Historical reconstruction unveils the risk of mass mortality and ecosystem collapse during pan-continental megadrought

Robert C. Godfree^{a1}, Nunzio Knerr^a, Denise Godfree^b, John Busby^a, Bruce Robertson^a and Francisco Encinas-Viso^a

^aCSIRO National Research Collections Australia, GPO Box 1700, Canberra, ACT, Australia 2601; ^b87 Upper Bullawa Creek Road, Narrabri, NSW, Australia 2390 ¹Corresponding author: Robert.Godfree@csiro.au

Submitted to Proceedings of the National Academy of Sciences of the United States of America

An important new hypothesis in landscape ecology is that extreme, decade-scale megadroughts can be potent drivers of rapid, macro-scale ecosystem degradation and collapse. If true, an increase in such events under climate change could have devastating consequences for global biodiversity. However, because few megadroughts have occurred in the modern ecological era. the taxonomic breadth, trophic depth and geographic pattern of these impacts remain unknown. Here we use new eco-historical techniques to quantify the impact of a record, pan-continental megadrought period (1891-1903 CE) on the Australian biota. We show that during this event mortality and severe stress was recorded in >45 bird, mammal, fish, reptile and plant families in arid, semi-arid, dry temperate and mediterranean ecosystems over at least 2.8 million km² (36%) of the Australian continent. Trophic analysis reveals a bottom-up pattern of mortality concentrated in primary producer, herbivore and omnivore guilds. Spatial and temporal reconstruction of pre-mortality rainfall shows that mass mortality and synchronous ecosystem-wide collapse emerged in multiple geographic hotspots after 2-4 years of severe (>40%) and intensifying rainfall deficits. However, the presence of hyper-abundant herbivores significantly increased the sensitivity of ecosystems to overgrazing-induced meltdown and permanent ecosystem change. The unprecedented taxonomic breadth and spatial scale of these impacts demonstrate that continental-scale megadroughts pose a major future threat to global biodiversity, especially in ecosystems affected by intensive agricultural use, trophic simplification, and invasive species.

megadrought \mid ecosystem collapse \mid mass mortality \mid trophic impact \mid Federation Drought

There is growing evidence that under warming scenarios of 1.5-3°C above preindustrial levels, the magnitude and extent of drought, and the occurrence of decade-scale megadrought, is likely to increase across most global land areas (1-3). This is of great concern because megadroughts (4) have a track record of devastating socio-ecological systems worldwide both historically (5-7) and within the past century (1, 8) on a continental scale, particularly when exacerbated by anthropogenic processes such as overgrazing, water extraction, and intensive land use. For example, two multi-annual 20th century droughts, the 1970s-80s Sahel drought and the 1930s US "dust bowl", both caused land degradation, ecosystem decline, and human disruption on a massive scale (1, 9). The severity of these impacts was driven by exceptionally low rainfall and reinforced by coupled edaphicatmospheric processes linked to intensive agricultural land use and human disturbance (9).

A major question in conservation biology is how native and introduced biota might be affected by increasingly intense, continental-scale megadroughts (CSM) in the future. Recent studies suggest that the ecological impact of such events is likely mediated primarily through rapid shifts in plant and animal populations and the trophic reconfiguration of associated food webs. These changes can be most severe among primary producer

and associated herbivore guilds, such as grazers and browsers of the African savannah (10-12), but may impact predators more than basal species (13) or affect both (14). There is also some evidence that mass mortality events (MMEs) can play a pivotal demographic role during extreme drought, and that these may be responsible for persistent changes in community structure and even transitions between alternate ecosystem states. However, given that CSMs occur very rarely (1, 6), the magnitude of such impacts, the mechanisms through which they manifest across trophic levels, and the implications for biogeography at regional to biome scales remain poorly understood.

One approach is to use historical sources to reconstruct the impacts of major droughts that occurred in the past. Historical reconstructions have successfully been used to investigate the impact of changing climatic regimes and other drivers on insects (15-16), disease (17), marine biota (18-19), bird assemblages (20) and ecosystem transitions in general (21), and the use of such data to guide ecosystem management is growing (22). Newspaper articles are particularly valuable for historical ecology, since they open lines of inquiry about historical events for which little or no other information exists. While data compiled from such sources must be used with caution due to potential bias and non-independence (23-26), they have been successfully used to reconstruct temporal changes in biota (23, 27-28) and physical, hydrological or climatic phenomena (29-30) that occurred decades to centuries ago. They therefore remain a large but mainly untapped resource for in-

Significance

It is thought that extreme, decade-scale megadroughts pose a major future threat to global biodiversity under climate change. However, such events occur rarely and so their capacity to drive ecosystem change remains largely unknown. Here we address this question by reconstructing the impacts of an extreme, historical megadrought period (1891-1903) on plant and animal assemblages across the Australian continent. The geographic extent (≥ 2.8 million km²) and taxonomic depth (>45 families) of impacts observed during this event were remarkable, and include mass population mortality and broad, bottom-up trophic collapse in multiple subcontinental hotspots. Our work provides new insights into the potential pattern and magnitude of ecological change that can occur during continental-scale megadrought.

Reserved for Publication Footnotes

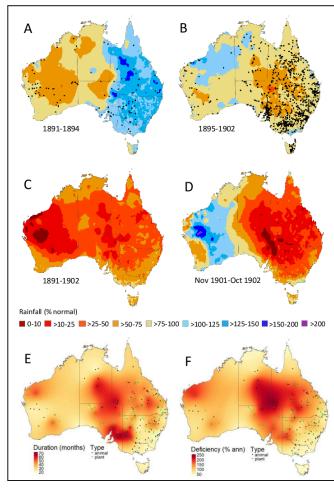


Fig. 1. Rainfall patterns and duration and magnitude of drought during the 1891-1903 study period. (A) Mean rainfall 1891-1894 as a percentage of the 1889-2015 average, showing multi-annual drought in central and western Australia. Black dots indicate geographic locations of drought records during the time period, which partly reflect the pattern of European settlement at the time. (B) As in (A) except for 1895-1902. (C) Minimum annual rainfall as percentage of average, 1891-1902. Most of the continent between 18°S and 32°S experienced at least one calendar year with <50% of average annual rainfall. (D) Hyper-intense drought between November 1901-October 1902, with much of eastern Australia receiving <25% of average rainfall. (E) Reconstructed continental profile of drought duration prior to mortality of biota, defined as the number of preceding months of continuous drought (D_{CON}). (F) Continental profile of drought magnitude (R_{CON}) prior to mortality of biota, defined as the cumulative rainfall deficiency over the period D_{CON} expressed as a percentage of annual mean rainfall PAV. See methods for further details

vestigating the impact of historical drought and other climatic extremes on populations and ecosystems (e.g., 31-32).

In this paper we shed light on these questions by developing an eco-climatic reconstruction of one of the most severe and geographically extensive megadrought intervals of the past two centuries, the Australian Federation Drought Period (1891-1903; FDP). Record low rainfall (see below) and patterns of agricultural land use during the FDP caused catastrophic soil and vegetation loss across large parts of the continental interior (33-34); in eastern Australia, the most intense phase of rainfall deficiencies, now known as the iconic 1895-1903 "Federation Drought" (FD), marked the first major episode (33) in a multi-decadal (1895-1945) "dust bowl" period (35; see *SI Appendix*, Fig. S1) of persistently low rainfall and severe land degradation. The study period also includes preceding intervals of significant drought in Western

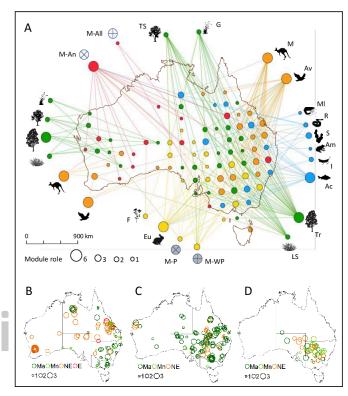


Fig. 2. Spatial distribution of drought impacts on flora and fauna during the FDP. (A) Modularity analysis of taxonomic co-occurrence network based on stress and mortality records. Modules are: red = predominately arid zone mixed animal and plant assemblages, green = subtropical to arid woodlands, shrublands, savannas and grasslands, orange = inland birds and marsupials, blue = fish and minor animal taxa, and yellow = predominantly mediterranean to arid woody shrubland containing Oryctolagus cuniculus (European rabbit). Module roles: 1) ultra-peripheral node, 2) peripheral node, 3) nonhub connector, and 6) connector hub(48). (B-D) Locations of mass mortality by area (Ma) and number (Mn) and population collapse to near-extirpation (NE) and extirpation (E) for native animals (B), plants (C) and Oryctolagus cuniculus (D). The categories for Ma, NE and E are as follows: $1 = local (10^2)$ m-1 km scale), 2 = district (10¹ km) or 3 = regional (10² km); the categories for Mn are 1) 10^2 - 10^3 , 2) 10^4 - 10^5 , and 3) 10^6 +. Biotic groups are: Ac = Actinopterygii, Am = Amphibia, Av = Aves, Eu = Eutheria, M = Marsupialia, MI = Malacostraca, I = Insecta, R= Reptilia, F = forbs, G= grasses, LS = low shrubs, TS = tall shrubs, Tr = trees, M-All = mixed all (animal and plant), M-An = mixed animal, M-P = mixed plant, M-WP = mixed woody plant.

