

A call to scale up biodiversity monitoring from idiosyncratic, small-scale programmes to coordinated, comprehensive and continuous monitoring across large scales

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ABSTRACT

Conservation managers cannot manage what they don't know about, yet our existing biodiversity monitoring is idiosyncratic and small in scale. One of Australia's commitments to the Convention for Biological Diversity in 2015 was the creation of a national biodiversity monitoring programme. This has not yet occurred despite the urgent need to monitor common and threatened species, as highlighted by the challenges of determining the biodiversity impacts of the Black Summer fires of 2019/20. In light of improvements to automation, miniaturisation and powering devices, the world urgently needs to scale-up biodiversity monitoring to become coordinated, comprehensive and continuous across large scales. We propose the BIOMON project that could achieve this where individual sensor nodes use machine learning models to identify biodiversity via sound or photos onboard. This could be coupled with abiotic data on temperature and humidity, plus factors such as bushfire smoke. Nodes would be set within networks that transmit the results back to a central cloud repository where robust analyses are conducted and provided free to the public (along with the raw data). Network arrays could be set up across entire continents to measure the change in biodiversity. No one has achieved this yet, and significant challenges remain associated with training the algorithms, low power cellular network coverage, sensor power versus memory trade-offs, and sensor network placement. Much work is still needed to achieve these goals; however we are living in the 21st Century and such lofty goals cannot be achieved unless we start working towards them.

Key words: threatened species, biodiversity monitoring, IoT, Sensor Network, common species, birds, frogs, calls, camera trapping, sound recording, Microchiroptera

Published: 1 March 2022

DOI: <https://doi.org/10.7882/AZ.2022.004>

Introduction

Biodiversity monitoring involves the collection of species' occupancy and abundance data across broad landscapes and over extended periods of time. These data can be collected via repeat surveys in person, or via remote data collection methods such as camera traps or sound recording devices. While each of these methods can only detect a portion of the species present, the goal of each method is to collect data on as many species as possible to build information profiles on ecosystem integrity, rather than the status of a single target species. There are several reasons to monitor biodiversity. Firstly, we need to understand what species are present at a site and how their population numbers are faring, as this is the basis for evaluating the integrity of ecosystems. It was broad-scale monitoring that led to the serendipitous re-discovery of

Gilbert's potoroo *Potorous gilberti* in Two People's Bay Nature Reserve in the mid-1990s (Sinclair *et al.* 1996). Secondly, monitoring can enable us to investigate the impact of perturbations on biodiversity. When the conclusions of research that identified the impact of introduced red foxes *Vulpes vulpes* on rock wallabies (Kinnear *et al.* 1988) were questioned on statistical grounds (Hone 1994), a broad-scale impact assessment monitoring program was designed over half a million hectares of the jarrah forest in Western Australia to test the faunal response to fox control (de Tores 1999). Thirdly, conservation management actions need to be monitored to ascertain their success. For example, the reintroduction of large predators to the Eastern Cape Province of South Africa over a long period of time has illustrated the success of

such conservation translocations, but also the challenges of establishing some species (Banasiak *et al.* 2021; Hayward *et al.* 2007). Finally, targeted monitoring to assess the status of individual species is critical to enable conservation managers to assess the need for action. For example, the quokka *Setonix brachyurus* persisted at very low densities in the *Taxandria* swamps of the northern jarrah forest in the face of threats from foxes and altered fire regimes (Hayward *et al.* 2003). Clearly monitoring is essential, however the absence of large-scale monitoring has been identified as a major failure of conservation practice historically (Legg and Nagy 2006) and inadequate monitoring methods have led to questionable conclusions for conservation managers (Hayward and Marlow 2014). This paper seeks to act as a call-to-arms for scientists, engineers, computing specialists and conservation managers to work in partnership to develop a coordinated, comprehensive and continuous monitoring programme across large scales to enable us to identify in real-time when conservation action is needed.

The Black Summer fires highlighted Australia's lack of national monitoring for a broad suite of species. To determine the impact of the fires, the best that could be done was to overlay the burnt area with the historical distribution of species and their potential densities (Legge *et al.* 2020). This revealed that within the 30 million hectares of vegetation burnt, an estimated 3 billion vertebrates and 240 trillion invertebrates were affected, from 832 vertebrate species and 37 threatened ecological communities (Dickman In press). With limited adequate biodiversity monitoring before the fires and many historical distributions outdated, it is difficult to ascertain the true impact of the fire on many populations or draw more fine-scale conclusions.

Among the many species thought to be impacted were species like the parma wallaby that was last studied in the 1970s and where the IUCN Red List status assessment since the turn of this century has cited a population estimate of between 1000 and 10,000 that was derived in the '70s almost entirely from guesswork ("In 1992, the total number of adults was estimated at between 1,000 and 10,000 individuals. There appears to be no evidence of a decline"; Lunney and McKenzie 2008). This out of date and absurdly broad population estimate is of little practical use to the conservation management of this species and exemplifies the lack of ecological knowledge reflective of a general absence of monitoring. Numerous species are in the same boat, but how can we manage the conservation of Australia's biodiversity if we don't know how most species are faring? Other species do have well designed monitoring programmes, but as a national monitoring programme, the random assortment of species that have such well designed monitoring is clearly idiosyncratic.

Australia's understanding of the impacts of the Black Summer fires were inhibited by COVID-19 restrictions, but also "by a diminution in ecological monitoring capacity that occurred before the last fire season" (Dickman In

press). Yet Australia has long sought to develop adequate monitoring of its biodiversity. For example, Target 10 of Australia's commitment to the Convention on Biological Diversity in 2015 was to set up a 'national, long-term biodiversity monitoring and reporting system' (<https://www.cbd.int/countries/targets/?country=au>). To date, this does not seem to have occurred, and this paper aims to initiate discussion to drive Australia to achieve this goal.

