstructions. One recent initiative of the palaeoclimate community is the development of a “common language” of palaeoclimatology, in which data and metadata are stored in a consistent, machine-readable format (Emile-Geay and Eshleman, 2013; McKay and Emile-Geay, 2015). The Linked Paleo Data (LiPD) framework has been developed with input from the wider scientific community (McKay and Emile-Geay, 2015). The metadata retained for the Aus2k data sets are based on the fields in the LiPD framework. As a part of the metadata, raw age determinations are recorded. Although one approach for the creation of age models is presented in this study, the raw data are available for individuals who wish to apply alternative methods.

2.2 Past palaeoclimate data syntheses in Australasia

Previous palaeoclimate and palaeoenvironmental reviews have compiled lists of studies and obtained proxy data to address a range of research questions from the Australian and New Zealand sectors. Australian palaeoclimate records containing at least one date in the Holocene were compiled through a partnership between Macquarie University.
Table 1. Australasian records identified as high quality, according to the PAGES2k evaluation criteria, and associated metadata. Column titles indicate the political state where the site is located (VIC: Victoria; INDO: Indonesia; SA: South Australia; WA: Western Australia; NSW: New South Wales; TAS: Tasmania; NZ: New Zealand), latitude, longitude, elevation (m a.s.l.), classification of archive, source of core, description of archive, proxies measured within core, published interpretation of climate proxy ($E/P = \text{evaporation–precipitation balance}$), most recent publication, length of record, year of oldest sample (including uncertainty) (present = 1950 CE), year of youngest sample (including uncertainty), average sampling resolution according to published chronology (years sample $- 1$), public archive URL, and PAGES2k identifier (where applicable).

<table>
<thead>
<tr>
<th>Record Name</th>
<th>State</th>
<th>Latitude</th>
<th>Longitude</th>
<th>Elevation (m a.s.l.)</th>
<th>Classification</th>
<th>Source of Core</th>
<th>Description of Archive</th>
<th>Proxies Measured</th>
<th>Published Interpretation of Climate Proxy</th>
<th>Most Recent Publication</th>
<th>Length of Record</th>
<th>Year of Oldest Sample</th>
<th>Year of Youngest Sample</th>
<th>Average Sampling Resolution</th>
<th>Public Archive URL</th>
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<td>INDO</td>
<td>-8.01</td>
<td>138.31</td>
<td>324</td>
<td>Lake/wetland</td>
<td>Plant waxes</td>
<td>δD Precipitation intensity</td>
<td></td>
<td></td>
<td></td>
<td>902</td>
<td>-50</td>
<td>8</td>
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<td>Sediments</td>
<td>δ18O, δ13C, Mg/Ca, laminations</td>
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<td></td>
<td></td>
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<td>-48</td>
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<td>1</td>
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<td>113.31</td>
<td>215</td>
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<td>Sediment</td>
<td>Sedimentation rate, geochemistry</td>
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<td></td>
<td></td>
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<td>-59</td>
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<td>1940</td>
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<td>Dust Concentration, trace elements</td>
<td>Adirinty</td>
<td>Marx et al. (2011a, b)</td>
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<td>6493</td>
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<td>169.20</td>
<td>1420</td>
<td>Lake/wetland</td>
<td>Dust Concentration, trace elements</td>
<td>Aridinity</td>
<td>Marx et al. (2009a, b)</td>
<td>7645</td>
<td>7779</td>
<td>134</td>
<td>38</td>
<td>38</td>
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<td>SA</td>
<td>-37.01</td>
<td>140.01</td>
<td>24</td>
<td>Lake/wetland</td>
<td>Diatom Ecological assemblage, Mg/Ca, Sr/Ca, Na/Ca, δ18O, δ13C</td>
<td>E/P, temperature</td>
<td>Gouramanis et al. (2010a, b)</td>
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<td>Sediment; ostracods</td>
<td>Quartz grain occurrence, ecological assemblage, δ18O</td>
<td>E/P, wind strength</td>
<td>Kemp et al. (2012a, b)</td>
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<td>7721</td>
<td>7721 (±1000)</td>
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Table 1. Continued.

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<th>Archive</th>
<th>Proxy</th>
<th>Climate variable</th>
<th>Reference</th>
<th>Years in record</th>
<th>Oldest year (yr BP)</th>
<th>Youngest year (yr BP)</th>
<th>Resolution (yr)</th>
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<td>VIC</td>
<td>−38.35</td>
<td>143.00</td>
<td>121</td>
<td>Lake/wetland</td>
<td>Diatoms</td>
<td>E/P</td>
<td>Ecological assemblage</td>
<td>Barr et al. (2014a, b)</td>
<td>1552</td>
<td>1500 (±123)</td>
<td>−52 (+3)</td>
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<td>E/P</td>
<td>Grain size; geochemistry; Ecological assemblage</td>
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<td>Diatoms</td>
<td>E/P</td>
<td>Ecological assemblage</td>
<td>Barr et al. (2014a, b)</td>
<td>1440</td>
<td>1388 (±110)</td>
<td>−53 (±12)</td>
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<td>Sunda Islands</td>
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<td>118.90</td>
<td>−1296</td>
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<td>Foraminifera</td>
<td>Mg/Ca, trace elements</td>
<td>SST</td>
<td>Steinke et al. (2014a, b, c, d, e)</td>
<td>6010</td>
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<td>−54 (±6)</td>
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<td>−5.20</td>
<td>117.49</td>
<td>−1185</td>
<td>Marine</td>
<td>Foraminifera</td>
<td>δ¹⁸O, Mg/Ca</td>
<td>SST, precipitation</td>
<td>Newton et al. (2006a, b)</td>
<td>836</td>
<td>946</td>
<td>110</td>
<td>10</td>
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<td>Foraminifera</td>
<td>δ¹⁸O, Mg/Ca</td>
<td>SST, precipitation</td>
<td>Newton et al. (2011a, b)</td>
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<td>1949</td>
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<td>Foraminifera</td>
<td>δ¹⁸O, Mg/Ca</td>
<td>SST, precipitation</td>
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<td>Foraminifera</td>
<td>δ¹⁸O, Mg/Ca</td>
<td>SST, precipitation</td>
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<td>Makkasar Strait</td>
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<td>−460</td>
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<td>SST, precipitation</td>
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<tr>
<td>Kau Bay</td>
<td>INDO</td>
<td>1.00</td>
<td>127.50</td>
<td>−377</td>
<td>Marine</td>
<td>Sediments</td>
<td>δ¹⁸O</td>
<td>Precipitation</td>
<td>Tiefenbick et al. (2009a, b)</td>
<td>3152</td>
<td>3232</td>
<td>180</td>
<td>50</td>
<td><a href="https://www.ncdc.noaa.gov/paleo/study/10438">https://www.ncdc.noaa.gov/paleo/study/10438</a></td>
<td>n/a</td>
</tr>
<tr>
<td>Liang Luar</td>
<td>INDO</td>
<td>−8.32</td>
<td>120.43</td>
<td>550</td>
<td>Speleothem</td>
<td>Calcite</td>
<td>δ¹⁸O, trace elements</td>
<td>ENSO activity</td>
<td>Griffiths et al. (2016a, b)</td>
<td>2024</td>
<td>1970</td>
<td>−52 (±4)</td>
<td>8</td>
<td><a href="https://www.ncdc.noaa.gov/paleo/study/20285">https://www.ncdc.noaa.gov/paleo/study/20285</a></td>
<td>n/a</td>
</tr>
<tr>
<td>Cave KNI-51</td>
<td>WA</td>
<td>−15.30</td>
<td>128.62</td>
<td>100</td>
<td>Speleothem</td>
<td>Calcite</td>
<td>δ¹⁸O, sediment presence</td>
<td>Precipitation</td>
<td>Denain et al. (2013a, b)</td>
<td>8902</td>
<td>8844</td>
<td>−28</td>
<td>4</td>
<td><a href="https://www.ncdc.noaa.gov/paleo/study/20530">https://www.ncdc.noaa.gov/paleo/study/20530</a></td>
<td>n/a</td>
</tr>
</tbody>
</table>

n/a: not applicable.
and the New South Wales Department of Environment, Climate Change, and Water (Freeman et al., 2011). The review identified 190 low-resolution records and 51 high-resolution records. Of these 241 records, 141 were classified as “moderate to high confidence” based on climatic sensitivity, possible non-climatic influences, local forcing, and chronological confidence. Gouramanis et al. (2013) compiled a set of records for a latitudinal transect across the Australian continent that is used to compare consistency in climate histories between eastern and western Australia over the past ~8000 years. The data sets were chosen by the reputation of the published records, based on the regularity of citation.