Australia (1891-2) and subtropical Queensland (1892-3). Given concerns over the recent return of significant drought-induced ecosystem decline and mortality of native biota in Australia (36-38), and the potential increase in scale and severity of future megadroughts (1-3), historical CSMs such as the FDP provide one of the only sources of information available on which to build broad-scale predictive drought models that capture the genesis and development of such processes.

We begin by constructing a continent-wide dataset consisting of >500 biotic impact records (BIRs) extracted from contemporary newspaper articles and other historiographic sources during 1890-1903. Then, using geocoded data from >60 plant and animal genera, we test for evidence of population mortality and ecosystem collapse during the FDP using trophic reconstruction, statistical modelling, biogeographic network analysis, and spatial models of drought duration and magnitude. We also specifically consider evidence that other landscape-scale processes exacerbated the impact of drought on native and exotic biota, and demonstrate new methods for assessing the reliability of historiographic sources for quantifying drought impacts. The exceptional magnitude and breadth of impacts on the Australian

Footline Author

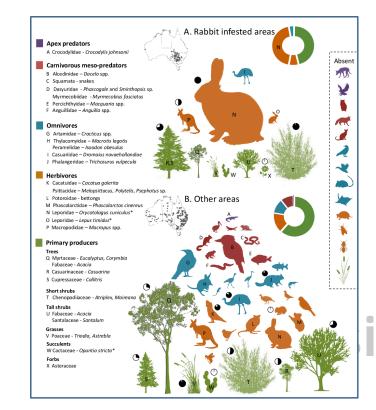


Fig. 3. Trophic structure of drought mortality and stress across plant and animal taxa inside (*A*) and outside (*B*) areas infested with large populations of the European rabbit, *Oryctolagus cuniculus*, showing declining impact at higher trophic levels. The size of a minimum circle surrounding each icon is directly proportional to the number of biotic impact records. Pie charts indicate the proportion of mortality records (black) vs. stress records (white). Examples of major groups for which few or no records exist (absent) are provided in each trophic level; from top to bottom: dingo (*Canis familiaris*), raptors, owls, red fox (*Vulpes vulpes*), feral cat (*Felis catus*), crows and ravens (Corvidae), waterfowl (esp. Anatinae), Muridae, gliders, turtles (esp. Chelidae), flies, ants, and aquatic and riparian reeds, rushes and other plants (incl. *Phragmites, Typha*).*introduced species.

biota revealed in our study provide key insights into the potential implications of pan-continental megadroughts for biodiversity conservation under climate change globally.

RESULTS AND DISCUSSION

Extent and severity of drought

Reconstructed rainfall data (39) show that during the FDP virtually the entire Australian continent was affected by protracted and severe precipitation deficits compared with the longterm average (P_{AV} ; 1889-2015). Semi- to quasi-decadal deficits occurred in all arid, semi-arid and subtropical areas between 18°S and 33°S (Fig. 1*A-B*) with $\approx 5.5 \times 10^6$ km² experiencing at least one extreme year with total annual precipitation (P_A) less than 50% of the average (i.e., $P_A < 0.5P_{AV}$; Fig. 1C). The most severe deficiencies occurred in the west and north of the continent in 1891-2 and 1894-8 (Fig. 1A-B), the eastern subtropics in 1892-3, and then most of eastern Australia in 1895-1902 (Fig. 1B; SI Appendix, Fig. S2). In the latter phase drought severity peaked in Nov 1901 – Oct 1902, when >1.5 × 10⁶ km² received less than 25% of $P_{\rm AV}$ and >2.5 × 10⁶ km² experienced record low rainfall for the period (Fig. 1D). Below-average rainfall persisted in parts of eastern Australia through 1903 before breaking in 1904. The severity of drought during the FDP was exacerbated by the duration and cumulative magnitude of rainfall deficiencies,

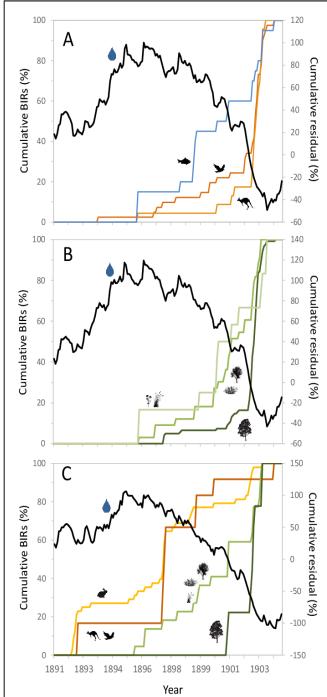
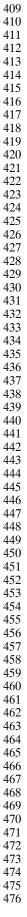


Fig. 4. Relationships between cumulative mortality (percentage of total) of major taxonomic groups and rainfall across eastern Australia during the 1891-1903 study period outside (*A-B*) and inside (*C*) areas heavily infested by European rabbits. Cumulative rainfall residuals (heavy black lines) show above average rainfall between 1891 and 1894 in all areas, apart from a short period in late 1891-early 1892, followed by establishment of semicontinuous drought in 1895 and continuous drought from 1898- to early 1903 (the Federation Drought; see methods). The cumulative rainfall residual (relative to the 1889-2015 mean) is expressed as a percentage of mean annual rainfall; for example in panel *C* the cumulative rainfall residual for the period 1895-1903 was close to 200% of mean annual rainfall. Icons are as in Figure 2.

which reached 7+ years and >200% of P_{AV} in some arid and semiarid areas (see below).



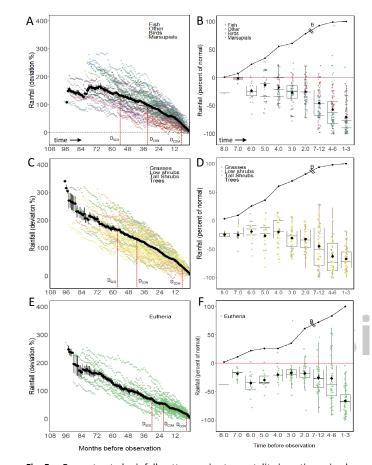


Fig. 5. Reconstructed rainfall patterns prior to mortality in native animals, native plants, and the European rabbit (Oryctolagus cuniculus). (A) Cumulative rainfall deficit as a percentage of mean annual precipitation prior to mortality in birds, fish, marsupials and other native animals outside of rabbitinfested areas. Shown are mean values of D_{CDM} = months of consecutive below average precipitation, D_{CON} = months of continuous drought and D_{SCO} = months of semi-continuous drought. (B) Rainfall deficits for birds, fish, marsupials and other native animals in months 1-3, 4-6, 7-12 and years 2-8 prior to observed mortality. The solid black line indicates the cumulative count of BIR records as a percentage of the total at each time period. (C-D) as in (A-B) but for native plant groups (grasses, low shrubs, tall shrubs, trees). (E-F) As in (A-B) but for Oryctolagus cuniculus inside heavily rabbit infested areas. Data for each BIR extend back in time only to terminal D_{CDM} , D_{CON} , or D_{SCO} dates. The mean cumulative rainfall deficit value (y axis) can be determined for any period prior to the BIR observation.

Recent reconstructions (37, 40) indicate that three major decade-scale drought epochs have occurred in the instrumental record: the (1892-) 1895-1903 "Federation Drought", the (1935-) 1937-1945 "World War II Drought", and the (1997-) 2000-2009 "Millennium Drought" (MD) (SI Appendix, Fig. S1; 41; dates in brackets used by some authors). Pre-instrumental (pre-1900) and instrumental reconstructions (40) indicate that the FD (esp. 1895-1902) was the most geographically extensive of the three, with more intense rainfall deficiencies across most of the eastern half and north of the continent (the exception being far southern regions; 37, 40) and a combined intensity and spatial footprint that exceeds that of any Australian drought for at least the past two centuries and possibly longer (40). In contrast to the MD, rainfall deficiencies were concentrated in spring and summer (37, 40), when many biota are especially sensitive to the combined effects of drought and heat stress (42), and were particularly extreme during 1896, 1899, 1900, 1901 and 1902 (40). Notably, cool-season deficiencies were also extreme during 1902 (40), which was probably the driest year across the continent during the instrumental record. Rainfall deficiencies during the FD were
associated with a sustained period of El Niño activity (the warm
mode of the El Niño/Southern Oscillation; 37, 40) combined with
the positive phase of the Inter-decadal Pacific Oscillation (IPO;
37) and probably neutral to positive values of the Indian Ocean
Dipole (37, 40, 43).477
480

483

484

485

486

487

488

489

490

491

492

493

494

495

496

497

498

499

500

501

502

503

504

505

506

507

508

509

510

511

512

513

514

515

516

517

518

519

520

521

522

523

524

525

526

527

528

529

530

531

532

533

534

535

Secondary indicators confirm the magnitude of drought impacts on hydrological, edaphic and agricultural systems, with more than 3×10^6 km² of pastoral land denuded of groundcover, extremely low river levels, tens of millions of livestock dying from starvation and thirst (34), and wind erosion affecting >1 × 10⁶ km² of the arid and semi-arid pastoral zone [*SI Appendix*, Fig. S3 and Table S1.1-14 (the number after the decimal refers to the account number in Table S1)]. In the south-eastern inland severe dust storms and soil drift occurred regularly, burying fences, buildings, and livestock, and even mobilising formerly stable sand dunes in parts of the arid zone (44). Social and economic impacts were also severe (*SI Appendix*, Table S1.15-18). Collectively, these data support the view that the scale and severity of the FDP meets or exceeds that of other major global droughts of the past century, such as the Sahel (45) and US "dust bowl" droughts (9).