Existing large-scale monitoring programmes

Monitoring programmes can and do occur at large scales. Operation Foxglove tested the response of biodiversity to aerial and ground baiting of foxes in a variety of treatments over 544,000 ha of the northern jarrah forest in Western Australia (de Tores 1999; de Tores and Marlow 2011). Fifty-five (55) survey sites were monitored via 25 wire cage traps, 15 Elliot traps, and 15 pitfall traps seasonally for four consecutive nights over several years (de Tores 1999). In addition to this, 492 woylies *Bettongia penicillata* were translocated into each treatment area to determine their survivorship in the face of different fox densities, and common brushtail possums *Trichosurus vulpecula* were collared *in-situ* to assess the survivorship of arboreal fauna (de Tores 1999). Bird surveys, spotlighting transects and bait uptake trials were also incorporated into the study design. They concluded that higher intensity fox control yielded substantial improvements in wildlife survivorship and densities, and this led to discoveries of mesopredator release whereby cats *Felis catus* and native predators increased in the absence of foxes (Sutherland *et al.* 2011).

The Australian Wildlife Conservancy conducts annual monitoring programmes across its estate (Legge and Fleming 2012). These programmes involve similar activities to Operation Foxglove, but also a rigorous reporting process through sanctuary health reports that incorporate peer review. This programme has expanded to include the joint venture sites in association with the NSW government (e.g., Pilliga National Park Gilgai Section).

There are also large-scale camera trapping programmes that could be used for monitoring. The Snapshot Serengeti programme involved camera trapping in the Serengeti National Park of Tanzania with photographs identified by citizen scientists and validated by species experts (Swanson *et al.* 2016; Swanson *et al.* 2015) that trained machine learning algorithms to identify the species captured in the photos (Norouzzadeh *et al.* 2018). This has morphed into Snapshot Safari and expanded to more sites throughout eastern and southern Africa that incorporates citizen scientists to identify the photographs via the Zooniverse platform (<https://www.zooniverse.org/>) (Pardo *et al.* 2021). Snapshot Wisconsin has followed these principles to develop a monitoring programme for the US State of Wisconsin (Townsend *et al.*). In Australia, individual groups are using these same practices with their camera trapping networks,

including the New South Wales Department of Primary Industries/University of New England, and the World Wildlife Fund (WWF). WildCount is a version of such programmes that involves four camera traps placed at 200 sites in 146 national parks since 2010 (<https://www.environment.nsw.gov.au/topics/animals-and-plants/surveys-monitoring-and-records/native-animal-monitoring>). WildCount detected 157 species over the first 5 years of operation. Coordination of these activities seems likely to yield major benefits and reduce the duplication of effort.

India's national tiger *Panthera tigris* census may be the largest biodiversity survey in the world (Carbone *et al.* 2019) as it seeks to estimate the distribution, occupancy and density of wildlife across India every four years. For the 2018 census, over half a million kilometres of transects were walked to measure wildlife signs to use as covariates in occupancy models and spatially explicit capture recapture models arising from almost 27,000 camera trap locations from 141 sites that yielded 35 million animal photographs (Jhala *et al.* 2020). A total of 2461 individual tigers over a year of age were photo-captured, and the total population size was 2967 (2603 – 3346), which is an increase of 6% per annum (Jhala *et al.* 2020). Beyond the success for tiger conservation, this quadrennial national monitoring programme has yielded a suite of benefits in improving our understanding of wildlife ecology, conservation management and community engagement (Jhala *et al.* 2021).

The Australian Museum's FrogID phone app enables citizen scientists to record frog calls and send them to scientists for identification (Rowley *et al.* 2019). As of the 31st of August, 2021, FrogID had received over 250,000 frog call recordings of 405,699 verified frogs from 204 species across Australia (www.frogid.net.au). This is an amazing data collection exercise, however it still relies on people sifting through massive numbers of sound files to identify the species present. Machine learning offers vast advantages over this in terms of time and financial costs, but requires large datasets to train the algorithms.

Birdlife Australia and its affiliates, such as the Hunter Bird Observers Club, run many monitoring programmes for Australia's avifauna using citizen scientists and staff scientists, including Birds in Backyards, Aussie BirdCount, Twitchathon, migratory shorebird monitoring, threatened beach-nesting birds, threatened woodland birds, and key biodiversity areas. These generally incorporate the birddata app and webpage (<https://birddata.birdlife.org.au/>).

Paul Roe has led a team that set up the Australian Acoustic Observatory (<https://acousticobservatory.org/>) of 360 continuously operated audio sensors across Australia that store data on the cloud that are freely available to everyone. Yet this still requires the sounds to be identified manually, and the sound cards to be collected from often remote sites.

These large-scale monitoring programmes illustrate that national biodiversity monitoring is entirely feasible, and are already performing important monitoring functions (e.g., State of Environment or State of Forests reports). Yet they often require experts to spend long periods of time in the field detecting the wildlife, and then longer periods in the lab/office identifying the wildlife from remote sensing devices. This leads to long delays in converting data collection to results, but ultimately the data collected are added to repositories like the NSW BioNet, Atlas of Living Australia and/or the Global Biodiversity Information Facility.

Many of these programmes also rely heavily on citizen scientists. This has benefits, in that it provides extra hands to collect more data, although the quality of the data can be questionable (Aceves-Bueno *et al.* 2017). Citizen science may also engage the public and increase scientific literacy, although the people who engage with these programmes tend to be self-selecting groups of people already engaged and scientifically literate. However, a technology-led solution does not negate the need for citizen scientist involvement, but rather provides an alternative activity for them to participate in.