Other groups within Australasia have previously conducted multi-proxy palaeoclimate syntheses under the banner of AUS-INTIMATE (Australasian INTegration of Ice, MArine, and TErrestrial records). Records identified through this initiative have benefitted the most recent PAGES2k effort to evaluate and update the last 2000 years. AUS-INTIMATE was organised within the International Union for Quaternary Research (INQUA), with two distinct research phases from 2004 to 2007 and from 2008 to 2011. Both NZ- (New Zealand) and OZ- (Australia) INTIMATE projects focused on the interval 30 000–8000 years ago (Alloway et al., 2007; Barrell et al., 2013; Bostock et al., 2013; Reeves et al., 2013b); however, many of the compiled records extend to the present. The purpose of AUS-INTIMATE was to integrate available proxy data into climate event stratigraphies. AUS-INTIMATE coverage has been extended from 8000 years ago to present via the Southern Hemisphere Assessment of PalaeoEnvironments (SHAPE) project supported by INQUA since 2013.

New Zealand palaeoclimate proxies covering several late Quaternary intervals, including the last 2000 years, were compiled prior to and during Phase I of Aus2k (Lorrey et al., 2008, 2010) to address how regional atmospheric circulation has changed during the late Holocene. The New Zealand data assemblage for the last 2000 years included 35 low-resolution (multi-decadal to centennial) hydroclimatically sensitive records. These data were compiled from the site level up to a homogeneous regional climate district level (Kidson, 2000; Lorrey et al., 2007) from a range of environments that range from temperate sub-tropical in the far north of New Zealand to glacial in the south. From studies that had undertaken multi-decadal binning of annually resolved temperature reconstructions 13 temperature-sensitive records were obtained. There are also several speleothem stable isotope series for New Zealand that cover the Holocene, including the last 2000 years (Lorrey et al., 2008, 2010; Lorrey and Bostock, 2017). In addition, two compilations of past Southern Alps glacier activity (summarised from Lorrey et al., 2008, and Schaefer et al., 2009) and a summer mean surface pressure anomaly reconstruction (after Villalba et al., 1997) completed the New Zealand low-resolution data set that is relevant for Aus2k. In the interest of not duplicating data previously included in the Aus2k high-resolution compilation, the New Zealand tree ring data are excluded here.

Additional global syntheses are also drawn upon in this study. The charcoal database presented by Mooney et al. (2011) is the Australasian subset of a global charcoal database (Power et al., 2010) and contains all data sets (published and unpublished) up until 2011 that include charcoal analyses. The OZPACS working group under the Australasian Quaternary Association (AQUA) was created to investigate ecosystem changes and human impact on the landscapes over the last 500 years. One outcome of the initiative was a list of records until 2007 that covered the target period (Fitzsimmons et al., 2007).

### 2.3 Caveats on resolving changes from low-resolution sedimentary records

Despite the benefits of low-resolution archives, these records often contain relatively large errors associated with radiometric dating techniques (Anchukaitis and Tierney, 2012; Moberg et al., 2005) and uncertainty associated with using age–depth models to predict ages of undated layers (Trachsel and Telford, 2017; Telford et al., 2004). Age ambiguity leads to difficulty in cross-correlating records. These errors can result from three primary complications in radiocarbon dating techniques: dead carbon contamination, multiple possible calibrated ages associated with measured 14C values, and inbuilt ages (McFadgen, 2007).

Radiometrically “old” or “dead” carbon derived from groundwater and/or carbonate rocks can drastically alter the apparent 14C age of freshwater bodies (Geyh, 2000) and the organisms that live within or near the water (Beavan-Athfield and Sparks, 2001). The possibility of contamination by old carbon can be minimised through the use of short-lived plant macrofossils (Blois et al., 2011), when present, as well as dating of modern water samples to identify the presence of an old carbon reservoir (e.g. Gouramanis et al., 2010). Fluctuations in atmospheric 14C through time may result from aperiodic changes in ocean–atmosphere–terrestrial radiocarbon partitioning, upper-atmosphere radiocarbon production, and oceanic upwelling dynamics (Rodgers et al., 2011) that lead to “wiggles” in the radiocarbon calibration curve. When this is pared with the measurement uncertainty of radiocarbon samples, it leads to a range of possible calendar dates (Blaauw, 2010). The inbuilt age of samples may have multiple components that influence dating uncertainties. These include incorporated age (i.e. chronologically old material contained in an organism that pre-dates its death, as with long-lived trees) and environmental residence time (also termed “storage age”), which is the elapsed time between the death of the dated organism and deposition of its remains in a dated horizon (McFadgen, 1982). The most common example of this phenomenon is the preservation of long-lived trees in the landscape before deposition in sediment (see Grant, 1985, for an example related to alluvial sedimentation).
It is not always possible to identify environmental residence time within a radiocarbon sample, and the uncertainty may not be acknowledged within the resulting chronology (McFadgen, 2007). In some cases, anatomical studies may reveal whether incorporated age is large or minimal (e.g. identifying heart wood vs. sapwood in tree samples). Methods exist to attempt to classify the relationship of a radiometric age to a horizon of interest; for example (i) a close age is a radiocarbon date from within or directly adjacent to the horizon of interest, which is assumed to have a minimal inbuilt age, due to the type of material; (ii) a minimum age is derived from a sample with a minimal inbuilt age, which has been collected stratigraphically above the horizon or event of interest; and (iii) a maximum age is derived from a sample with minimal inbuilt age, which has been collected from a horizon below the horizon or event of interest (McFadgen, 2007). Overall, the use of close ages within a horizon of interest, in conjunction with bracketing by minimum and maximum ages, assists in decreasing uncertainty in dating individual events. Estimated inbuilt ages for some common New Zealand plant species have been published (McFadgen, 2007), but less emphasis has been placed on this subject in Australian studies.

Identifying a high-quality subset of records allows both an inter-comparison of records and helps to answer questions of climatic consistency between or within regions (Tyler et al., 2015). Two factors that complicate comparison of published studies are the reliance on calibrated conventional radiocarbon ages (CRAs) and the wide range of methods that are currently used in age–depth modelling. The conversion of CRAs to calendar timescales can have variable results because of updates to the atmospheric radiocarbon calibration curve (Reimer et al., 2013). Furthermore, the calibration curves that are used to convert conventional CRAs to calendar-equivalent timescales have variable precision through time (Reimer et al., 2013). Both factors result in changes to the slope of and variability in the calibration curve; thus, multiple statistically significant calendar age possibilities exist for CRAs on organic material. As such, the probability distribution ranges for calibrated CRAs (and therefore their temporal uncertainty) can be large (> 100 calendar years) for some time periods in the last 2000 years (Anchukaitis and Tierney, 2012).

The recalibration of CRAs with the most up-to-date calibration curve can assist in improving the representation of the uncertainty for radiocarbon dates (Blaauw, 2010). A further source of age model uncertainty comes from the interpolation or modelling of ages between dated layers, an uncertainty that decreases proportionally to the number of age constraints. Traditional age modelling approaches, including linear regression and polynomial equations, treat age uncertainty within dated horizons and interpolated ages between chronological anchors differently. Age model uncertainty can be minimised by overlapping age probability distribution functions through a sedimentary sequence, but this is not always possible due to the cost of radiocarbon dating and availability of suitable material. Current age modelling techniques are capable of quantifying interpolation uncertainty when deriving age–depth relationships (Goring et al., 2012; Blaauw and Christen, 2011; Bronk Ramsey, 2009; Hua et al., 2012). Probability functions at each dated horizon are calculated, and then accumulation behaviour between these horizons is iteratively resampled to create thousands of possible time series. The probability distributions allow for the consideration of the non-singular nature of age calibrations for individual radiocarbon dates that form the anchors of a chronology (Hogg et al., 2013; Reimer et al., 2013).

### 2.4 Age model recalibration

One of the most commonly used software packages for constructing age models is “bacon” (Bayesian accumulation histories) (Blaauw and Christen, 2011), which is run through the R statistical package (R Core Team, 2015). Within the software, a priori information (“priors”) informs the outcome of the statistical tests – namely the sampling interval, memory strength, and accumulation rate. Prior values can be set, based on existing knowledge of particular archives and/or study sites (e.g. Hua et al., 2012; Goring et al., 2012), and varied by the program to determine the best fit (Blaauw and Christen, 2011). The sampling interval prior is an estimate of the realistic physical distance over which the accumulation rate can change. It is not possible to know for certain if there are shifts in accumulation rate within one physical sample; thus, changes are restricted to sampling intervals.

Memory strength refers to the extent to which the accumulation rate of one section relies on that of the previous section (i.e. the degree of autocorrelation), or the likelihood of a rapid shift in the accumulation rate. For example, speleothems are observed to have minimal memory effect (Scholz et al., 2012); therefore, the memory prior should be lowered from the default (Hua et al., 2012). For the Aus2k data sets, accumulation rate has been estimated from the published age–depth model. Even if the published accumulation rate was inaccurate, the program considers how well the priors agree with the accumulation rate suggested by the data. This also allows for non-linear accumulation rates (Goring et al., 2012), which is an important consideration in the Australasian context. For example, a rapid increase in sedimentation rate is known to correspond to European settlement in Australia (Gell et al., 2009) and changes in land cultivation practices in the Malay Archipelago (Gharibreza et al., 2013; Rodysill et al., 2012).