Structure and reliability of biotic impact records

A total of 541 BIRs were extracted from historical sources between 1891 and 1903. The temporal distribution of spatially unique BIR observations (see methods) was strongly associated with drought severity in north-eastern (NE), south-eastern (SE) and western (W) continental areas (*SI Appendix*, Fig. S4A). Overall, BIRs occurred most frequently in very dry years, especially 1902 (66% and 49% of all records in NE and SE areas respectively) and 1891-92 (42% of records in W areas; *SI Appendix*, Fig. S2 and Fig. S4A) and very rarely if ever in wet years (NE = 0%; SE = 0.4%, W = 3.2% of records). The periods of very high BIR counts in the NE (1899-1903) and SE (1897-1902) are consistent with intensifying drought conditions during these years (*SI Appendix*, Fig. S2). On the other hand, the large number of counts in 1892 in the SE is anomalous based on the comparatively mild rainfall deficiencies occurring at this time (Fig. 2C).

We constructed a simple index (PR_R) to determine association between the timing of a BIR observation and the magnitude of the preceding cumulative 12-month rainfall relative to average $(R_{12}; \%)$. Here, PR_R is the percentile rank of the R_{12} prior to the observation month of given BIR relative to all R₁₂ values in the 1890-1903 study period (n = 157). Across all BIRs the mean $PR_{\rm R}$ of spatially unique records (see methods) was 15.6, or in the driest 16% of R_{12} intervals. Mean PR_R was also extremely low in the extreme years of 1902 (mean $PR_{\rm R}$ = 5.3 and 8.7 in the northeast and southeast) and 1891 (5.8 in western parts of the continent). The mean preceding cumulative 12-month rainfall across all BIRs ($R_{12} = -45.6\%$) was significantly (P < 0.001) below the null expectation of -4.2% (90% confidence interval = -5.0, -3.3), also confirming that BIRs were positively associated with extremely low preceding rainfall. Both are consistent with observer attribution of drought causality. However, the spatial distribution of $PR_{\rm R}$ values also reveal a cluster of higher values $(PR_{\rm R} > 40)$ across western New South Wales (NSW) (SI Appendix, Fig. S4B). As we discuss below, high $PR_{\rm R}$ values identify BIRs in which additional factors may influence the relationship between biotic impact and drought severity.

Impacts on animal and plant assemblages

536 Taxonomic and spatial aggregation of BIR data show that the 537 FDP caused mortality and extreme stress in a minimum of 50 538 families (67 genera) of animals and plants (SI Appendix, Table S2) 539 over at least 2.76 x 10⁶ km² or 36% of the Australian continent 540 (SI Appendix, Fig. S5), including in eight of Australia's broad 541 terrestrial ecoregions (46) and 45 of 89 large geographically dis-542 tinct bioregions (47). Evidence of local (10² m-1 km scale), district 543 (10^1 km) or regional (10^2 km) population collapse and mass 544 545mortality involving hundreds to millions of individuals occurred546across much of the continent, with all major animal and plant547groups affected (*SI Appendix*, Table S3). To our knowledge the548spatial and taxonomic breadth of these impacts exceeds that of549any drought yet reported in the Australian or global ecological550literature.

551 We built a co-occurrence network derived from aggregating 552 BIRs into a continental-scale 100 km x 100 km co-occurrence 553 grid (48, 49), which is shown in Fig. 2A. Biogeographic patterns 554 within the network helps us to detect geographical hotspots where 555 taxa have been impacted by the drought. Analysis of this network 556 reveals three important findings. First, the majority of BIRs were 557 concentrated in drier subtropical, semi-arid and arid parts of 558 the continent (mean annual temperature and precipitation of 559 approximately 15-24°C and 150-800 mm respectively). All major 560 plant and animal groups except for fish and trees display this 561 basic pattern (SI Appendix, Fig. S5A-B), although the total area 562 of impact (A_T) for fauna extended slightly further into mesic 563 northern subtropical and southern temperate environments than 564 plants ($A_T = 2.2 \text{ x } 10^6 \text{ km}^2 \text{ vs. } 1.8 \text{ x } 10^6 \text{ km}^2$; SI Appendix, Fig. 565 \$5). Few impacts were reported in more mesic eastern coastal 566 and cool far southern temperate areas of the continent (Fig. 2A), 567 where rainfall deficiencies were less severe (Fig. 1), and also 568 in the monsoonal north, which rainfall reconstructions (Fig. 1; 569 40) indicate did suffer periods of intense drought. These regions 570 contain numerous centres of high biodiversity and paleo- and 571 neo-endemism among major plant and animal lineages (50-52), 572 which suggests that recent megadroughts continue to reinforce 573 continental-scale phylogeographic patterns established during 574 more arid phases of the Pleistocene (53-55). 575

Second, the high modularity of the network (Q = 0.33, P = 0.02) indicates strong spatial synchronicity among drought impacts on specific groups of taxa. Here (Fig. 24), mixed communities (red colouring), woodland, shrubland and grassland (green), bird and marsupial assemblages (orange) and fish and minor animal taxa (blue) broadly partition along the strong aridity gradient that extends from coastal through dry temperate and subtropical to semi-arid and finally arid central parts of the continent. Semiarid to arid woody shrubland containing invasive populations of *Oryctolagus cuniculus* (European rabbit) form a discrete module (yellow; see below). The biome-scale geographic extent ($\geq 100,000$ km²) of each of these modules suggests that during megadroughts local refugia are likely to play a vital role in maintaining the viability of plant and animal populations, especially in more topoedaphically homogeneous landscapes (56).

590 Third, the presence of impacted areas involving multiple 591 biotic groups (i.e., non-hub connectors; 48) and local to regional 592 population collapse or mass mortality (Fig. 2B-D) reveals the 593 presence of two major subcontinental-scale impact hotspots dur-594 ing the FDP. The most distinct comprised $\approx 650.000 \text{ km}^2$ of 595 south-eastern arid, semi-arid and mediterranean ecosystems that 596 597 contained hyper-abundant populations of O. cuniculus (57) (SI Appendix, Fig. S5A). A trophic reconstruction of BIRs from this 598 hotspot (Fig. 3) shows mortality among herbivore and primary 599 producer guilds, including woody vegetation and herbs, O. cunicu-600 lus, and native herbivores (Macropus spp.). Here, impact records 601 showed a lower level of association with rainfall deficiencies than 602 elsewhere, with the mean $PR_{\rm R}$ of mortality records inside this 603 hotspot being significantly higher than outside (back-transformed 604 adjusted mean $PR_{\rm R} = 16.8$ vs. 8.5; $F_{1,218} = 6.5$, P = 0.01), in-605 dicating relatively higher rainfall in the preceding 12 months 606 (viz., driest 17% vs. 9% percentile). However, this mainly reflects 607 differences among animal records (mean $PR_R = 21.6$ vs. 7.3; P <608 0.001) and not plants (mean $PR_{R} = 9.3$ vs. 7.4; P > 0.1). Areas 609 inside this hotspot also had a much higher frequency of impacts 610 attributed to the synergistic effects of drought and overgrazing 611 than outside (26% vs. 6%; SI Appendix, Fig. S4C). 612

These data support the conclusion that in this hotspot a 613 classical boom-bust dynamic (58) developed during the FDP, 614 which involved a recurring cycle of growth and subsequent col-615 lapse and near-extirpation of immense (e.g., $10^6 - 10^7$) rabbit 616 populations (Fig. 2D; SI Appendix, Table S1.36-38) linked to food 617 618 and water supply and competition with domestic livestock and 619 native herbivores. In more arid areas, severe drought combined 620 with overgrazing by rabbits and livestock resulted in regional-621 scale $(10^2 + \text{km})$ mass mortality and collapse of edible shrubs and 622 grasses, especially Atriplex, Maireana and Acacia spp.. The wind 623 erosion, soil drift and land degradation that followed is a clear 624 case of ecosystem meltdown (59) caused by the interactive effects 625 of an invasive species, extreme drought, predator control, and 626 poor land management (33, 34, 57, 60). 627