These programmes highlight areas where technology can assist in monitoring biodiversity. Automation capacity has increased vastly in the past decade due to reductions in the size of low-powered computing devices, advances in wireless communications, and the explosion in automated data-recognition algorithms via machine learning (Keitt and Abelson 2021). It really is time to move biodiversity monitoring into the 21st Century.

BIOMON – a technology-led biodiversity monitoring platform

The Biosensor Monitoring project (BIOMON) we envisage offers a way to conduct permanent, continuous biodiversity monitoring across broad landscapes of Australia, and the world. BIOMON involves using arrays of solar-powered sensor nodes using different sensors that collect biological (sounds, photographs, pollen samples) and abiotic data (smoke particles, temperature, humidity), and use edge computing to automatically identify them as far as practicable onboard the sensor, and then deliver the results to a central data repository for further processing until identifiers are suitably accurate to yield precise species data (Fig. 1). The sensor nodes will automatically collect data from deployed locations and transmit those data to the central data repository. Ground sensor nodes will be equipped with multiple sensors to capture and pre-process different data that will be automatically identified by machine learning algorithms located in a cloud server. A cloud server will store all data and can be distributed to different users by employing a subscription process. Obviously machine learning requires vast amounts of data to train the software, and we will achieve this by training the algorithms using citizen scientists and species experts

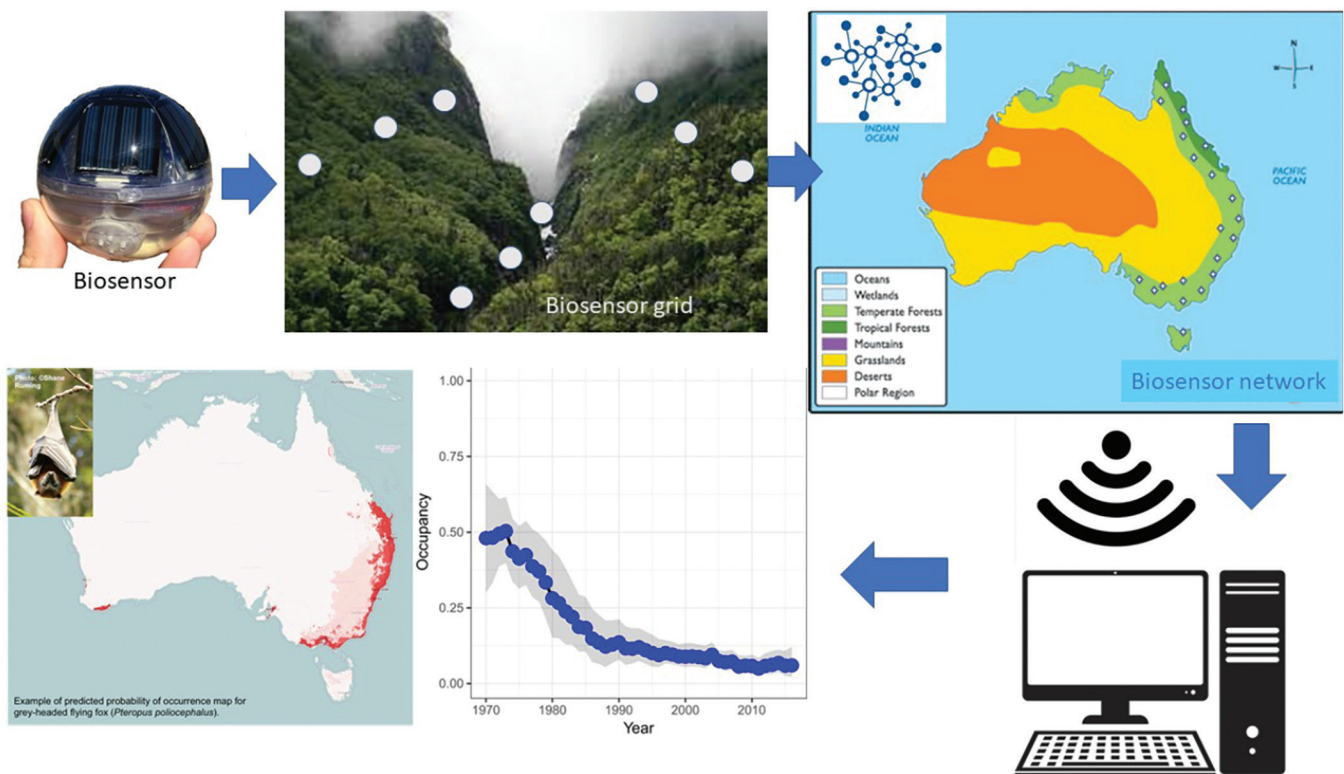


Fig. 1. Schematic representation of the BIOMON biosensor network. Individual, stationary, solar-powered biosensors will be trained to identify calls and images from birds, frogs, bats, mammals and other fauna onboard using machine learning algorithms. Grids of biosensors will be set up in representative areas where monitoring is sought, and these will be connected via telecommunications networks into a national-level biodiversity monitoring network. These networks will send their data of identified species records to a central data repository, which will have a user-friendly system of identifying species records, distribution and occupancy over time. Hence, the BIOMON project uses cutting edge technology with world-leading machine learning practices and robust statistical methods to create a landscape-scale biodiversity monitoring system.

from university partners, government agencies, Birdlife Australia/Hunter Bird Observers Club, and the Frog and Tadpole Society via a web-based platform as occurs with Zooniverse in Snapshot Safari (Pardo *et al.* 2021).