Bacon uses Student’s $t$ distributions for radiocarbon dates, which have wider tails than normal distributions (Blaauw and Christen, 2011). This distribution is chosen with the intention of including the maximum number of dates in an age–depth model and decreasing the need to remove outliers. In this study, decisions of the original authors were upheld in the recalibration of age models, including the exclusion
of radiocarbon dates due to inversion or contamination. Radiocarbon dates at terrestrial sites were recalibrated with the SHCal13 calibration curve (Hogg et al., 2013), while marine radiocarbon dates were recalibrated with the Marine13 curve (Reimer et al., 2013). Any radiocarbon reservoir effects identified by the original authors were applied during age–depth model construction. Overall, the approach used in this study maintains the specialist knowledge of the original authors, while updating records using a common statistical method for the development of age models and the calculation of uncertainty estimates.

3 Results

3.1 General attributes of Australasian palaeoclimate data

The complete compilation of Australasian records contains 675 records (Table S1 in the Supplement), shown in Fig. 1. The areas of high data availability occur around the coastal population centres of Australia, with density decreasing with increasing distance from cities. The Malay Archipelago has a moderate, yet spatially even coverage. New Zealand has data available across the country, with the majority of records located within the northern and eastern North Island and the western South Island districts (Lorrey et al., 2008, 2010). Karst terrain extends in small patches along the length of both main islands in New Zealand. This has resulted in individual and composite speleothem records that have been used to infer past regional climate conditions (Lorrey et al., 2007). The most common source of terrestrial palaeoclimate information for both New Zealand and Australia is pollen, followed by biotic microfossils. Geochemical analysis of foraminifera is the most common proxy in marine cores (Table S1). There are a number of study sites at which multiple proxies have been analysed, particularly pollen and charcoal in terrestrial cores, and δ¹⁸O and Mg/Ca of foraminifera in marine cores (Table S1).

As seen in Fig. 2, the length of records varies dramatically. Some lake sediment records focus on environmental change over decades (e.g. Tibby et al., 2010), while some marine cores extend into the Pleistocene (e.g. Van der Kaars and De Deckker, 2002). For many records, the youngest age is not precisely known, but the original authors assume the core top reflects the collection year or “present” (1950 CE).

Some records are presented as having annual or sub-annual resolution (e.g. Martin et al., 2014); however, many of these records are not constrained by annually resolved markers. These types of records are regarded as non-annually resolved records in this study.

3.2 Results of PAGES Aus2k screening

When the PAGES selection criteria outlined in Sect. 2.1 were applied to all Australasian records, a subset of 22 records met the stringent quality requirements (Table 1). Within this screened Aus2k subset, the two areas with greatest geographical coverage were southeast Australia and the Indonesian Malay Archipelago (Fig. 3). This follows the pattern seen in the complete data set (Fig. 1). Records from Indonesia are predominantly marine (n = 8), but also include four terrestrial records. Eight lake and wetland records are located within southeast Australia, and one speleothem record is located within western Australia. One record is physically located in New Zealand, but as a record of dust accumulation, it is interpreted to be a proxy for Australian climate (Marx et al., 2009). Lacustrine microfossils are the most common terrestrial proxy in the Aus2k records, while foraminifera geochemistry is the predominant marine proxy. Average sample resolution varies; eight records have a resolution of less than 10 years sample⁻¹, including six lake cores and two speleothems. Other records resolve decadal to multi-decadal timescales.

3.3 Age model updates

The age models for all Aus2k records in Table 1 were recalibrated using the techniques outlined in Sect. 2.4. The extent of change in the minimum and maximum ages, as well as timing of anomalous events, varies within the Aus2k data sets (Figs. 4 and S2). Examples of recalibrated chronologies are shown in Fig. 4.
4 Discussion

The results presented here are the first comprehensive collection of Australasian sedimentary records that cover the last 2000 years. Few records are currently publicly available through the data archives outlined in Sect. 2. There is moderate spatial and temporal coverage of existing records across the geographic network (Figs. 1 and 2), with the exception of poor coverage for arid central and western Australia. Although there are proxies from the arid region that cover longer time frames over the Quaternary (Fitzsimmons et al., 2013), most available records do not have the continuity and resolution to investigate climate variability during the Common Era. The resolution of most Australasian records falls between 2 and 300 years (Fig. 2), which is suitable for examining variability on multi-decadal to centennial timescales. A low number of radiocarbon dates and/or low confidence in the chronologies are the most common reasons for record exclusion from the Aus2k data set. Therefore, even if record length and resolution are ideal for examining climate variability over the last 2000 years, age model uncertainties mean that it would be difficult to draw conclusions on the timing of events.

4.1 Composition of the low-resolution Aus2k data set

The 22 records that meet the PAGES2k selection criteria provide a subset of records with robust chronologies, an identified proxy–climate relationship, and sufficient record length and resolution to investigate decadal to centennial variability during the last 2000 years. The number of high-quality records is very low in comparison to the total number of palaeoclimate records identified and assessed. The low acceptance rate of records into the Aus2k database (3 %) may reflect regionally specific problems of sparse and discontinuous sediment records and poor preservation of macrofossils for radiocarbon dating due to sparse vegetation, in addition to a historical focus on other aspects of Quaternary research in the Australasian region.

The geographic distribution of Aus2k records displays stronger spatial biases than the complete regional database (Fig. 3). Southeast Australia has seven records, likely due to the ease of access to locations proximal to major cities with research institutions, and a relative abundance of lakes and wetlands. In contrast, the availability of high-quality records in Indonesia relates to global interest in the region as a dynamical “centre of action” for numerous climate drivers including the El Niño–Southern Oscillation (ENSO), the Indian Ocean Dipole (IOD), and the Australian–Indonesian
summer monsoon (AISM), resulting in high levels of international funding for research in this area.

While New Zealand has a high number of sites that could potentially contribute more to understanding palaeoclimate of the last 2000 years, many records fail to pass the Aus2k criteria. The main reasons for New Zealand records not meeting the selection criteria are lack of an established proxy–climate variable relationship, insufficient sampling resolution, or the use of composite chronologies that require care in interpretation. Nonetheless, it is clear from the New Zealand proxy assemblages that the presence of tephras and pollen markers can improve the chronostratigraphic constraints associated with 14C dates as applied in many cores. Some sites also show potential to be revisited to improve age controls, sample at higher resolution, and calibrate proxy data against instrumental records to develop a reliable climate reconstruction (Roop et al., 2015).

The subset of 22 high-quality records that meet the Aus2k criteria includes a range of lacustrine sediment cores, marine cores, speleothems, and two peat cores. These archives are best suited for examining decadal to multi-decadal variability due to their accumulation rate, continuity, preservation, and dating potential. A brief description of archives and their applicability to studying climate variability during the Common Era is provided below.

### 4.1.1 Lakes, wetlands, and peatlands

The majority of palaeoclimate records in Australasia are sediment cores from lake and wetland environments (Figs. 1 and 3). The length of lake and wetland records can vary greatly, including short, high-resolution records that focus on inter-annual changes and long, low-resolution records that cover hundreds of thousands of years (Fig. 2). Cores are analysed for both biogenic and inorganic proxies. Peat bogs can be ideal sources of sediment cores because of high accumulation rates and the capture of a variety of organic and non-organic components (Barber et al., 1994; Booth et al., 2010). Peat is a promising archive within Australasia due to the large longitudinal coverage; mires are found from tropical locations in Papua New Guinea to the subantarctic islands (McGlone, 2002b; McGlone et al., 2010; Whinam and Hope, 2005). Most peat-based records in Australasia contain pollen and charcoal that may be used for palaeoclimate, palaeoecology, and palaeo-fire reconstructions (Whinam and Hope, 2005; Mooney et al., 2011). Degree of humification has also been applied as a hydroclimate indicator in the late Holocene (Burrows et al., 2014; Wilmshurst et al., 2002) in cores for which dating density is sufficient.

A possible limitation in the Australasian context is the assumption of a stable relationship between sediment properties and climate variables over long periods of time. Humans have likely impacted Australian wetland ecosystems for the entire duration of the Holocene (Fletcher and Thomas, 2010b; Black et al., 2007), and an impact has been recognised in New Zealand during the last millennium (Horrocks et al., 2007; McGlone and Wilmshurst, 1999b). This anthropogenic influence has intensified across Australasia since the arrival of European settlers (Gell et al., 2007; Bickford and Gell, 2005; McGlone and Wilmshurst, 1999a), which may lead to palaeolimnological signals unrelated to climate. The primary consideration in lake-, wetland-, or peat-derived climate archives is a clear understanding of the modern proxy–climate relationship, including the geomorphic, hydrological, geochemical, and biological responses, most of which are complex and non-linear (Adrian et al., 2009; Winder and Schindler, 2004). Site-specific factors such as sediment accumulation rate, basin morphology, and hydrological balance may potentially have a strong impact on the preservation of climate signals (Wigdahl et al., 2014). Detailed understanding of these relationships relies on local monitoring programs or comparisons between observed proxy behaviour and instrumental records over a sufficient length of time. Development of mechanistic response models is also a priority in order to quantify the sensitivity of certain proxies to hypothetical changes, as well as to integrate the multiple climate effects upon a particular palaeoclimate record.