628

629

630

631

632

633

634

635

636

637

638

639

640

641

642

643

644

645

646

647

648

649

650

651

652

653

654

655

656

657

658

659

660

661

662

663

664

665

666

667

668

669

670

671

672

673

674

675

676

A second area of especially high mortality occurred in central eastern to western Queensland, which experienced record rainfall deficits in 1901-02 (Fig. 1D, SI Appendix, Fig. S2). In this region a diverse native fauna including large terrestrial macropods, possums, the koala (Phascolarctos cinereus), emu (Dromaius novaehollandiae) and predatory birds (kookaburra and magpies) suffered apparent population collapse (Fig. 2A; SI Appendix, Table S1, S3). Mass mortality of vegetation occurred in stands of vegetation dominated by Acacia, Callitris and Eucalyptus tens to hundreds of kilometres wide (Fig. 2B; SI Appendix, Table S1.45-62). Again, the trophic pattern of these impacts and elsewhere (see Fig. 3) indicates a bottom-up, ecosystem-wide cascade of mortality focused on vegetation (62% of BIRs) and attenuating across herbivore (16%), omnivore (12%) and meso-predator (10%) guilds. Very few BIRs in this hotspot report overgrazing as a factor leading to biotic stress or mortality (SI Appendix, Fig. S4C), indicating that record rainfall deficiencies (up to 75-90% below average) were likely the primary driver of mortality. The main exception to this was the catastrophic decline of passerine and some predatory bird populations in central eastern Queensland, which was observationally linked in part to reduced availability of grasses, seeds and small prey (61), consistent with the response of avian assemblages to drought and livestock overgrazing elsewhere (62).

Mortality in a broad range of taxa was also reported across the western and central arid zone (Fig. 2), although since these areas were sparsely inhabited (see *SI Appendix*, Fig. S3), such events were probably underrepresented in our data. Less is known about these impacts, although mass vegetation mortality and severe wind erosion certainly occurred in some areas (e.g., the Gascoyne region of Western Australia; Fig. 2; *SI Appendix*, Fig. S3*C*), and native animal populations in the northern deserts (Fig. 2) were apparently so reduced that the food supply of local indigenous human populations was affected (*SI Appendix*, Table S1.24). Livestock grazing was not usually invoked as a causal factor (*SI Appendix*, Fig. S4*C*), although it probably, along with disease, played a contributing role in the sudden decline of native animal populations in the southwestern wheatbelt in 1898-1903 (63), and in vegetation loss across the Gascoyne.

Significant fish-kill events were noted in watercourses and lakes across parts of eastern Australia. Many involved the drying of ephemeral waterholes and lakes, but major inland and coastal rivers were also affected. The magnitude of mortality was often very large, as evidenced by a report that the first steamer to navigate the Darling River in western NSW after it resumed flowing in 1903 pushed up tons of dead fish (*SI Appendix*, Table S1.42). Extremely low water levels, contamination and eutrophication all probably contributed to mortality (*SI Appendix*, Table S1.5-9), as in more recent drought-driven fish kill events in the Murray-Darling basin (64).

Darling basin (64).677The nature of historical observations, which are often qual-678itative or semi-quantitative, do not usually allow for a strict test679of population or ecosystem-level change and recovery over time.680

576

577

578

579

580

581

582

583

584

585

586

587

588

681 However, while acknowledging these limitations, a basic evalu-682 ation of the hypothesis that ecosystem collapse occurred across 683 parts of the continent during the FDP is possible. Consistent 684 with recent approaches (65-67), we use three general criteria 685 for identifying collapse: 1) a perceived abrupt or drastic decline 686 in biotic populations across multiple trophic levels relative to 687 pre-drought abundance, 2) a widespread area of impact, not 688 restricted to localised populations associated with local habitat 689 heterogeneity, and 3) decadal-scale (or longer) persistence of 690 these changes. Contemporary articles provide evidence for 1) and 691 2), while more recent publications referring to the FDP provide 692 data relevant to post-drought recovery (criterion 3). 693

694

695

696

697

698

699

700

701

702

703

704

705

706

707

708

709

710

711

712

713

714

715

716

717

718

719

720

721

722

723

724

725

726

727

728

729

730

731

732

733

734

735

736

737

738

739

740

741

742

743

744

745

746

747

748

Collectively, evidence for collapse of semi-arid and mediterranean ecosystems in western NSW, southwest Qld and eastern South Australia during the FDP is unequivocal. The mass mortality of perennial vegetation (Fig. 2*C*) and associated loss of soil, biodiversity and ecosystem function were clearly understood at the time to be catastrophic (*SI Appendix*, Table S1: 74-76), and prompted a review of degrading processes in the semi-arid Crown Lands of western NSW in 1901 (68). These events are now seen as the first major episode (33, 34) of a longer period of "dust bowl" conditions and degradation in these regions, which lasted until the mid-1940s (35), when rainfall improved. Only partial recovery has occurred in most affected areas, despite significant improvements to land management practices.

The collapse of bird, mammal, shrub and tree populations in central eastern to western Queensland (Fig. 2B-C) are also indicative of broad-scale ecosystem collapse. Reports at the time indicate extensive mortality of trees and shrubs from the mesic eastern ranges to the arid interior, many of which appeared to result in the loss of entire cohorts for decades (e.g., SI Appendix, Table S1: 77). Similarly, there is strong evidence that components of the avifauna in central regions had become rare by 1902, with many taking years or even decades to recover (61, 69; SI Appendix, Table S1: 78). Local to regional extinctions of several species have also been attributed to the event (e.g., 70). Due mainly to remoteness and a low human population at the time, less is known about the magnitude and permanence of FDP impacts in central and western Australia. However, there is strong evidence of severe, widespread decline among faunal assemblages, some apparently permanent, and significant land degradation and soil erosion (typical of ecosystem collapse in eastern Australia) in at least some locations (SI Appendix, Table S1: 45).

What trophic levels were mostly affected by FDP?

In contrast to other studies (13), our data do not support the hypothesis that drought impacts manifest predominantly at higher trophic levels. Indeed, the near-absence of reported mortality among large, conspicuous terrestrial apex and mesopredators, such as dingoes (Canis familiaris), feral cats (Felis catus), quolls (Dasyurus spp.), raptors and corvids, is striking (Fig. 3). Newspaper accounts are unlikely to reflect unbiased reporting of underlying ecological phenomena or events, and here we cannot rule out the possibility that mortality in these groups was under-reported due to negative social perceptions associated with livestock predation. Indeed, many species, and dingoes particularly, were subjected to population control via bounties and other programs throughout the FDP (60). It is also possible that low reporting rates in these groups reflect lower overall population sizes compared to those in lower trophic levels, or perhaps that drought impacts manifest in predator guilds through reduced fecundity instead of mortality.

On the other hand, numerous accounts attest to the abundance of many predatory species at the time. For example, dingo numbers in parts of inland Australia were reported to be very high due to the availability of rabbits (71), and corvids (i.e., ravens and crows), which attack the eyes and soft tissues of weak livestock, were clearly abundant throughout rabbit-infested and sheep-raising areas. More generally, there is strong evidence that a major pulse in availability of carrion, drought-weakened native animals, rabbits and livestock supported predator numbers in drought-affected areas (*SI Appendix*, Table S1.63-73), many of which are also facultative scavengers. The lack of mortality among reptiles (especially large taxa such as monitors) may reflect their relatively low metabolic rate per unit body weight and ability to survive for weeks or months without food or water (72, 73), but, again, at least some were significant predators of rabbits (e.g., monitors) and livestock or scavenged carrion (*SI Appendix*, Table S1).

Our data also show that vegetation impacts were concentrated in dry terrestrial ecosystems (91% of BIRs) and were especially prevalent on ridges, hills, and sloping terrain with shallow soils (e.g., *SI Appendix*, Table S1.59). This pattern of topographic development of drought symptoms is consistent with the typical expansion of soil drought from rainfall-dependent habitats of higher relief to lower drainage areas as rainfall deficiencies progress (56), but strikingly different to that observed during the Millennium Drought, which caused extensive mortality of riverine floodplain and wetland species across south-eastern Australia (74). These differences are probably linked to the more recent development of hyper-drought associated with anthropogenic water extraction, which now poses a significant additional threat to Australian biota during periods of low rainfall (75, 76).