Ultimately, these sensor nodes and edge computing devices could detect animals via vision (any animal that can be camera trapped), and sound (all species that emit species-specific sounds, such as frogs, some geckoes, most birds, echolocating bats, and mammals that vocalise). An expansion of the sensor node deployment could incorporate detection and monitoring of flowering plants via the unique shapes of their pollen granules (Martin and Harvey 2017; Oswald *et al.* 2011) and fungi via the unique shapes of their spores (Galán *et al.* 2021; Shivas *et al.* 2014; Vernes *et al.* 2004). These sensor nodes can already detect smoke particles, which means they can provide immediate detection of bushfires and thereby increase the chances of fires being successfully extinguished where necessary.

We believe the BIOMON system could ultimately be used to monitor 223 (70%) of Australia's 319 threatened terrestrial vertebrate species with 159 species producing unique sounds and 68 by camera trapping (with 4 ostensibly detected by

both methods) (Appendix 1). Yet we must also be cognisant of population declines in currently common species, so these common species will also need to be accommodated in the programmes. This should be an easier task as they are likely to have greater detectability than rarer species and by focusing on the full suite of threatened species we should be able to capture change in more common species.

These sensor nodes can be placed in grids to capture the diversity of species found there. Sensor grids will be situated randomly within key habitats (random stratification monitoring design) to create a biosensor network across a region, state or country. Sensor grids will be connected to the nearest mobile telecommunication tower or connected to the satellite network in remote areas to transmit captured data to a cloud data server for identification. This cloud server will compute summary data for access via the web to all interested parties including species locations, species distribution models (MaxEnt) and occupancy estimates over time.

While this whole project is novel, the most exciting aspect is the ability of the advanced sensors to identify the calls or photos of wildlife onboard, rather than saving the raw data on an SD card for manual identification

back in the office. The sensor networked system will capture and identify data/signals as soon as it detects target animals in different locations. This will save vast amounts of labour, and hence time, resulting in real-time biodiversity monitoring information. Data may be lost until the recognisers are sufficiently accurate, but this bias will be set against the large amounts of data that could be detected.

Coupling the automated detection and identification of biodiversity with robust analysis is also critical to avoid problems associated with weak analytic methods leading to questionable conclusions (Hayward *et al.* 2015). These data are ideally suited to enable real time calculation of range-wide occupancy models that will enable changes in species occupancy to be detected quickly (MacKenzie *et al.* 2006). Furthermore, species distribution modelling (Peterson 2001; Peterson *et al.* 2000) or occupancy maps could be incorporated into the system to enable change in distributions to be detected. There could also be scope to scale-down these analyses to smaller areas provided there are sufficient detectors.

Obviously, we are not the first to hit upon this idea. Brad Law has been using machine learning to identify koala *Phascolarctos cinereus* bellows to validate his ecological niche models for the species (Law *et al.* 2017) and has continued as an acoustic monitoring program currently focused on koalas (<https://www.dpi.nsw.gov.au/forestry/science/forest-ecology/koala-research-in-nsw-forests>). He has also done similar projects on microbats in the Pilliga (Law *et al.* 2021). The frogging and birding communities have also used the results of machine learning and deep neural networks with sound identifiers to target their focal species. The novel aspects of the BIOMON project is that animals are identified via an onboard sensor, the results are transmitted to a central repository where basic analyses are provided, but where data are available to all interested parties, and there is coordination of the monitoring programme.

Future needs

Automated data collection and machine learning systems are set to revolutionize the study of natural systems (Keitt and Abelson 2021) and change our expectations of environmental monitoring, but we are not there yet. No one has achieved this yet, and significant challenges remain. Large investments are still needed. Machine learning requires vast training sets of labelled data to train the deep learning models to accurately identify sounds and images (Russakovsky *et al.* 2015). Citizen scientists can greatly assist in this process, however we still need to collect large numbers of sound recordings.

The biosensors need to be designed, tested and manufactured at scale, recognising that more data requirements necessitate larger sensors with greater power needs and concomitant price. There will also be a trade-off between sensor strength to detect sounds/images from

further afield, and power requirements of the sensors. Optimising this relationship will be important, and will need to account for solar recharging of the sensors in a variety of habitats (e.g., rainforests vs grasslands) and climatic conditions (e.g., tropics vs desert)

In this process, ecologists will lead the initial critical collection and labelling of large training data sets of image and sound files, while also capitalizing on existing repositories of labelled recordings whenever possible. Later in the process, they will apply big data techniques in collaboration with data scientists while the large multimodal sensor network is operating. It is envisaged that the outcome of this collaboration will solve some of the big questions of biodiversity and ecology. More work will be needed to define the situation of biosensor grids within a biosensor network (Fig. 1) to ensure they are optimally situated to maximise detections and statistical power to answer management questions.

The layout of the sensor network will be constrained by that of the low power telecommunications network, which focuses on areas of higher population density leaving much of Australia's interior still lacking connectivity, although this is improving (Fig. 2). This will bias the species that can be adequately monitored. The sensors are also likely to need maintenance.

Strategic planning will also be required to determine the optimal placement and spacing of the sensor grid arrays. A national monitoring network is needed, and there needs to be sufficient sensors in the landscape to detect changes in distribution or occupancy of even the rarest of species. This will necessitate placing sensors at sufficient densities to enable the calculation of robust statistics to detect change, but stratification is likely to be important to ensure key landscapes and habitat features are accounted for. The spatial density of sensors may need to be greater around the distribution of rarer species compared to the densities needed to detect change in more common species. Optimising their placement is fundamental in the same way it has occurred for other conservation initiatives (Bode *et al.* 2012; Ringma *et al.* 2017; Wilson *et al.* 2007), yet we must acknowledge that some sites will not be accessible during the early phases of the programme and so covariates need to be incorporated into models to extrapolate to such areas, as has occurred with the Indian tiger census (Jhala *et al.* 2021). We need to invest sufficiently in the number of sensors so that we do not run into the limitations of programmes like WildCount that cannot monitor the majority of species detected because of insufficient investment in the monitoring network.