The most common approach for characterising modern proxy–limnology–climate relationships in Australia is the “calibration in space” of lake- and wetland-derived proxies, for which lakes across an environmental gradient are sam-
Figure 4. Examples of bacon outputs for recalibrated age–depth models for (a) Lake Elingamite; (b) Rebecca Lagoon; (c) Liang Luar Cave; (d) marine core MD98-2181. Originally published age–depth relationships were retrieved from public archives (Table 1) and are displayed by a dashed red line. The Common Era is highlighted by a black rectangle in records that extend beyond the last 2000 years.

Ostracods

Ostracods, small carbonate bivalve crustaceans, have been used as palaeosalinity and lake level indicators in southern Australia for over 3 decades (De Deckker, 1982; Gouramanis, 2009). The regular moulting of valves throughout the organisms’ lifetime means that there is a rapid response time of calcite accretion to changes in the lake environment. Originally, observed salinity tolerances of modern species were used to infer palaeosalinity (De Deckker, 1982). More recently, transfer functions have been developed to translate fossil assemblages into quantitative salinity estimates through the use of spatial training sets for sites across southern Australia (De Deckker et al., 2011; Gouramanis et al., 2012; Gouramanis, 2009; Kemp et al., 2012). Reconstructed lake water salinity fluctuations are interpreted to reflect precipitation–evaporation (P/E) balance, assuming minimal groundwater flow into and out of the lake basin.

Geochemical analysis of ostracod valves is another proxy used to reconstruct lake chemistry and water temperature. Monitoring of modern lacustrine systems has led to detailed understanding of controls on ostracod valve chemistry in Australian lakes. Valve Mg/Ca records are affected by both lake water Mg/Ca values and temperature (Chivas...
et al., 1986). For much of the ostracod research in Australia, valve Sr/Ca has been interpreted as a proxy for water Sr/Ca (Chivas et al., 1985, 1986) with a possible temperature influence (De Deckker et al., 1999). Recent studies argue that alkalinity is also an important influence on valve Sr/Ca (Gouramanis and De Deckker, 2010). Stable isotope analyses are also undertaken on the carbonate valves. Oxygen isotope values reflect the combined influence of the oxygen isotopic composition and temperature of the lake water, while carbon isotope values reflect the isotopic composition of the dissolved inorganic carbon present in the lake system (see Gouramanis et al., 2010, and references therein).

Detailed ostracod-based investigations of climatic and environmental change, as well as salinity reconstructions indicative of E/P balance, are available for Blue Lake in South Australia (Gouramanis et al., 2010), Barker Swamp in Western Australia (Gouramanis et al., 2012), Lake Keilambete and Lake Gnotuk in southern Victoria (Wilkins et al., 2013), and lakes in the northern region of Victoria (Kemp et al., 2012). Although the sample resolution at Barker Swamp and Lake Gnotuk precludes the inclusion of the sites in the Aus2k data set, all of these sites possess a salinity reconstruction. This diversity of proxies, as well as the high-resolution sampling of the sediment cores, has allowed for high-quality climate and environmental reconstructions based on Australian ostracod records.

Diatoms

Ecological assemblages of diatoms, siliceous unicellular algae, are used to create quantitative and qualitative climatic and environmental reconstructions for lake and river systems across Australasia. Diatom fossils are well suited to decadal to multi-decadal climate reconstruction because of their short lifespan and sensitivity to subtle changes in their environment. These characteristics facilitate rapid responses to shifts in environmental change and high-resolution sampling in sediment cores. Transfer functions, developed from modern calibration data sets, have been established for numerous aquatic variables in both estuarine (Logan and Taffs, 2013; Tibby and Taffs, 2011) and lacustrine (Gell et al., 2005) settings. Variables include conductivity and salinity (Barr, 2010; Barr et al., 2014; Gell, 1997; Saunders et al., 2007, 2008; Saunders, 2011), pH (Tibby et al., 2003), and nutrients (Logan and Taffs, 2013; Tibby, 2004). Detailed studies on short timescales have examined pre-European baselines and anthropogenic impact since European settlement in the 19th century through pH (Taffs et al., 2008), salinity, and nutrient (Saunders et al., 2008) reconstructions.

Two diatom-derived conductivity reconstructions for Lake Elingamite and Lake Surprise in western Victoria are included in the Aus2k data set (Table 1). Transfer functions for the lakes are based on 47 sites across southeast Australia, and reconstructions have been subject to multiple forms of quality control before being interpreted in a climatic framework (Barr et al., 2014). In addition, both sites have chronologies based upon radiocarbon and 210Pb dates that constrain the timing of inferred climatic shifts. Date density along the core, in addition to dates near the bottom of the core, leads to reduced uncertainty for age estimates for each sample (Barr et al., 2014).

Palaeo-water isotopes

Plant wax deuterium (δD), controlled by source water deuterium values, can be preserved in lake and marine sediment cores. Analysis of leaf n-alkanes can assist in the reconstruction of local precipitation δD values if the degree of fractionation between the leaf and water is known (Sachse et al., 2006). Two Indonesian sedimentary records within the Aus2k data set use δD measurements as a climate proxy: one terrestrial and one marine. Konecky et al. (2013) used terrestrial plant wax compounds in lake sediments to reconstruct rainfall amount, associated with AISM intensity. Tierney et al. (2010) analysed leaf waxes in material that had been transported offshore. The same controls on δD were assumed in both settings, with no impact by sediment transport in the marine core.

Lithics

The lithic fraction of sediment cores can provide information about climate-driven depositional environmental changes through time. In Australia, grain-size analyses have been used as lake level indicators in locations where the relationship between sediment size fraction and lake levels is well understood. The most heavily studied example is Lake Keilambete in Victoria (Bowler, 1981; Bowler and Hamada, 1971; Mooney, 1997; Mooney and Dodson, 2001; Wilkins et al., 2013). The Lake Keilambete lake level reconstruction is very commonly used for validation of other palaeoclimate records in the region. Recent high-resolution sampling of new cores, and the examination of new proxies within these cores, reinforces the interpretation of the grain size analysis (Wilkins et al., 2013). The dating density is also the highest of any of the Aus2k records, with four new accelerator mass spectrometry radiocarbon dates and four optically stimulated luminescence dates within the last 2000 years in the most recent chronology (Wilkins et al., 2012).

Changes in transport into a lake, reflected by accumulation rate, can be driven by climatic changes such as surface run-off or wind strength, or changed catchment conditions due to human impact (Sloss et al., 2011; Zhang et al., 2011). A rapid increase in sedimentation rates associated with European settlement is seen across Australia. Studies of wetlands and lakes across southern Australia have revealed increases from 2- to 80-fold between pre-settlement and modern day (Gell et al., 2009; Hollins et al., 2011; Sloss et al., 2011). This phenomenon is important for separating human and climatic influences on sediment cores. The lacustrine records that are
available across New Zealand contain evidence for discrete sedimentation events or sedimentation variability. Signatures of acute sedimentation are interpreted as rapid in-washing of coarse loads Lake Rotonuiha: Wilmshurst et al., 1997; Lake Tutira: Eden and Page, 1998; Gomez et al., 2012; Round Lake: Chester and Prior, 2004) that could be influenced by climate and/or seismic variability. Some of the lithological changes observed in lake cores are suggested as a response to climatically driven increases and decreases in lake level (Lake Maratoto: Green and Lowe, 1985; Lake Poukawa: McGlone, 2002a). Other triggering factors for lake sedimentation that have been hypothesised and/or demonstrated include fluvial undercutting, anthropogenic impacts, weathering, and tectonically induced base level changes (Eden and Page, 1998).

Non-destructive analytical techniques for sediment cores are becoming more widespread in Australasian studies. These techniques, including reflectance spectroscopy (Saunders et al., 2012, 2013) and X-ray fluorescence (Fletcher et al., 2014), can be conducted at very high (<1 mm) resolution, and are easily combined with other analyses for multi-proxy studies.