Temporal development of ecosystem impacts

The strongly nonlinear accumulation of mortality among birds, mammals and woody vegetation (Fig. 4A-B) indicate that populations of these taxa are prone to sudden drought-induced collapse rather than gradual decline (38, 56). Spatial interpolation of pre-impact cumulative rainfall data reveals that this typically occurs after 2-4 years of continuous drought (drought duration, D_{CON} ; Fig. 1E) during which cumulative rainfall deficiencies (drought magnitude, \bar{R}_{CON}) total \approx 80-200% of annual mean precipitation (i.e., $P_A \approx 0.5 \cdot 0.6 P_{AV}$ for the period; Fig. 1F), with the longest and deepest droughts prior to mortality occurring in arid, central-northern parts of the continent. Similarly, linear models show that D_{CON} and R_{CON} were both inversely related to mean annual precipitation (P_{AV}) at the BIR impact site (P < 0.01;SI Appendix, Table S4) with D_{CON} and R_{CON} varying from ≈ 29 months and 80% of P_{AV} in high rainfall areas ($P_{AV} = 1000$ mm) to 36 months and 120% of P_{AV} in semi-arid ecosystems (P_{AV} = 430 mm; SI Appendix, Table S4). These data indicate a higher tolerance among arid-zone species for intense, prolonged drought compared with those found in wetter areas around the continental periphery (Fig. 1E-F), consistent with observed phytogeographic patterns in drought tolerance (77).

In contrast, there was only weak evidence that D_{CON} and R_{CON} were lower for native terrestrial animals than for plants (i.e., generally < 10-20%; SI Appendix, Table S4), indicating that during the FDP these groups tended to undergo mortality following rainfall deficiencies of similar duration and magnitude. A possible exception to this occurred in more peripheral, mesic temperate and subtropical areas, where animal but not plant mortality was recorded (Fig. 2). However, sample sizes in these habitats were small and associated models significantly affected by spatial autocorrelation (c.f., non-spatial and spatial models; SI Appendix, Table S4), and so a clear understanding of associated broad taxonomic differences in drought impacts awaits further study. Similarly, differences among specific plant or animal groups were also minor (SI Appendix, Table S5), except perhaps for fish, which appeared sensitive to the rapid drying of ephemeral waterbodies, 811 and rabbits (see below). 812

Temporal analysis of drought magnitude (depth)-duration curves data also reveals a pattern of nonlinear intensification of continuous rainfall deficits prior to mortality of native plants and animals (Fig. 5*A-D*). These rise from 15-30% below normal in 816 817 years 2-4 to $\approx 50\%$ in months 7-12 and finally to $\approx 70\%$ in the 818 last three preceding months (Fig. 5B,D). This terminal period 819 of sharply intensifying rainfall deficits contained, on average, 5-820 8 consecutive months of below average rainfall immediately prior 821 to mortality (D_{CDM}; Fig. 5A-D; SI Appendix, Table S4). For a substantial proportion of BIRs, the period of continuous annual 822 823 rainfall deficiencies (D_{CON}) prior to mortality occurred at the 824 end of period of semi-continuous drought (D_{SCO}) 5-8 years long 825 during which mean cumulative rainfall deficits reached 150% of 826 $P_{\rm AV}$ or more (Fig. 5A-D). This mainly reflects the high number 827 of BIRs observed during 1902 across eastern Australia following 828 seven to eight prior years of generally below average rainfall (i.e., 829 since 1895; Figs. 4-5). In northern parts of the continent (-16 to -830 26°S) impacts occurred at a similar frequency throughout the year 831 (Jun-Aug = 29%, Sep-Nov = 29%, Dec-Feb = 21%, Apr-May = 20% of records; $\chi^2_{(3)}$ = 1.89, P > 0.05). In contrast, BIRs in southern regions (-26 to -42°S; excluding rabbits, see below) were 832 833 834 most frequent in summer (Dec-Feb = 27%) and autumn (Apr-835 May = 34%) and least in winter (21%) and spring (18%; $\chi^2_{(3)}$ = 836 14.3, P < 0.01). This is consistent with the summer-dominated 837 nature of rainfall deficiencies during the FDP in this region (40). 838

Collectively, these data indicate that ecosystems exposed to 839 rapid drought intensification following a semi-to quasi-decadal 840 period of persistently accumulating rainfall deficits are at high 841 risk of collapse. Indeed, megadroughts may differ in a funda-842 mental way from droughts of shorter (e.g., annual) duration, with 843 chronic, multi-year rainfall deficiencies allowing the development 844 of meso-scale hydrological and land-cover feedback mechanisms 845 (9) that ultimately render populations and ecosystems more sensi-846 tive to intensification of abiotic stress during subsequent extreme 847 years. Examples noted by observers during the FDP include the 848 decline of food resources, development of extreme temperatures 849 and plant-soil feedback loops caused by the progressive loss of 850 perennial vegetation cover, and the increasingly concentrated 851 impacts of native animals and livestock in refugial waterholes of 852 drying river systems. Such processes indicate that megadrought-853 landscape interactions exhibit many characteristics of complex 854 adaptive systems, a concept that has proved fruitful in the inves-855 tigation of other ecological and social phenomena (78).

856 In our study, habitats containing hyper-abundant rabbit pop-857 ulations exhibited a different pattern of impact than elsewhere. 858 Here, mortality profiles for most native animal groups, O. cunicu-859 lus and woody shrubs (which are herbivorised by rabbits during 860 drought) show punctuated development, beginning after only one 861 year of low-intensity drought (1892; Fig. 4C), consistent with a 862 lower degree of association with severe rainfall deficiencies (SI 863 Appendix, Fig. S4B). Only trees predominantly suffered mortality 864 in the latest stages of the drought (Fig. 4C). Linear models also 865 support the view that severe rabbit infestation reduced mean 866 $D_{\rm CON}$ and $R_{\rm CON}$ for some co-occurring native plant and animal 867 groups (by 10-12 months and 30-45% respectively) compared with 868 non- or less-infested areas (Fig. 1E-F; SI Appendix, Tables S4-5), 869 although spatial models indicate that the impact of other variables 870 (e.g., vegetation, soil types, stocking regimes) cannot be ruled 871 out as contributing to these differences. The frequency of rabbit 872 mortality BIRs in this region was least during winter (Jun-Aug = 873 5%) and spring (Sep-Nov = 14%) and highest in summer (Dec-874 Feb = 26%) and autumn (Mar-May = 56%; $\chi^2_{(3)}$ = 25.6, P < 875 0.001), suggesting that rabbit populations, which grew during the 876 very wet years of 1889-1891 (and probably 1894) to levels vastly in 877 excess of the long-term carrying capacity, collapsed (in 1892-3 and 878 1895-6; Fig. 4C) following progressive summer-autumn drying 879 and a lack of cool-season herbage growth on which they depend 880 (57)881

More generally, these data indicate that assemblages dominated by a hyperabundant, highly fecund herbivore guild are extremely sensitive to drought-induced meltdown, as in other systems lacking robust top-down control (59). This suggests that the progressive trophic downgrading of ecosystems under modern anthropogenic land use regimes globally (79) now poses a significant additional risk to biodiversity in megadrought-prone areas.

CONCLUSIONS

This study shows, for the first time, that it is possible to reconstruct the spatial, taxonomic, trophic and demographic impacts of historical droughts on biota using analysis of data compiled from contemporary written accounts. The unprecedented geographic extent, taxonomic breadth and temporal distribution of population mortality and ecosystem collapse that occurred during the Australian Federation Drought Period show that extreme, semito decadal megadrought events can have serious demographic and biogeographic consequences for plant and animal populations on a pan-continental scale. These include rapid, broad scale mass biotic mortality and collapse of both agriculturally modified and natural ecosystems. Importantly, our study also indicates a clear bottom-up effect where lower trophic levels (e.g. plants and herbivores), and not higher trophic levels, can be most affected by decadal droughts of this magnitude and duration.

The longest and most intense droughts in eastern Australia (e.g., Federation, WWII and Millennium droughts) can be largely explained by the modular states of a relatively small set of underlying climatological drivers (e.g., ENSO, IOD, IPO and the southern annular mode, SAM), albeit manifesting with different spatial and seasonal footprints (37, 40, 43). The periodic recurrence of such events during the 20th century, combined with an apparent shift towards reduced moisture availability across eastern Australia since the mid-19th century (40, 80) and the return of generally drier conditions, rising temperatures and reduced water availability and runoff in parts of Australia over the past two decades (81-83) all suggest that the likelihood of a similar, or possibly even more extreme bioclimatic event occurring in the future is high. More generally, our study shows that an increase in the frequency and severity of megadroughts clearly poses a serious threat to global biodiversity conservation, especially in trophically downgraded and overgrazed ecosystems.