Improved knowledge and understanding of biodiversity may also be important. Regional calls may hinder call identification, and improved knowledge of the behaviour of wildlife (e.g., calling phenology) may also be required to ensure adequate detectability.

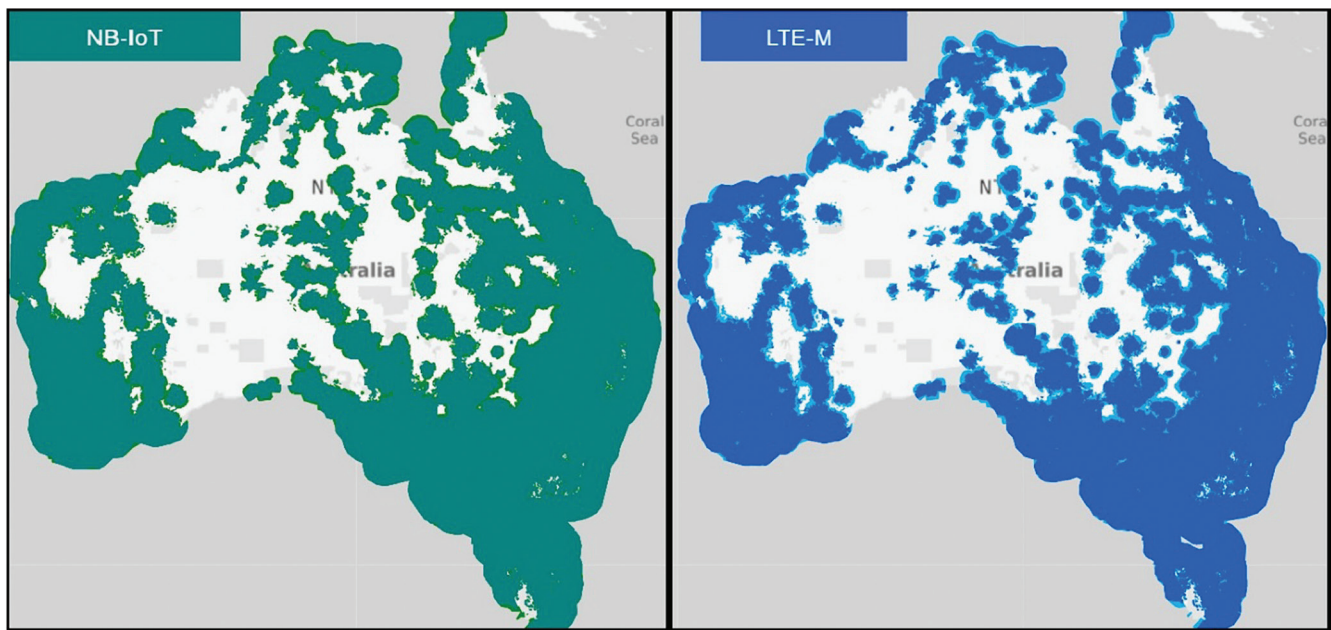


Fig. 2. Network coverage of Telstra's LTE-M, covering 3 million square kilometres, and NB-IoT, covering 4 million square kilometres, Cellular Low Power Wide Area Networks (from <https://www.telstra.com.au/business-enterprise/about-enterprise/our-network/iot-coverage-map>) that are best suited to the BIOMON sensor network.

Adequate storage of the accumulated data will also be critical (Robinson *et al.* 2018), along with a system to enable access and use of the data by all interested parties. This will remove the risk that long-term monitoring data remains concealed in the diaries of the people involved and that intensive detective work to collate the data is needed (Alley *et al.* 2022). The implementation of a large-scale monitoring programme will also necessitate engagement with ethicists to consider the implications of personal privacy issues when people are detected by the BIOMON system.

The large-scale monitoring programme proposed here can monitor the majority of Australia's terrestrial vertebrate fauna, however some taxa will still be missed and will need more targeted monitoring. Platypus *Ornithorynchus anatinus* is a silent aquatic species that is unlikely to be detected with cameras or audio recorders, hence large-scale national monitoring will need alternative methods and eDNA seems a promising option (Brunt *et al.* 2021; Lugg *et al.* 2018). Similarly, it may be possible to estimate the population size and change of various bat species with doppler radar (Horn and Kunz 2008; Meade *et al.* 2019) and Australia's National Flying-fox Monitoring Programme could validate the method (Westcott *et al.* 2018). The full variety of monitoring methods should be incorporated into a national monitoring programme with the results freely available to all interested parties.