Another important component of sediment deposits in Australia is the aeolian dust fraction. Dust deposition rates are a proxy for continental aridity and wind intensity, while spatial differences in deposition rates can suggest shifts in dust transportation pathways (Bowler, 1976; Hesse, 1994; Hesse and McTainsh, 2003). The method for classifying dust varies by site and depends on the sedimentary environment. For coastal study sites, the local quartz input from sand dunes is ignored, while remaining material is assumed to have been transported to the site via aeolian means (McGowan et al., 2008). For peat bogs, the mineral content is determined as the non-combustible fraction of dry peat mass (Marx et al., 2011, 2009). Mapped and modelled variations in trace element signatures and ratios of “far-travelled” sediment can elucidate shifts in dust sources and net transport (Marx and Kamber, 2010; Marx et al., 2011; Petherick et al., 2009). Grain size and morphology of quartz grains have also been analysed as proxies for wind speed and aeolian transport pathways (Stanley and De Deckker, 2002). The Aus2k data set contains two records that analyse the aeolian dust fraction in peat cores (Marx et al., 2009, 2011). In both records, cores were extracted from locations slightly elevated (~1 m) in comparison to the surrounding bog. This collection approach is predicted to minimise transport of local sediment and maximise atmospheric deposition. Frozen sediment cores were sampled at multi-decadal resolution. Cores from both sites were examined for trace element concentration, which allowed for the reconstruction of overall dust deposition as a proxy for continental aridity, as well as contribution of dust from specific source areas (Marx and Kamber, 2010; Marx et al., 2005).

**Pollen**

Australasia has a rich history of palynological studies, with research extending back to the 1960s (Churchill, 1960; Moar, 1967). Early research focused on reconstructing vegetation diversity at a single site, but approaches have expanded to examine broader environmental questions such as regional vegetation response to climatic shifts (Donders et al., 2007), reconstruction of a specific variable across a region (Fletcher and Thomas, 2010a), recovery from episodes of disturbance such as fire (Lynch et al., 2007), and responses to human impacts in the pollen catchment (Haberle et al., 2006; Horrocks et al., 2001; Leahy et al., 2005).

The investigation of the abundance and ecological assemblage of pollen spores sheds lights on palaeoecological dynamics through time, predominantly driven by changes in climate (Donders et al., 2007; Kershaw et al., 1991) and the impacts by human activity (Lynch et al., 2007). There is an extensive network of well-studied sites centred on the Atherton Tablelands in northern Queensland (Haberle, 2005; Haberle et al., 2006; Kershaw, 1970, 1975, 1983, 1971; Kershaw et al., 2007; Walker et al., 2000), including some of the most highly cited records of AISM dynamics and rainforest response to climate variability through time (Kershaw, 1994). The majority of pollen records are restricted to the peripheries of the Australian continent due to the need for water availability in the accumulation and preservation of pollen grains (Fitzsimmons et al., 2013). There have been comparisons of available pollen records for southeast Australia (D’Costa and Kershaw, 1997) and a north–south transect of high-quality pollen records along the east coast of Australia (Donders et al., 2007). New Zealand palynology records cover the entire length of the country and range in resolution from millennial scale to multi-decadal scale (see references in Lorrey and Bostock, 2017).

While almost all Australasian pollen reconstructions are qualitative in their approach, there have been a small number of quantitative studies. Cook and Van der Kaars (2006) comprehensively outlined early approaches (i.e. single-taxa indicators and modern analogue techniques (MATs)) and their limitations in the Australian context. The same study explored the potential of existing pollen sites to be used for the construction of transfer functions and found that regional transfer functions could be used to associate modern pollen distributions with modern hydroclimate. Herbert and Harrison (2016) conducted a similar review of modern analogue techniques in Australia and suggested that, despite possible limitations in the current sampling density of the continent, MAT can be an appropriate reconstruction technique. Transfer functions have been produced for average annual temperature in Tasmania (Fletcher and Thomas, 2010a) and New Zealand (Wilmshurst et al., 2007), but no quantitative reconstructions that pass the Aus2k criteria encompass the Common Era. Development of training data sets in New Zealand has historically been complicated by deforestation.
since 1200 CE; however, a pre-deforestation data set developed by Wilmshurst et al. (2007) mitigates this issue for future New Zealand studies.

4.1.2 Marine cores

Marine sediment cores have been collected from the entire perimeter of Australasia, some of which have accumulation rates and chronologies suited to the analysis of the last 2000 years (Figs. 1 and 3). In cores recovered in areas where sediment incorporates terrestrial input, microfossils reflect conditions within defined horizons in the water column, and organic biomarkers indicate environmental conditions in the biome of origin (Bradley, 2014). Marine sediments deposited within the last 2000 years are dated through radiocarbon methods and tephrochronology (Mohtadi et al., 2014; Oppo et al., 2009).

There is a dense concentration of marine cores in the Indonesian region, where there are large areas of shallow continental shelves (Reeves et al., 2013a). These areas remained above the lysocline through the recent past and now provide ideal sites for marine sediment core collection. Overwhelmingly the most commonly studied proxy in marine cores is the geochemistry of biogenic material. During recent millennia, oxygen isotopes of planktonic and benthic foraminifera vary as a function of both temperature and $\delta^{18}O$ seawater (Zachos et al., 1994). For some coupled ocean–atmosphere climate modes, such as ENSO and the IOD, the coupled warm–cold–dry conditions influence the $\delta^{18}O$ signature in the same direction, thus intensifying the climate signal in the oxygen isotopes (Brijker et al., 2007; Khider et al., 2011).

In places where both temperature and salinity vary on inter-annual timescales, Mg/Ca analyses allow for the elucidation of the two components of the $\delta^{18}O$ signature. Mg/Ca ratios are controlled by temperature and are independent of seawater salinity changes (Lea et al., 1999). These independent temperature determinations can then be used to remove the temperature component of $\delta^{18}O$ and isolate the salinity component. Therefore, the water temperature and water salinity can be used independently for climate reconstructions (Elderfield and Ganssen, 2000). This has allowed the tracing of the geographic extent, dominant control, and average conditions of the Indo-Pacific Warm Pool through time (Oppo et al., 2009; Stott et al., 2004), as well as connectivity between the Pacific and Indian oceans through the Indonesian throughflow (Linsley et al., 2010; Newton et al., 2011). In addition, water-column dynamics have been investigated by reconstructing temperature differences between surface-dwelling and thermocline-dwelling species of foraminifera. This has led to inferences about wind-driven mixing (Steinke et al., 2010) and properties of water masses that upwell in other regions of the globe (Khider et al., 2014).

Alternate isotopic analyses, such as the $\delta D$ interpretations outlined above, have also been applied to the marine realm (Tierney et al., 2010). In central Indonesia, one study has employed $\delta^{15}N$, controlled by basin ventilation, as a proxy for localised ENSO signatures (Langton et al., 2008). Marine proxies are well established as recorders of climate information over long timescales. Again, sedimentation rate is the primary limitation of marine cores as recorders of Common Era climate. It is also important to separate the atmospheric and oceanographic drivers of variability in sea-surface temperatures and salinity through multi-proxy approaches.

4.1.3 Speleothems

Over the past half-century, speleothems have emerged as valuable sources of palaeoclimate information because of their potential for preserving precisely dated, multi-proxy, high-resolution records of past climate change (Fairchild et al., 2006). They cover a range of temporal scales across the Holocene, from millennial (Partin et al., 2007) through to monthly to weekly resolution (Frappier et al., 2007; Treble et al., 2003, 2005a). Recent work indicates that Australasian speleothems offer a high-quality source of palaeoclimate information over the Common Era. Young speleothems (up to ~ 300 yr BP) can be dated through high-precision U–Th dating methods, as long as there is sufficient uranium within the calcium carbonate matrix and the growth rate is fast enough to provide sufficient material for dating (Zhao et al., 2009). Resulting dates can have appropriate precision (±10–80 years) for reconstructing multi-decadal to centennial climate fluctuations (Zhao et al., 2009). Radiocarbon bomb-spike dating has also been used to date young speleothems when U–Th dating techniques are not appropriate (Hua et al., 2012).

Speleothems fill an important geographic niche in the Australasian region, particularly for Australia, as they can be found in karst regions where a lack of standing surface water precludes the development of lacustrine records. Similar to lake cores, geochemical interpretations are site-specific, with depositional controls varying with bedrock characteristics and local climate. Moreover, the application of multiple proxies contained within speleothems can be used to narrow the range of possible palaeoclimatic and palaeoenvironmental interpretations. The site-specific nature of many reconstructions is reliant on site monitoring, hydrologic modelling, and karst theory (Baker et al., 2014; Fischer and Treble, 2008).