MATERIALS AND METHODS

Database development

The primary source of data consisted of digitised newspaper articles contained in the National Library of Australia's Trove platform (www.trove.nla.gov.au). We conducted a series of searches of Trove that contained the terms *drought*, *dead* OR *dying*, followed by one of 296 929 terms or phrases relating to geographic locations or features across all six Australian states and two territories (mainly towns, rivers, major geographic 930 regions, and telegraph or private stations) or broad vegetation groups, plant 931 genera, and colloquial plant names. Based on these searches we screened 932 >35,000 relevant newspaper articles (and a small number of related explorer 933 journals and other sources) for those documenting either an impact of drought on plants or non-domestic animals (biotic impact records: BIRs) or 934 a significant event or attribute of drought-affected areas (drought impact 935 record; DIR). A total of 1748 DIRs and 541 BIRs with suitable geographic 936 information were identified. 937

For BIRs we then extracted information for the following data fields 938 (e.g., SI Appendix, Fig. S6): 1) estimated observation date (usually last full calendar month before each report's publication date), 2) broad morpho-939 taxonomic group (8 animal and 6 plant groups, see SI Appendix, Table S2), 940 3) taxonomic identity (family, genus or species), 4) impact type (mortality, 941 stress or absence), 5) geolocation (latitude, longitude), 6) estimated extent of impact (circle of radius r in km), 7) IBRA bioregion (47), 8) ecosystem type 942 (aquatic, terrestrial, mixed, other), 9) presence of livestock-related factors contributing to the stated impact, 10) location relative to area of severe 943 944 rabbit infestation in 1891 (RIA; based on 57), and 11) evidence of population collapse or mass mortality. This was classified into one of four categories: 945 1) extirpation of population (E), 2) near-extirpation (NE), 3) mass mortality 946 based on area (Ma), and 4) mass mortality based on numerical estimate (Mn). 947 Categories 1-3 were then classified as local (hundreds of m to < 10km radius), district (10 - <100 km radius), or regional (>100 km radius). We classified the 949 Mn category into 1) hundreds to thousands (10²-10³), 2) tens to hundreds of 950 thousands (10⁴-10⁵), and 3) millions or more (10⁶+).

951 For DIRs we estimated the geolocations of observations of 1) dust storms, sand storms and drift, 2) livestock death, 3) hydrological impacts (low 952

882

883

884

PNAS | Issue Date | Volume | Issue Number | 7

948

885

886

887

888

889

890

891

892

893

894

953 water levels in rivers, lakes, etc.), 4) bare understory and 5) general drought conditions. Further methodological details are provided in the SI Appendix 954 SI Text 955

Rainfall data and association with BIRs

966

967

968

969

970

971

972

973

974

975

976

977

978

979

980

981

982

983

984

985

986

987

988

989

990

991

992

993

994

995

996

997

998

999

1000

1001

1002

1003

1004

1005

1006

1007

1008

1009

1010

1011

1012

1013

1014

1015

1016

1017

1018

1019

1020

956 Rainfall data were obtained from the public SILO enhanced climate database (daily rainfall 1889-) hosted by the Science Delivery Division of 957 the Department of Science, Information Technology and Innovation (DSITI) 958 found at https://legacy.longpaddock.qld.gov.au/silo/. We then determined, 959 for Australia, 1) mean annual precipitation (P_{AV} ; 1889-2015), 2) total annual precipitation P (all years 1890-1903), 3) percentile annual P, 4) total P as a 960 961 percentage of the mean, and 5) lowest annual P as total and as percentage of PAV. We compared numbers of BIRs across "wet" years and "other" years in 962 three continental regions (western, north-eastern and south-eastern; SI Ap-963 pendix, Fig S4A) using simple χ^2 contingency analyses. To avoid dependency 964 among data points we included only BIRs with unique spatial coordinates 965 and observation dates (n = 339) in these analyses.

We used analysis of cumulative sum of monthly rainfall residuals (R) to quantify the depth and magnitude of drought for each BIR between the last full calendar month before each report date and January 1889. We determined the preceding duration (in months) of 1) consecutive below average monthly rainfall (D_{CDM}), 2) continuous drought (D_{CON} ; no unbroken 12-month period of above average rainfall), and 3) semicontinuous drought (D_{SCO}; no unbroken 24-month period above average rainfall). Drought magnitude after D_{CON} was defined as the total cumulative rainfall residual over the period (R_{CON} ; percentage of mean annual rainfall). A worked example is provided in *SI Appendix* Fig. S7.

We also developed a percentile-based index, (PR_R), to determine the strength of association between the magnitude of cumulative 12-month rainfall (R12, percentage deviation relative to the 1889-2015 average) and the estimated observation date of a given biotic impact record. We determined to all cumulative 12-month rainfall intervals between Jan-Dec 1890 and Jan-Dec 1903 (n = 157; details provided in SI Appendix SI Text). PR_R was also compared (using BIRs with unique spatial coordinates) both within and outside the primary rabbit infested area (RIA) using generalised least

- 1. Naumann G, Alfieri L, Wyser K, Mentaschi L, Betts RA, Carroa H, Spinoni J, Vogt J, Feyen L (2018) Global changes in drought conditions under different levels of warming. Geophys. Res. Lett. 45, 3285-3296.
- 2. Zhao T, Dai A (2015) The magnitude and causes of global drought changes in the 21st century under a low-moderate emissions scenario. J. Climate 28, 4490-4512.
- 3. Prudhomme C, Giuntoli I, Robinson EL, Clark DB, Arnell NW, Dankers R, Fekete BM, Franssen W, Gerten D, Gosling SN, Hagemann S (2014) Hydrological droughts in the 21st century, hotspots and uncertainties from a global multimodel ensemble experiment. Proc. Natl. Acad. Sci. 111, 3262-3267.
- 4. The term "megadrought" is variously used to refer to severe, widespread droughts that are either decade-scale (sometimes shorter) or multi-decadal in duration. Here we define a megadrought as any decade-scale or longer continental or subcontinental-scale period of severe rainfall deficiencies. In Australia this includes the Federation Drought Period (\sim 1891-1903 as defined here), the World War II Drought (\sim 1935-1945) and the Millennium Drought (MD; \sim 1997-2009) but excludes many shorter annual to semi-decadal droughts (see also SI Appendix, Fig. S1 and text).
 - Stahle DW, Diaz JV, Burnette DJ, Paredes JC, Heim RR, Fye FK, Soto RA, Therrell MD, 5. Cleaveland MK, Stahle DK (2011) Major Mesoamerican droughts of the past millennium. Geophy. Res. Lett. 38, L05703.
 - Cook BI, Smerdon JE, Seager R, Cook ER (2014) Pan-continental droughts in North America over the last millennium. J. Climate 27, 383-397.
 - Evans NP, Bauska TK, Gázquez-Sánchez F, Brenner M, Curtis JH, Hodell DA (2018) 7. Quantification of drought during the collapse of the classic Maya civilization. Science 361, 498-501.
 - 8. Folland CK, Palmer TN, Parker DE (1986) Sahel rainfall and worldwide sea temperatures, 1901-85. Nature 320, 602-607.
- Cook L, Miller R, Seager R (2009) Amplification of the North American "Dust Bowl" drought 9. through human-induced land degradation. Proc. Natl. Acad. Sci. 106, 4997-5001.
- Gandiwa E, Heitkönig IM, Eilers PH, Prins HH (2016) Rainfall variability and its impact on 10. large mammal populations in a complex of semi-arid African savanna protected areas. Trop. Ecol. 57, 163-180.
- 11. Foley C, Pettorelli N, Foley L (2008) Severe drought and calf survival in elephants. Biol. Lett. 4 541-544
- 12. Dunham KM (1994) The effect of drought on the large mammal populations of Zambezi riverine woodlands. J. Zoology 234, 489-526.
- 13. Ledger ME, Brown LE, Edwards FK, Milner AM, Woodward G (2013) Drought alters the structure and functioning of complex food webs. Nat. Clim. Change 3, 223-227.
- 14. Prugh LR, Deguines N, Grinath JB, Suding KN, Bean WT, Stafford R, Brashares JS (2018) Ecological winners and losers of extreme drought in California. Nat. Clim. Change 8, 819.
- 15. Tian H, Stige LC, Cazelles B, Kausrud KL, Svarverud R, Stenseth NC, Zhang Z (2011) Reconstruction of a 1.910-v-long locust series reveals consistent associations with climate fluctuations in China. PNAS 108, 14521-14526.
- Kerr JT, Pindar A, Galpern P, Packer L, Potts SG, Roberts SM, Rasmont P, Schweiger O, Colla SR, Richardson LL, Wagner DL (2015) Climate change impacts on bumblebees converge across continents. Science, 349: 177-180.
 - 17. Tian H, Yan C, Xu L, Büntgen U, Stenseth NC, Zhang Z (2017) Scale-dependent climatic drivers of human epidemics in ancient China. PNAS, 114: 12970-12975.

8 | www.pnas.org --- ---

squares linear model analysis. Spatial autocorrelation was accounted for by 1021 incorporating an exponential correlation structure which had the lowest 1022 Akaike information criterion (AIC) among tested structures (see SI Appendix 1023 SI Text). We also tested whether the mean R_{12} across all BIRs differed from a 1024 statistical null model using the standard z statistic. 1025

We also compared the compared the frequency of BIRs citing livestock impact across rabbit-infested and other areas, and across winter, spring, summer and autumn seasons in the RIA and other northern and southern regions using simple χ^2 contingency analyses.