Conclusion

Calls to develop long-term monitoring in Australia are over 20 years old (Lindenmayer 1999), but we are still waiting. Achieving this project will change the way biodiversity is monitored in Australia (and globally) – offering feasible,

on-going monitoring for the vast majority of our bird, frog and bat fauna, and a large percentage of our larger terrestrial mammal fauna, as well as flowering plants and fungi - coupled with abiotic variables (notably smoke) and other potential biotic variables (like pollen and human disturbance levels). Remote sensing products could also be incorporated into the cloud analytics. This knowledge would benefit multiple stakeholders. Conservation managers in national, state and local governments can have biosensor networks across their protected areas and receive real-time information on wildlife locations and status trends, flowering phenology, which will help them manage threatened species and understand the ecological condition of the landscape. They can also receive bushfire alerts as soon as smoke particles are detected, which would drastically minimise response times, potentially saving critical ecological communities, lives, and property. Ecological consultants can place biosensor grids at sites of potential impact (coupled with control sites) to detect if any threatened biodiversity is present. Industry and compliance authorities may use biosensor networks to measure impacts on biodiversity, or the success of restoration activities. The sensors would also be a game changer for ecology researchers, as they would be able to gather data on a greater scale than has ever been possible. Indeed, with sufficient training it might be possible for the machine learning to perform call recognition of individuals, leading to great leaps forward in our understanding of population dynamics and animal behaviour. All of society could have access to real-time assessments of the status of our national natural heritage. These examples of stakeholder usage are likely to yield both economic and conservation benefits. We urgently need investment in a national biodiversity monitoring program as envisaged here. There is clearly

an opportunity for the National Research Infrastructure Roadmap and the National Environmental Science Hub for Environmental Resilience to get involved in supporting this programme.

Effective monitoring is essential to improve our conservation outcomes (Robinson *et al.* 2018). This seems a relatively cheap opportunity to improve conservation management given the other costs necessary to conserve Australia's biodiversity (Wintle *et al.* 2019).

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APPENDIX 1

Appendix Table 1. List of Australia's terrestrial threatened species from the Environment Protection and Biodiversity Conservation Act 1999 (https://www.environment.gov.au/cgi-bin/sprat/public/publicthreatenedlist.pl#frogs_critically_endangered), their conservation status (CE – critically endangered; EN – endangered, VU – vulnerable) and whether they could be monitored via the BIOMON system of sound recorders and a general camera trap array.

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Cophixalus concinnus</i>	Elegant Frog	Amphibians			CE
<i>Cophixalus hosmeri</i>	Hosmer's Frog, Rattling Nursery-frog	Amphibians			CE
<i>Cophixalus mcdonaldi</i>	McDonald's Frog, Mt Elliot Nursery-frog	Amphibians			CE
<i>Cophixalus monticola</i>	Mountain-top Nursery-frog	Amphibians			CE
<i>Cophixalus neglectus</i>	Neglected Frog, Bellenden Ker Nursery-frog	Amphibians			CE
<i>Geocrinia alba</i>	White-bellied Frog, Creek Frog	Amphibians			CE
<i>Litoria castanea</i>	Yellow-spotted Tree Frog, Yellow-spotted Bell Frog	Amphibians			CE
<i>Litoria kroombitensis</i>	Kroombit Treefrog	Amphibians			CE
<i>Litoria lorica</i>	Armoured Mistfrog	Amphibians			CE
<i>Litoria myola</i>	Kuranda Tree Frog	Amphibians			CE
<i>Litoria nyakalensis</i>	Mountain Mistfrog, Nyakala Frog	Amphibians			CE
<i>Philoria frosti</i>	Baw Baw Frog	Amphibians			CE

APPENDIX 1

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Pseudophryne corroboree</i>	Southern Corroboree Frog	Amphibians			CE
<i>Pseudophryne pengilleyi</i>	Northern Corroboree Frog	Amphibians			CE
<i>Taudactylus pleione</i>	Kroombit Tinker Frog, Pleione's Torrent Frog	Amphibians			CE
<i>Cryptoblepharus egeriae</i>	Christmas Island Blue-tailed Skink	Reptiles	*		CE
<i>Lepidodactylus listeri</i>	Christmas Island Gecko, Lister's Gecko	Reptiles			CE
<i>Nangura spinosa</i>	Nangur Spiny Skink	Reptiles			CE
<i>Phyllurus gulbaru</i>	Gulbaru Gecko	Reptiles			CE
<i>Acanthornis magna greeniana</i>	King Island Scrubtit, Scrubtit (King Island)	Birds			CE
<i>Amytomis modestus obscurior</i>	Grey Range Thick-billed Grasswren	Birds			CE
<i>Anthochaera phrygia</i>	Regent Honeyeater	Birds			CE
<i>Calidris ferruginea</i>	Curlew Sandpiper	Birds			CE
<i>Calidris tenuirostris</i>	Great Knot	Birds			CE
<i>Cinclosoma punctatum anachoreta</i>	Mt Lofty Ranges Spotted Quail-thrush	Birds			CE
<i>Epthianura crocea macgregori</i>	Capricorn Yellow Chat, Yellow Chat (Dawson)	Birds			CE
<i>Lathamus discolor</i>	Swift Parrot	Birds			CE
<i>Lichenostomus melanops cassidix</i>	Helmeted Honeyeater, Yellow-tufted Honeyeater	Birds			CE
<i>Limosa lapponica menzbieri</i>	Northern Siberian Bar-tailed Godwit	Birds			CE
<i>Melanodryas cucullata melvillensis</i>	Tiwi Islands Hooded Robin, Hooded Robin (Tiwi Islands)	Birds			CE
<i>Neophema chrysogaster</i>	Orange-bellied Parrot	Birds			CE
<i>Numenius madagascariensis</i>	Eastern Curlew, Far Eastern Curlew	Birds			CE
<i>Pedionomus torquatus</i>	Plains-wanderer	Birds			CE
<i>Pezoporus flaviventris</i>	Western Ground Parrot, Kyloring	Birds			CE
<i>Pterodroma arminjoniana</i>	Round Island Petrel, Trinidad Petrel	Birds			CE
<i>Pterodroma heraldica</i>	Herald Petrel	Birds			CE
<i>Crociodura trichura</i>	Christmas Island Shrew	Mammals			CE
<i>Gymnobelideus leadbeateri</i>	Leadbeater's Possum	Mammals			CE
<i>Lasiorhinus krefftii</i>	Northern Hairy-nosed Wombat, Yaminon	Mammals			CE
<i>Miniopterus orianae bassanii</i>	Southern Bent-wing Bat	Mammals			CE
<i>Petrogale concinna concinna</i>	Nabarlek (Victoria River District)	Mammals			CE
<i>Potorous gilbertii</i>	Gilbert's Potoroo, Ngilkat	Mammals			CE
<i>Pseudocheirus occidentalis</i>	Western Ringtail Possum	Mammals			CE
<i>Pteropus natalis</i>	Christmas Island Flying-fox, Christmas Island Fruit-bat	Mammals			CE