The calcite mineralogy of speleothems means that they are ideal for oxygen and carbon isotope analysis and trace element concentration determinations. The complexity of site-specific controls on oxygen and carbon isotopes is recognised within speleothem studies (Lachniet, 2009); as such, it is necessary to investigate the impact of precipitation geochemistry (Fischer and Treble, 2008), processes in the aerated (vadose) zone above the cave (Dreybrodt and Scholz, 2011), and in-cave conditions (Baldini et al., 2006) on the $\delta^{18}O$ signal preserved in each speleothem. Oxygen isotopes in mid-latitude Australian speleothems primarily record rain-
fall amount through precipitation isotopic composition (Treble et al., 2005a) or record karst aquifer recharge frequency (Markowska et al., 2016), whereas tropical samples from Indonesia and the monsoonal region of northern Australia are more sensitive to the intensity of precipitation (Denniston et al., 2013; Griffiths et al., 2013). Recent drip water monitoring has also identified a $\delta^{18}O$ response signal after a bushfire, driven by a change in surface evaporation–precipitation balance (Nagra et al., 2016). In young speleothem records, $\delta^{18}O$ values can be compared to instrumental climate data to identify correlations with temperature and rainfall (Treble et al., 2005a). Where speleothems can be sub-annually resolved, or where a significant seasonal bias can be inferred, excursions in speleothem $\delta^{18}O$ in tropical regions can be related to past cyclone events; this signal has been used to calculate cyclone occurrence over the past millennium (Haig et al., 2014). Early- to mid-Holocene $\delta^{13}C$ in a Tasmanian speleothem record was inferred to reflect productivity and the resulting carbon isotope fractionation in the soil (Xia et al., 2001). This is based on the extent to which atmospheric CO$_2$ is released into the soil through vegetation breakdown and is controlled by moisture levels in the soil (Goede, 1994). The comparison of $\delta^{13}C$ analyses with trace element analyses may provide clarification of dominant controls on carbon isotopic fractionate at a given study site (Treble et al., 2005b). Treble et al. (2005b) suggest that their 20th century $\delta^{13}C$ record could partially reflect water stress on leaf stomata (Farquhar et al., 1988), based on correlation with Mg concentrations. In Indonesian speleothem records, $\delta^{13}C$ has been found to often co-vary with Mg/Ca and Sr/Ca ratios, suggesting that these proxies respond to prior calcite precipitation (PCP; Griffiths et al., 2010; Partin et al., 2013). PCP occurs in dry conditions, when less water is transported or stored in the vadose zone, which leads to degassing of CO$_2$ into fractures in the bedrock (Fairchild et al., 2000).

In the New Zealand setting, many different factors are demonstrated to influence stable isotope signals in speleothems (Williams et al., 2010). Previous studies, which are largely theoretical, have indicated that $\delta^{13}C$ variations can be used to interpret climate changes in the form of local water balance (Lorrey et al., 2008). Including the aforementioned idiosyncrasies for cave environments and processes, local water balance has been largely assumed to represent effective precipitation in New Zealand. Therefore, past research has exploited $\delta^{13}C$ as a proxy for hydroclimatic variability related to precipitation amount. That reasoning has been employed to make inferences from speleothems about regional atmospheric circulation, which controls climate regimes and regional-scale precipitation (Lorrey et al., 2007). This synoptic approach allows the integration of co-varying, spatially heterogeneous responses of several speleothem environments into surface climate, which is forced by orographic circulation and advection related to base climate state shifts (Lorrey et al., 2008, 2012, 2014).

In the Australian setting, Mg/Ca in speleothems has been shown to be a reliable recorder of effective rainfall (Fairchild and Treble, 2009; Treble et al., 2003; McDonald et al., 2004) because longer water residence times increase the Mg/Ca in speleothem drip water (Fairchild et al., 2000; Fairchild and McMillan, 2007). This relationship has been supported by comparison of recent speleothem records to instrumental data sets (Treble et al., 2003). In addition, Australian studies of Sr/Ca have found the ratios to represent temperature-regulated fluctuations in terrestrial productivity above the cave (Desmarchelier et al., 2006) or the combined effect of PCP and/or growth rate, depending on the timescale examined (McDonald et al., 2004; Treble et al., 2003). Multiple nutrients in drip waters, including Cl, Mg, and Sr, were impacted by bushfires in Western Australia, driven by removal by fire processes, and subsequent changes in surface evaporation (Nagra et al., 2016). Indonesian studies suggest that drip rate and residence time influence Mg/Ca and Sr/Ca ratios in locations where PCP is not a constant driver (Partin et al., 2013). P/Ca has been suggested to be a palaeorainfall proxy (Fairchild et al., 2001; Treble et al., 2003) because of the release of phosphorous from soils and subsequent transport and incorporation associated with heavy rainfall events.

The only speleothem record in the Aus2k data set is from Liang Luar Cave, a tropical $\delta^{18}O$ record that expresses precipitation intensity above the cave (Griffiths et al., 2016, 2009). The very fine sampling interval means that the average sample resolution is high (8 years sample$^{-1}$).

### 4.2 Discussion of age modelling approaches

The recalibrated age–depth models developed in this study have variable agreement with the originally published models (Figs. 4 and S2). Most studies previously published in the Australasian region have constructed chronologies through linear interpolation between median calibrated ages. Blaauw (2010) stresses the hazard of ignoring the non-singular age distribution of calibrated radiocarbon dates because of obscured error in the age–depth models when date distributions are not properly acknowledged. The Aus2k records use variable construction methods for the published chronologies and variable methods of estimating and acknowledging errors. This is the primary reason for recalibrating existing Australasian age models and comparing the outcome of updated approaches to the published models.

Chronologies for most marine sediment cores are based on fitting a linear age–depth relationship across the set of dates. The results of bacon-derived age models moderately support the application of linear accumulation for this archive, with the ages of young and/or shallow samples more likely to match between the two approaches in comparison to samples from deeper in the core. The disparity between published and reconstructed ages for marine records increases back through time. This is most likely related to date density through individual cores, as well as periods of interpolation between...
dated horizons. Indonesian marine cores use the 1815 Tambora tephra as a chronological anchor, which decreases age uncertainty near the present, but date density further back in time varies between records.

The published Snowy Mountain core had age model difficulty, with two possible age models with similar \( r^2 \) values (Marx et al., 2011). The self-adjusting Monte Carlo approach within the bacon software clearly favoured one model over the other (Fig. S1). The bacon-derived age model showed greater agreement with the published age model built upon more dates. This is likely driven by acknowledgement of the probability distributions of calibrated radiocarbon dates, as well as estimated autoregression between sampled (but undated) depths.

Advances have been made with publicly accessible statistical age modelling software over the past decade. The “clam” (classical age modelling) software package facilitates age modelling through combining classical statistics with calibrated radiocarbon dates within a Monte Carlo framework (Blaauw, 2010). This approach incorporates realistic probability distributions for calibrated radiocarbon dates and can calculate age uncertainty through thousands of Monte Carlo iterations. However, the underlying statistical methods within and between classical and Bayesian approaches vary greatly (Blaauw, 2010; Blaauw and Christen, 2011; Bronk Ramsey, 2009). In the clam software, the creator chooses the type of relationship used to predict ages between chronological anchors (e.g. linear interpolation, polynomial regression, or smoothing splines), and then the program calculates likely age distributions based upon the chosen type of relationship. Blaauw (2010) suggests that Bayesian approaches construct more realistic age–depth models due to their incorporation of observed or predicted sediment behaviour; however, the simplicity of the classical approach means that it is arguably easier to construct age models, and the method remains transparent.

Two study sites in southern Australia (Barr et al., 2014) were originally published with chronologies constructed using clam. The Bayesian age models, based on the same radiocarbon and \(^{210}\text{Pb} \) dates, produced similar maximum and minimum ages and timing of events within the record; however, notable differences are also visible, particularly for the Lake Elingamite record between 100 and 500 YBP and between 1300 and 1200 YBP (Fig. S2). Differing age–depth model behaviour within these periods generally reflects differences in the degree of rigidity in the modelling approaches. That is, bacon age models appear more resistant to shifts in accumulation rate, even when low memory strength is implied within the prior settings. By contrast, clam allows the user to fit age models that respond more readily to changes in sediment accumulation rate. Rigidity is not a benefit or weakness of any given approach, but is a characteristic to be considered during age model construction. The literature suggests that Bayesian approaches still incorporate more site-specific information than classical methods; however, consistency in determining age uncertainties and objectivity in age modelling is arguably more important for regional comparisons (Blaauw, 2010).

The strongest predictors for the error envelope at the oldest or 1 CE sample are (i) the distance between the oldest or 1 CE sample depth and the nearest age anchor, and (ii) the 95 % confidence interval at the nearest dated horizon. The records that have the greatest departure from the published age models are those that have the smallest number of chronological anchors. The international PAGES working group established a criterion of two dates for records < 1000 years and three dates for records between 1000 and 2000 years in length. However, the outcomes of this study demonstrate that this criterion is still too relaxed for robust investigation of decadal to multi-decadal climate variability in the Common Era. For example, the age model for one Makassar Strait record (Tierney et al., 2010) is based on six dates and one tephra layer across two cores covering the past 2000 years. The number of dates present is much higher than that suggested by PAGES2k, but dating density in this record still results in an average 95 % confidence envelope for sample ages that is greater than 100 years. Therefore, the outcome of age model recalibration in this study suggests that the criterion of two or three dates within 2000 years is not nearly stringent enough to provide robust chronologies for examining climate dynamics over sub-centennial timescales. Based on the outcomes presented here, the authors propose at least one date every 200 years, with at least one date near the top of the core, and another near the oldest sample or 1 CE.