1026

1027

1028

1029

1030

1031

1032

1033

1034

1035

1036

1037

1038

1039

1040

1041

1042

1043

1044

1045

1046

1047

1048

1049

1050

1051

1052

1053

1054

1055

1056

1057

1058

1059

1060

1061

1062

1063

1064

1065

1066

1067

1068

1069

1072

1075

1076

1077

1078

1079

1080

1081

1082

1083

1084

1085

Density and network analyses, spatial interpolation, and statistical modelling

Kernel density analysis with a bandwidth (H) of 5 was performed on geocoded mortality records for key animal and plant groups using the R package GISTools (v. 0.7-4). Modularity network analysis of the network based on spatial co-occurrence of broad impacted plant and animal groups was conducted based on stochastic simulated annealing algorithm using the package netcarto (see 48 for details). Significance of the observed modularity was tested using a randomisation test with N=1000 replicates implemented in the netcarto command line program (https://bitbucket.org/amarallab/networkcartography). Spatial interpolation of D_{CON} and R_{CON} was performed using variogram fitting and ordinary kriging approaches (84, 85) and relevant functions in R packages gstat v. 1.1-6, sp v. 1.2-4 and raster v. 2.5-8.

We determined mean values of D_{CDM} , D_{CON} , R_{CON} and D_{SCO} prior to mortality for key animal and plant groups. Each parameter was then modelled using generalised least squares linear model analysis with broad biotic group (native animals vs. plants), RIA, and mean site precipitation as predictor variables. Three model types were used: 1) full, non-spatial containing all observations (FNS), 2) full, but incorporating spatial autocorrelation (FS), and 3) restricted non-spatial model using only BIRs with unique geolocations (RNS). For FS models we tested five autocorrelation structures (exponential, Gaussian, linear spatial, rational quadratic and spherical) and selected the model with the lowest Akaike information criterion (AIC). Model parameters including adjusted means and tests of main effects were constructed and extracted using R packages stats v. 3.4.2 and nlme v. 3.1-139. Further information is provided in the SI Appendix SI Text.

- 18. Mieszkowska N, Sugden H, Firth LB, Hawkins SJ (2014) The role of sustained observations in tracking impacts of environmental change on marine biodiversity and ecosystems. Philos. Trans. Royal Soc. A. 372: 20130339.
- Jackson JB, Kirby MX, Berger WH, Bjorndal KA, Botsford LW, Bourque BJ, Bradbury RH, 19 Cooke R, Erlandson J, Estes JA, Hughes TP (2001) Historical overfishing and the recent collapse of coastal ecosystems. Science, 293: 629-637.
- Tingley MW, Koo MS, Moritz C, Rush AC, Beissinger SR (2012) The push and pull of climate 20. change causes heterogeneous shifts in avian elevational ranges. Global Change Biol., 18: 3279-3290.
- Bestelmeyer BT, Ellison AM, Fraser WR, Gorman KB, Holbrook SJ, Laney CM, Ohman 21. MD, Peters DP, Pillsbury FC, Rassweiler A, Schmitt RJ (2011) Analysis of abrupt transitions in ecological systems. Ecosphere, 2: 1-26.
- Swetnam TW, Allen CD, Betancourt JL (1999) Applied historical ecology: using the past to 22 manage for the future. Ecol. Appl. 9: 1189-1206.
- Angerbjörn A, Tannerfeldt M, Lundberg H (2001) Geographical and temporal patterns of 23 lemming population dynamics in Fennoscandia, Ecography 24, 298-308.
- McClenachan L, Cooper AB, McKenzie MG, Drew JA (2015) The importance of surprising 24. results and best practices in historical ecology. BioScience 65: 932-939.
- Munro D, Fowler A (2014) Testing the credibility of historical newspaper reporting of 25 extreme climate and weather events. New Zealand Geographer, 70: 153-164.
- 26 Lazer D, Kennedy R, King G, Vespignani A (2014) The parable of Google Flu: traps in big data analysis. Science 343: 1203-1205. 27
- McClenachan L (2009). Historical declines of goliath grouper populations in South Florida, USA. Endanger. Species Res., 7: 175-181.
- 28 Lackey CW, Beckmann JP, Sedinger J (2013) Bear historical ranges revisited: Documenting 1070 the increase of a once-extirpated population in Nevada. J Wildl. Manage., 77: 812-820. 1071
- 29. Endfield GH (2016) Historical narratives of weather extremes in the UK. Geography, 101: 93-99.
- 1073 del R Prieto M, Herrera R, Dussel P (1999) Historical evidences of streamflow fluctuations in 30. 1074 the Mendoza River, Argentina, and their relationship with ENSO. The Holocene 9: 473-481.
- Liang, E., Liu, X., Yuan, Y., Qin, N., Fang, X., Huang, L., Zhu, H., Wang, L. and Shao, X., 2006. The 1920s drought recorded by tree rings and historical documents in the semi-arid and arid areas of northern China. Climatic Change, 79(3-4), pp.403-432.
- Do Ó A, Roxo MJ (2008) Drought events in Southern Portugal from the 12th to the 19th 32. centuries: integrated research from descriptive sources. Nat. Hazards, 47: 55-63.
- 33. McKeon G, Hall W, Henry B, Stone G, Watson I (2014) Pasture degradation and recovery in Australia's rangelands: Learning from History. Queensland Department of Natural Resources, Mines and Energy, 256p.
- Beadle NCW (1948) The vegetation and pastures of western New South Wales with special 34 reference to soil erosion. Department of Conservation of New South Wales, Sydney. 281p.
- 35 Cattle SR (2016) The case for a southeastern Australian Dust Bowl, 1895-1945, Aeolian Res. 21, 1-20.
- Semple B, Rankin M, Koen T, Geeves G (2010) A note on tree deaths during the current (2001-?) drought in South-eastern Australia. Australian Geographer 41, 391-401.
- 1086 Verdon-Kidd DC, Kiem AS (2009) Nature and causes of protracted droughts in southeast 37 Australia: Comparison between the Federation, WWII, and Big Dry droughts. Geophys. Res. 1087 Lett. 36, 22. 1088

38. Matusick G, Ruthrof KX, Brouwers NC, Dell B, Hardy GSJ (2013) Sudden forest canopy collapse corresponding with extreme drought and heat in a mediterranean-type eucalypt forest in southwestern Australia. Eur. J. Forest Res. 132, 497-510.