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Zyromys pedunculatus</i>	Central Rock-rat, Antina	Mammals		I	CE
<i>Cophixalus aenigma</i>	Tapping Nursery-frog	Amphibians	I		EN
<i>Crinia sloanei</i>	Sloane's Froglet	Amphibians	I		EN
<i>Litoria booroolongensis</i>	Booroolong Frog	Amphibians	I		EN
<i>Litoria spenceri</i>	Spotted Tree Frog	Amphibians	I		EN
<i>Mixophyes fleayi</i>	Fleay's Frog	Amphibians	I		EN
<i>Mixophyes iteratus</i>	Giant Barred Frog, Southern Barred Frog	Amphibians	I		EN
<i>Taudactylus eungellensis</i>	Eungella Day Frog	Amphibians	I		EN
<i>Taudactylus rheophilus</i>	Tinkling Frog	Amphibians	I		EN
<i>Uperoleia mahonyi</i>	Mahony's Toadlet	Amphibians	I		EN
<i>Bellatorias obiri</i>	Arnhem Land Egernia	Reptiles			EN
<i>Cryptoblepharus gurrumul</i>	Arafura Snake-eyed Skink	Reptiles			EN
<i>Cyclodomorphus praealtus</i>	Alpine She-oak Skink	Reptiles			EN
<i>Cyrtodactylus sadleiri</i>	Christmas Island Giant Gecko	Reptiles			EN
<i>Egernia stokesii badia</i>	Western Spiny-tailed Skink, Baudin Island Spiny-tailed Skink	Reptiles			EN
<i>Eulamprus leuraensis</i>	Blue Mountains Water Skink	Reptiles			EN
<i>Eulamprus tympanum marnieae</i>	Corangamite Water Skink, Dreeite Water Skink	Reptiles			EN
<i>Lerista allanae</i>	Allan's Lerista, Retro Slider	Reptiles			EN
<i>Lerista neviniae</i>	Nevin's Slider	Reptiles			EN
<i>Liopholis guthega</i>	Guthega Skink	Reptiles			EN
<i>Liopholis slateri slateri</i>	Slater's Skink, Floodplain Skink	Reptiles			EN
<i>Lucasium occultum</i>	Yellow-snouted Gecko, Yellow-snouted Ground Gecko	Reptiles			EN
<i>Tiliqua adelaidensis</i>	Pygmy Blue-tongue Lizard, Adelaide Blue-tongue Lizard	Reptiles			EN
<i>Tympanocryptis condaminensis</i>	Condamine Earless Dragon	Reptiles			EN
<i>Tympanocryptis pinguicollis</i>	Grassland Earless Dragon	Reptiles			EN
<i>Acanthiza pusilla archibaldi (magnirostris)</i>	King Island Brown Thornbill, Brown Thornbill (King Island)	Birds	I		EN
<i>Accipiter hiogaster natalis</i>	Christmas Island Goshawk	Birds	I		EN
<i>Amytornis barbatus barbatus</i>	Bulloo Grey Grasswren, Grey Grasswren (Bulloo)	Birds	I		EN
<i>Amytornis dorotheae</i>	Carpentarian Grasswren	Birds	I		EN
<i>Amytornis merrotsyi pedleri</i>	Gawler Ranges Short-tailed Grasswren, Short-tailed Grasswren	Birds	I		EN
<i>Aquila audax fleayi</i>	Tasmanian Wedge-tailed Eagle	Birds	I		EN
<i>Atrichornis clamosus</i>	Noisy Scrub-bird, Tjimiluk	Birds	I		EN
<i>Atrichornis rufescens</i>	Rufous Scrub-bird	Birds	I		EN
<i>Botaurus poiciloptilus</i>	Australasian Bittern	Birds	I		EN