It can be argued that the Bayesian methods applied in this study represent the current state of the science with regards to age–depth modelling of Quaternary sediment sequences. Nevertheless, due to the ongoing development of radiocarbon calibration and modelling techniques, the age models generated here should not be viewed as permanent optimised chronologies. Radiocarbon calibration and chronology construction methods are likely to improve through time. Therefore, continuous updates of age modelling approaches could be assisted via provision of raw dates and complete chronological metadata in publications and public data repositories.

### 4.3 Aus2k data set limitations, potential, and recommendations

Identification and assessment of existing Australasian palaeoclimate records have highlighted limitations in the current data network. These constraints are outlined and discussed in the following section. This review also highlights additional action items that may be undertaken to improve the data network in the Australasian region. Expansion of the Aus2k palaeoclimate data network in a geographically large but institutionally limited region is a considerable undertaking. Therefore, a concerted community effort is required to coordinate the collection of new palaeoclimate data.
4.3.1 Climate variables and relationships

One reason for identifying and assessing low-resolution records in Australasia is to determine what climate variables are represented in the high-quality subset. A distinct skew is evident for the types of climate variables currently available. New Zealand is biased towards temperature interpretations, with many of the existing low-frequency records having been constructed through multi-decadal binning of annual data (not discussed within this study). Conversely, climate variables currently represented in the high-quality Aus2k subset are heavily skewed towards hydroclimate indicators, as reconstructed by the diverse proxies outlined in Sect. 4.1.

Only one low-resolution terrestrial temperature reconstruction exists in the Aus2k data set: the Duckhole Lake record (Saunders et al., 2013). A range of proxies have been used in other regions of the world to reconstruct terrestrial palaeotemperatures in low-resolution records (Marcott et al., 2013); however, they have not yet been applied to Australasian sites on the timescales examined here. Lake temperatures have been reconstructed through chironomid transfer functions on the east coast of Australia (Chang et al., 2015), Tasmania (Rees and Cwynar, 2010) and the South Island of New Zealand (Vandergoes et al., 2008; Woodward and Schulmeister, 2007) on timescales beyond the Common Era. Modern training sets exist for additional locations in Tasmania (Rees et al., 2008) and an additional location on the South Island, New Zealand (Dieffenbacher-Krall et al., 2007). All of these transfer functions have the potential of being applied to the Common Era, thus providing quantitative reconstructions from subtropical and temperature climate zones of Australasia.

Another temperature proxy applied to Australasian sites is the distribution of branched glycerol dialkyl glycerol tetraethers (GDGTs) in membrane lipids in sediments (Prahl and Wakeham, 1987). This proxy has been used to reconstruct mean annual temperature in Lake Pupuke in New Zealand (Heyng et al., 2015) and Lake Mackenzie in Australia (Woltering et al., 2014). Both temperature and aridity have been reconstructed for Onepoto maar by combining analysis of fatty acid $\delta^{13}$C, biomass-burning biomarkers, and pollen abundances calibrated to mean annual temperatures (Sikes et al., 2013). The use of GDGTs and other lipid biomarkers has great potential for reconstructing Australasian temperatures during the Common Era; however, it faces significant challenges too, including non-systematic uncertainties of $\sim 1$ °C, which may obscure the magnitude of temperature change during the last 2000 years, in addition to much greater systematic uncertainties related to the origin of the biomarkers and the type of calibration used (Woltering et al., 2014).

Borehole-derived ground surface temperature reconstructions from across the Australian continent show strong agreement with high-resolution palaeoclimate data sets (Appleyard, 2005; Cull, 1982; Huang et al., 2000; Pollack et al., 2006; Suman et al., 2016). However, the temperature estimates derived from boreholes reflect long-term, low-frequency trends that fall outside the desired sample resolution of this study (Pollack et al., 2006).

A requirement of all palaeoclimate research is a thorough understanding of the relationship between climate variability and the geochemical, sedimentological, or biological composition of any record. To address these questions, researchers are employing long-term monitoring strategies to develop a detailed understanding of the local conditions required for calibrating palaeoclimate archives (Markowska et al., 2016; Treble et al., 2003). In some cases, monitoring outcomes can lead to some palaeoclimate records being excluded on the basis of hitherto unknown complications; conversely, modelling the response of palaeoclimate tracers to climate change can lead to more rigorous quantitative constraints on past climates (Jones et al., 1998, 2001). Developing modern monitoring strategies should sit prominently in the collective community goal of generating more reliable regional palaeoclimate records. Site-specific monitoring projects are particularly important in the Australian region, where shortcomings in the gridded instrumental meteorological data set are observed in rural areas and areas of steep climatic gradients (Jones et al., 2009; Tait et al., 2006).

4.3.2 Chronology

The most important characteristic that a record must possess for inclusion in the high-quality data set is a robust chronology, accompanied by acknowledgement and estimation of possible sources of uncertainty. Many older publications have a small number of dates due to the high cost of radiocarbon analysis in past decades. There are now low-cost commercial services, and institutional dating operations have endeavoured to match the costs of the competitive commercial market. These developments mean new, more cost-effective dating strategies can be employed to create new well-dated records, as well as renewed efforts to revisit former sites to improve the original chronologies.

There are also important caveats with composite records that cover the last 2000 years (see speleothem data presented in Lorrey et al., 2008). For example, composite data may be subject to distortion because of inconsistencies in the methods used to compile overlapping series into a longer, continuous record. From this perspective, potential issues could be inherited from changes in the sampling interval, as well as resultant mean and variance shifts across transitions in which individual series are spliced into longer records (Lorrey et al., 2010). A similar perspective can also be applied to irregular event-based records, such as alluvial sediments (Grant, 1985) that are bracketed by tephas and/or radiocarbon ages, or compilations of geochronology dates on moraine emplacement. In these types of cases, further work could help to evaluate the veracity of composite low-resolution records and also determine protocols on how the development and in-
terpretation of “master records” (e.g. isotope chronologies
from several speleothems in one cave) could be improved.
Inevitably, a multi-proxy approach for corroborating inter-
pretations is warranted.

It is possible for local factors to limit optimal dating ma-
terials or complicate the interpretation of radiocarbon dates
(e.g. Rodysill et al., 2013) However, use of tephrostratigra-
phy as chronological has commonly been applied in New
Zealand records (Lowe et al., 2013), has been employed in
initial syntheses (Lorrey et al., 2008, 2010), and has equiva-
 lent potential in most Malay Archipelago records. The only
eruption used as an anchor in the Aus2k data set is Tamb-
ora (1815 CE) in the Malay Archipelago records. Additional
New Zealand tephras have been identified and characterised
within the Common Era (Lowe et al., 2013), and a previ-
ously unutilised tephra in the Malay Archipelago has been
characterised (Alloway et al., 2017). Identification of ad-
titional eruptions, even in the form of cryptotephra (non-
visible tephra layers), is a potential source of chronologi-
cal tie points where datable material for radiocarbon anal-
yses can be scarce (Gehrels et al., 2006, 2008). For example,
the discovery of both basaltic and silicic glass shards in the
Holocene sediments of Lake Keilambete, Victoria, highlights
the potential of using cryptotephra to constrain chronologies
and correlate records across southeastern Australia and po-
tentially between Australia and New Zealand (Smith et al.,
2016).

When possible, conducting core-top radionuclide anal-
yses, such as $^{210}$Pb and $^{137}$Cs (Appleby and Oldfield, 1978)
can offer greater confidence in the age at the top of the core,
as well as any significant impacts on the site by the arrival of
Europeans (Sloss et al., 2011; Rodysill et al., 2013; Roop
et al., 2016). A robust “young” chronology derived from the
most recent section of cores may also allow comparison of
lower-resolution records to instrumental observations for
quantitative calibration. Future work on geochronology best
practice for the Aus2k region will help to define relevant pro-
tocols and establish potential chronological tie points.

4.3.3 Climate teleconnections

Previously, annually resolved palaeoclimate records from
one location within the Australasian region have dem-
onstrated statistically significant relationships with climatic
conditions at distant locations within the same geographic
area (Gallant and Gergis, 2011; Gergis et al., 2012; Ho et al.,
2013). These climate teleconnections have been utilised to
expand spatial coverage of palaeoclimate reconstructions
within Australasia (Ho et al., 2013). However, recent mod-
elling and examination of documentary evidence have indi-
cated that the climate teleconnection between Australian cli-
mate and remote drivers, such as temperatures in the west-
ern Pacific Ocean, have varied on multi-decadal to centennial
timescales (Ashcroft et al., 2016; Brown et al., 2016; Hope
et al., 2016; Lewis and LeGrande, 2015).