1089

1090

1091

1092

1093

1094

1095

1096

1097

1098

1099

1100

1101

1102

1103

1104

1105

1106

1107

1108

1109

1110

1111

1112

1113

1114

1115

1116

1117

1118

1119

1120

1121

1122

1123

1124

1125

1126

1127

1128

1129

1130

1131

1132

1133

1134

1135

1136

1137

1138

1139

1140

1141

1142

1143

1144

1145

1146

1147

1148

1149

1150

1151

1152

1153

1154

1155

1156

- 39. Jeffrey SJ, Carter JO, Moodie KB, Beswick AR (2001) Using spatial interpolation to construct a comprehensive archive of Australian climate data. Environ. Modell. Softw. 16, 309-330.
- 40. Freund M, Henley BJ, Karoly DJ, Allen KJ, Baker PJ (2017) Multi-century cool- and warmseason rainfall reconstructions for Australia's major climatic regions. Climate of the Past 13, 1751-1770.
- 41. The reported durations of the Federation, World War II and Millennium Droughts vary across different sources, due to changing intensity and spatial footprints over time. The duration of the Federation Drought viz., (1892-) 1895-1903, can be interpreted as 1892-1903 in the broadest sense with the most widespread and intense period occurring in in 1895-1903.
- Van Gorsel E, Wolf S, Cleverly J, Isaac P, Haverd V, Ewenz C, Arndt S, Beringer J, Resco de Dios V, Evans BJ, Griebel A, Hutley LB, Keenan T, Kljun N, Macfarlane C, Meyer WS, McHugh I, Pendall E, Prober SM, Silberstein R (2016) Carbon uptake and water use in woodlands and forests in southern Australia during an extreme heat wave event in the "Angry Summer" of 2012/2013. Biogeosciences, 13: 5947-5964.
 - 43. Ummenhofer CC, England MH, McIntosh PC, Meyers GA, Pook MJ, Risbey JS, Gupta AS, Taschetto AS (2009) What causes southeast Australia's worst droughts? Geophys Res Lett. 36: L04706
 - 44. Hesse PP, Simpson RL (2006) Variable vegetation cover and episodic sand movement on longitudinal desert sand dunes. Geomorphology 81, 276-291.
 - 45. Dai A, Lamb PJ, Trenberth KE, Hulme M, Jones PD, Xie P (2004) The recent Sahel drought is real. Int. J. Climatol. 24, 1323-1331.
 - 46. Olson DM, Dinerstein E, Wikramanayake ED, Burgess ND, Powell GVN, Underwood EC, D'Amico JA, Itoua I, Strand HE, Morrison JC, Loucks CJ, Allnutt TF, Ricketts TH, Kura Y, Lamoreux JF, Wettengel WW, Hedao P, Kassem KR (2001) Terrestrial ecoregions of the world: a new map of life on Earth. Bioscience 51: 933-938.
 - 47. Thackway R, Cresswell ID (1995) An Interim Biogeographic Regionalisation for Australia: a framework for setting priorities in the national reserves system cooperative program. Australian Nature Conservancy Agency, Canberra, ACT.
 - Guimera G, Amaral LAN (2005) Functional cartography of complex metabolic networks. 48. Nature 433: 895-900.
 - 49. Bloomfield NJ, Knerr N, Encinas-Viso F (2018) A comparison of network and clustering methods to detect biogeographical regions. Ecography 41, 1-10.
 - González-Orozco CE, Pollock LJ, Thornhill AH, Mishler BD, Knerr N, Laffan SW, Miller JT, Rosauer DF, Faith DP, Nipperess DA, Kujala H (2016) Phylogenetic approaches reveal biodiversity threats under climate change. Nat. Clim. Change 12, 1110-1114
 - 51. Mishler BD, Knerr N, González-Orozco CE, Thornhill AH, Laffan SW, Miller JT (2014) Phylogenetic measures of biodiversity and neo- and paleo-endemism in Australian Acacia. Nat. Comm. 5, 4473.
 - 52. Dolman G, Joseph L (2015) Evolutionary history of birds across southern Australia: structure, history and taxonomic implications of mitochondrial DNA diversity in an ecologically diverse suite of species. Emu 115, 35-48.
 - Wyrwoll KH, Dong B, Valdes P (2000) On the position of southern hemisphere westerlies at the Last Glacial Maximum: an outline of AGCM simulation results and evaluation of their implications, Ouat, Sci. Rev. 19, 881-898.
 - 54. Byrne M (2008) Evidence for multiple refugia at different time scales during Pleistocene climatic oscillations in southern Australia inferred from phylogeography. Quaternary Sci. Rev. 27. 2576-2585.
 - 55. Toon A, Mather PB, Baker AM, Durrant KL, Hughes JM (2007) Pleistocene refugia in an arid landscape: analysis of a widely distributed Australian passerine. Mol. Ecol. 16, 2525-2541.
 - Godfree R, Lepschi B, Reside A, Bolger T, Robertson B, Marshall D, Carnegie M (2011) 56 Multiscale topoedaphic heterogeneity increases resilience and resistance of a dominant grassland species to extreme drought and climate change. Glob. Chang. Biol. 17, 943-958.
 - Stodart E, Parer I (1988) Colonisation of Australia by the rabbit Oryctolagus cuniculus (L.). Canberra, Commonwealth Scientific and Industrial Research Organisation.
 - 58. Himes Boor GK, Schultz CB, Crone EE, Morris WF (2018) Mechanism matters: the cause of fluctuations in boom-bust populations governs optimal habitat restoration strategy. Ecol. Appl. 28, 356-372.
 - Terborgh J, Lopez L, Nuñez P, Rao M, Shahabuddin G, Orihuela G, Riveros M, Ascanio R, Adler GH, Lambert TD, Balbas L (2001) Ecological meltdown in predator-free forest fragments. Science 294, 1923-6.
 - 60. Glen A, Short J (2000) The control of dingoes in New South Wales in the period 1883-1930

We acknowledge David Marshall for assistance with sourcing historical records, staff at the National Library of Australia and the Hay Historical Society for assistance with sourcing and identifying historical photographs, Murray Fagg for helpful discussion, and two anonymous

- and its likely impact on their distribution and abundance. Australian Zoologist 31, 432-42. 1157 Barnard C (1916) Bird life as affected by drought. Emu 16, 234-236. 61 1158 Zwarts L, Bijlsma RG, van der Kamp J (2018) Large decline of birds in Sahelian rangelands 1159
- 62. due to loss of woody cover and soil seed bank. J. Arid Environ, 155, 1-15.

63. Burbidge AA, McKenzie NL (1989) Patterns in the modern decline of Western Australia's vertebrate fauna: causes and conservation implications. Biol. Cons. 50, 143-198.

- Koehn JD (2004) The loss of valuable Murray cod in fish kills: a science and management perspective. In Management of Murray Cod in the Murray-Darling Basin: Statement, Recommendations and Supporting Papers. Proceedings of a Workshop held in Canberra, ACT (pp. 3-4).
- Lindenmayer D, Messier C, Sato C (2016) Avoiding ecosystem collapse in managed forest 65. ecosystems. Front. Ecol. Environ., 14: 561-568.
- 66. MacDougall AS, McCann KS, Gellner G, Turkington R (2013) Diversity loss with persistent human disturbance increases vulnerability to ecosystem collapse. Nature 494: 86-89.
- 67 Rowland JA, Nicholson E, Murray NJ, Keith DA, Lester RE, Bland LM (2018). Selecting and applying indicators of ecosystem collapse for risk assessments. Cons. Biol., 32: 1233-1245.
- Anon. (1901) Report of the Royal Commission to inquire into the conditions of the Crown 68. tenants, Western Division of New South Wales. Government Printer, Sydney, NSW
- 69. Barnard HG (1927) Effects of droughts on bird-life in central Queensland. Emu-Austral Ornithology, 27: 35-37.
- 70. Le Souef D (1918) Queensland Notes. Emu 18, 43-49.
- 71. Cooke BD, Soriguer RC (2017) Do dingoes protect Australia's small mammal fauna from introduced mesopredators? Time to consider history and recent events. Food Webs, 12: 95-106.
- 72. McCue MD (2010) Starvation physiology: reviewing the different strategies animals use to survive a common challenge. Comp. Biochem. Physiol. A Mol. Integr. Physiol. 156, 1-8. 73. Nagy KA, Girard IA, Brown TK (1999) Energetics of free-ranging mammals, reptiles, and
- birds. Annual Review of Nutrition 19: 247-77.

Bond NR, Lake PS, Arthington AH (2008) The impacts of drought on freshwater ecosystems: an Australian perspective. Hydrobiologia 600: 3-16.

- 75 Cunningham SC, Mac Nally R, Read J, Baker PJ, White M, Thomson JR, Griffioen P (2009) A robust technique for mapping vegetation condition across a major river system. Ecosystems 12, 207-19
- Kingsford RT (2000) Ecological impacts of dams, water diversions and river management on floodplain wetlands in Australia. Austral Ecology 25, 109-27.
- 77. Byrne M, Steane DA, Joseph L, Yeates DK, Jordan GJ, Crayn D, Aplin K, Cantrill DJ, Cook LG, Crisp MD, Keogh JS (2011) Decline of a biome: evolution, contraction, fragmentation. extinction and invasion of the Australian mesic zone biota. J. Biogeogr. 38, 1635-1656. Chu D, Strand R, Fjelland R (2003) Theories of complexity. Complexity 8, 19-30.
- Estes FA, Terborgh J, Brashares JS, Power ME, Berger J, Bond WJ, Carpenter SR, Essington 79. TE, Holt RD, Jackson JB, Marquis RJ (2011) Trophic downgrading of planet Earth. Science 333 301-6
- Tibby J, Tyler JJ, Barr C (2018) Post little ice age drying of eastern Australia conflates 80. understanding of early settlement impacts. Quat. Sci. Rev. 202: 45-52.
- Hochman Z, Gobbett DL, Horan H (2017) Climate trends account for stalled wheat yields 81. in Australia since 1990. Global Change Biol. 23, 2071-2081.
- Saft M, Western AW, Zhang L, Peel MC, Potter NJ (2015) The influence of multiyear drought 82 on the annual rainfall-runoff relationship: An Australian perspective. Water Resour. Res. 51, 2444-2463.
- Kirono DG, Hennessy KJ, Grose MR (2017) Increasing risk of months with low rainfall and 83. high temperature in southeast Australia for the past 150 years. Climate Risk Management 16, 10-21.
- Bivand RS, Pebesma E, Gómez-Rubio V (2013) Applied spatial data analysis with R. 84 Springer, New York, NY. 405p.
- 85 Brundston C, Comber L (2015) An introduction to R for spatial analysis and mapping. Sage Publications Ltd, London, 343p.

ACKNOWLEDGEMENTS

We acknowledge David Marshall for assistance with sourcing historical records, staff at the National Library of Australia and the Hay Historical Society for assistance with sourcing and identifying historical photographs, Murray Fagg for helpful discussion, and two anonymous reviewers for helpful comments on versions of the manuscript.

reviewers for helpful comments on versions of the manuscript.

1160

1161

1162

1163

1164

1165

1166

1167

1168

1169

1170

1171

1172

1173

1174

1175

1176

Please review all the figures in this paginated PDF and check if the figure size is appropriate to allow reading of the text in the figure.

If readability needs to be improved then resize the figure again in 'Figure sizing' interface of Article Sizing Tool.