Multiple approaches for integrating Australasian palaeo-
climate data have recognised the importance of telecom-
nection stability and how varying teleconnection strength
through time may impact reconstruction interpretations (Ger-
gis et al., 2012; Gallant et al., 2013; Goodwin et al., 2013,
2014; Lorrey et al., 2014; Gergis et al., 2016). All of the ap-
proaches are potentially limited by the short length and qual-
ity of calibration timescales, uncertainties in proxy archive
dating, regional biases from uneven spatial coverage, sea-
sonal sensitivity, and in some cases multiple influences on
proxy archive interpretation (i.e. potential distortion effects
from other environmental processes). One principal compo-
nent regression (PCR) ensemble method uses Monte Carlo
simulations of analytical parameters such as principal com-
ponent truncation, proxy selection, and variations in the
length of calibration and/or the verification interval to esti-
mate reconstruction uncertainty. The ensemble spread of pos-
sible outcomes is then used as a quantitative estimate of un-
certainty, which may contain a component of variability re-
lated to teleconnection instability (Gergis et al., 2012, 2016).

Another approach has applied atmospheric regimes in
order to avoid climate proxy teleconnection dependencies
(Kidson, 2000; Lorrey et al., 2007; Goodwin et al., 2013).
Emphasis is placed on maximising agreement between lo-
caly derived palaeoclimate signals that are influenced by
physical factors such as site-specific orography, advection,
and wind stress. In that situation, local climates are assumed
to respond consistently through time to synoptic-scale at-
omospheric circulation. In the absence of other main forc-
ing mechanisms like volcanism, solar variability, greenhouse
gases, and insolation changes, atmospheric regime frequency
shifts are implicated for causing local anomalies (Goodwin
et al., 2013; Jiang et al., 2013; Lorrey et al., 2007, 2008,
2014; Lorrey et al., 2010). Past climate interpretations using
this approach remain heavily reliant on modern observations,
palaeoclimate reconstructions that have been calibrated to lo-
cal climate data, sufficient palaeodata network density, and
understanding how other forcing mechanisms operated and
impacted local climates in the past.

One high-quality record located on the South Island of
New Zealand indicates that dust accumulation in a peat bog
may be used as a proxy for aridity on the Australian continent
(Marx et al., 2009). This interpretation has been supported by
modern (1989–2001) dust provenance identification through
trace element signatures (Gingelet al., 2007; Marx et al.,
2005; McGowan et al., 2005). In that case, a physical process
(represented by a unique dust signature) supports a plausible
link to a direct, long-distance, synoptically driven transport
process and, therefore, a dynamical association with remote
climate forcing.

The use of upstream sites could assist in improving the
skill of reconstructions for a particular proxy at locations of
interest. The utilisation of high-quality sites near to, but out-
side, the location of interest may lead to regional reconstruc-
tions with higher statistical skill, as they may preserve sig-
nals of large-scale circulation patterns rather than local climate features (Gallant and Gergis, 2011; Gergis et al., 2012, 2016; Ho et al., 2013). In Australia, sites along the southern coast of South Australia and Victoria are impacted by a similar atmospheric circulation features and remote climate drivers as major cities and agricultural centres of southern Australia (Murphy and Timbal, 2008), lending the potential to use palaeoclimate records from near the coast to infer patterns of change inland (Ho et al., 2013).

Overall, the diversity of reconstruction methods applied to the Australian region, which either do or do not estimate uncertainty associated with teleconnection instability, provides opportunities to test and compare methods, examine reconstruction assumptions, and reconstruct climate for areas where there may be limited opportunities for data collection. The fact that many of these approaches result in the generation of spatial fields means that there is potential to utilise their collective outputs as an ensemble, forward model, or as prospecting guidance to target and collect new records in Australasia. In particular, the resulting spatial fields and climate metrics (indices, archetypal patterns) that are able to be generated from the current range of approaches used by the Aus2k group have offered opportunities to explain how local signals in a regional palaeoclimate network simultaneously arise in a dynamical context. In many cases, the different approaches have been used as tools to explore hypotheses and reconcile apparently conflicting climate signals (spatial heterogeneity) in the Southern Hemisphere data network (Goodwin et al., 2013, 2014; Lorrey et al., 2013, 2007, 2008).

Finally, the approaches employed thus far demonstrate potential for upscaling local palaeoclimate data assemblages to be more comparable with global climate model simulations (Ackerley et al., 2011; Lorrey et al., 2012). A recent high-resolution reconstruction of Australian temperature over the last millennium demonstrates the regionally specific timing and magnitude of temperature fluctuations that can be directly compared to climate model simulations to determine dynamical influences (see studies listed in Sect. 4a of Gergis et al., 2016). Overall, understanding of regional climate variability is important for using palaeoclimate data to evaluate possible responses to future climate change.

4.3.4 Recommendations

The following recommendations for future low-resolution palaeoclimate research of the Common Era are provided to help improve the coverage and quality of the Australasian data network:

1. The primary difficulty in establishing a basis for data comparison is a lack of publicly available data. Although there are multiple public data archives available (e.g. NOAA National Centers for Environmental Information, PANGAEA, Neotoma), few low-resolution records from Australasia are formally archived. It is of vital importance for the continuation of data comparison in climate research that those creating records archive their existing and future data with at least one of those repositories. Future application and comparison of published data would benefit from additional metadata included in publications. Useful metadata fields include raw geochronological data, archive collection dates, sampling interval, temporal resolution, and the method (and data) by which the proxy–climate relationship has been established.

2. Site monitoring (Treble et al., 2013; Roop et al., 2015; Tibby et al., 2003), climate sensitivity studies (Bertrand et al., 2002; Neukom and Gergis, 2012), and proxy systems models (Dee et al., 2016; Evans et al., 2013) are approaches that increase confidence in the type and strength of climate signal expressed by a proxy. These approaches would also help to improve the interpretation of previously published work in Australasia. Site monitoring and the development of transfer functions to help develop frameworks for dynamical interpretation would also improve the quality of mechanistic models and quantitative climate reconstructions. Support for the augmentation of global reanalysis data sets (i.e. 20CR) (Compo et al., 2011) via data rescue activities (Atmospheric Circulation Reconstructions over the Earth, OldWeather, etc.) (Allan et al., 2011, 2016; Brohan et al., 2012) to extend calibration series would provide large benefits to the palaeoclimate research community. Comprehensive understanding of site-specific climate–proxy relationships strengthens confidence that palaeoclimate records are expressing climate variability through time without modification of signals by human activities in the catchment.

3. Robust chronologies are of the utmost importance in understanding the frequency of climate fluctuations, defining the timing of events, and testing for synchronicity of events between sites. These questions cannot be confidently answered without rigorous chronological control. Reliable chronologies require multiple dates within the past 2000 years, a date near the top and bottom of the core or near 1 CE, and sufficient density of dates (at least one date per 200 years) across the Common Era to identify possible changes in timing within the past ~ 2000 years. Furthermore, although the use of cryptotephra to correlate sedimentary records has rapidly developed over the last decade, its application to Australasian (particularly Australian) records has been notably slow to take off, despite considerable potential for constraining chronologies for the last 2000 years (Davies, 2015; Smith et al., 2016). Generation of the Bayesian age models presented here suggests that classical statistics (i.e. linear interpolation or spline smoothing) might not fully capture complex depositional pattern changes in the Australasian region.
5 Conclusions

Within this study, 675 non-annually resolved palaeoclimate records across the Australasian region were identified and assessed. Of these, the majority are sediment cores from lakes and wetlands, with pollen ecological assemblages and invertebrate fossil geochemistry as the most common proxies. Of the large number of records identified, a subset of only 22 records met the international PAGES2k selection criteria to be classified as high-quality records. This data set contains good examples of what characteristics are necessary for the investigation of climate variability during the Common Era. Additional records of similar quality are needed to further expand the spatial coverage and diversity of climate variables within the Aus2k record network.

For each of the 22 records that were identified in this study, new age–depth models were constructed using the consistent Bayesian age modelling approach. Comparison between published and bacon-derived age models suggests that age modelling has a strong influence on the timing of events within and between records. Overall, three recommendations are presented to improve the quality of future low-resolution climate reconstructions and syntheses. Public availability of data and metadata will facilitate record comparison, updates, and assessment. Thorough characterisation of proxy–climate relationships could be achieved through site monitoring, climate signal characterisation through model comparison, and development and evaluation of new biological–sedimentological transfer functions. Finally, chronologies must be greatly improved for confident characterisation of Common Era climate variability. Increased numbers of dates, core-top dating, incorporation of sediment behaviour and site idiosyncrasies in age–depth model construction, and acknowledgement of age uncertainties are necessary.

The relatively low number of high-quality, low-resolution records in comparison with other regions of the world highlights the progress that is needed to improve reconstructions of the climate of the past 2000 years in Australasia. However, the existing high-quality records demonstrate the potential of sites within this region to provide well-dated records with recognised connections to climate variables. In addition, a range of reconstruction techniques applied to other regions and timescales have the potential to expand the spatial coverage and range of climate variables in Australasia.


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