APPENDIX 1

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Calamanthus pyrrhopygius parkeri</i> = <i>Hylacola pyrrhopygia parkeri</i>	Chestnut-rumped Heathwren (Mt Lofty Ranges)	Birds	I		EN
<i>Calidris canutus</i>	Red Knot, Knot	Birds	I		EN
<i>Calyptorhynchus banksii</i> <i>graptogyne</i>	South-eastern Red-tailed Black-Cockatoo	Birds	I		EN
<i>Calyptorhynchus baudinii</i> = <i>Zanda baudinii</i>	Baudin's Cockatoo, Long- billed Black-Cockatoo	Birds	I		EN
<i>Calyptorhynchus lathami</i> <i>halmaturinus</i>	Kangaroo Island Glossy Black-Cockatoo	Birds	I		EN
<i>Calyptorhynchus latirostris</i> = <i>Zanda latirostris</i>	Carnaby's Cockatoo, Short- billed Black-Cockatoo	Birds	I		EN
<i>Casuarius casuarius</i> <i>johnsonii</i>	Southern Cassowary, Australian Cassowary, Double-wattled Cassowary	Birds	I		EN
<i>Ceyx azureus</i> <i>diemenensis</i>	Tasmanian Azure Kingfisher	Birds	I		EN
<i>Chalcophaps indica</i> <i>natalis</i>	Christmas Island Emerald Dove	Birds	I		EN
<i>Charadrius mongolus</i>	Lesser Sand Plover, Mongolian Plover	Birds	I		EN
<i>Cyanoramphus cookii</i>	Norfolk Island Green Parrot, Tasman Parakeet, Norfolk Island Parakeet	Birds	I		EN
<i>Cyclopsitta diophthalma</i> <i>coxeni</i>	Coxen's Fig-Parrot	Birds	I		EN
<i>Dasyornis brachypterus</i>	Eastern Bristlebird	Birds	I		EN
<i>Dasyornis longirostris</i>	Western Bristlebird	Birds	I		EN
<i>Diomedea amsterdamensis</i>	Amsterdam Albatross	Birds			EN
<i>Diomedea dabbenena</i>	Tristan Albatross	Birds			EN
<i>Diomedea sanfordi</i>	Northern Royal Albatross	Birds			EN
<i>Epthianura crocea</i> <i>tunneyi</i>	Alligator Rivers Yellow Chat, Yellow Chat (Alligator Rivers)	Birds	I		EN
<i>Erythrura gouldiae</i>	Gouldian Finch	Birds	I		EN
<i>Fregata andrewsi</i>	Christmas Island Frigatebird, Andrew's Frigatebird	Birds	I		EN
<i>Hypotaenidia philippensis</i> <i>andrewsi</i>	Buff-banded Rail (Cocos (Keeling) Islands), Ayam Hutan	Birds	I		EN
<i>Hypotaenidia sylvestris</i>	Lord Howe Woodhen	Birds	I		EN
<i>Macronectes giganteus</i>	Southern Giant-Petrel, Southern Giant Petrel	Birds	I		EN
<i>Malurus coronatus</i> <i>coronatus</i>	Purple-crowned Fairy-wren (western)	Birds	I		EN
<i>Manorina melanotis</i>	Black-eared Miner	Birds	I		EN
<i>Neochmia phaeton</i> <i>evangelinae</i>	Crimson Finch (white- bellied), White-bellied Crimson Finch	Birds	I		EN
<i>Neochmia ruficauda</i> <i>ruficauda</i>	Star Finch (eastern), Star Finch (southern)	Birds	I		EN

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Ninox novaeseelandiae undulata</i>	Norfolk Island Boobook, Norfolk Island Morepork, Southern Boobook (Norfolk Island)	Birds			EN
<i>Papasula abbotti</i>	Abbott's Booby	Birds			EN
<i>Pardalotus quadragintus</i>	Forty-spotted Pardalote	Birds			EN
<i>Pezoporus occidentalis</i>	Night Parrot	Birds			EN
<i>Phaethon lepturus fulvus</i>	Christmas Island White-tailed Tropicbird, Golden Bosunbird	Birds			EN
<i>Poephila cincta cincta</i>	Southern Black-throated Finch	Birds			EN
<i>Psephotus chrysopterygius</i>	Golden-shouldered Parrot, Alwal	Birds			EN
<i>Psophodes nigrogularis nigrogularis</i>	Western Heath Whipbird	Birds			EN
<i>Pterodroma leucoptera leucoptera</i>	Gould's Petrel, Australian Gould's Petrel	Birds			EN
<i>Rostratula australis</i>	Australian Painted Snipe	Birds			EN
<i>Sterna vittata bethunei</i>	New Zealand Antarctic Tern, Antarctic Tern (New Zealand)	Birds			EN
<i>Stipiturus malachurus intermedius</i>	Fleurieu Peninsula Southern Emu-wren, Mount Lofty Southern Emu-wren	Birds			EN
<i>Stipiturus mallee</i>	Mallee Emu-wren	Birds			EN
<i>Thalassarche cauta</i>	Shy Albatross	Birds			EN
<i>Thalassarche chrysostoma</i>	Grey-headed Albatross	Birds			EN
<i>Thalassarche eremita</i>	Chatham Albatross	Birds			EN
<i>Turdus poliocephalus erythropleurus</i>	Christmas Island Thrush	Birds			EN
<i>Turnix olivii</i>	Buff-breasted Button-quail	Birds			EN
<i>Tyto novaehollandiae melvillensis</i>	Tiwi Masked Owl, Tiwi Islands Masked Owl	Birds			EN
<i>Antechinus argentus</i>	Silver-headed Antechinus	Mammals			EN
<i>Antechinus arktos</i>	Black-tailed Antechinus	Mammals			EN
<i>Arctocephalus tropicalis</i>	Subantarctic Fur-seal	Mammals			EN
<i>Bettongia penicillata ogilbyi</i>	Woylie	Mammals			EN
<i>Bettongia tropica</i>	Northern Bettong	Mammals			EN
<i>Burramys parvus</i>	Mountain Pygmy-possum	Mammals			EN
<i>Dasyurus hallucatus</i>	Northern Quoll, Digul, Wijingadda, Wiminji	Mammals			EN
<i>Dasyurus maculatus gracilis</i>	Spotted-tailed Quoll (North Queensland), Yarri	Mammals			EN
<i>Dasyurus maculatus maculatus (SE mainland population)</i>	Spot-tailed Quoll, Spotted-tail Quoll, Tiger Quoll (SE mainland population)	Mammals			EN
<i>Dasyurus viverrinus</i>	Eastern Quoll, Luaner	Mammals			EN
<i>Hipposideros inornatus</i>	Arnhem Leaf-nosed Bat	Mammals			EN

APPENDIX 1

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Isoodon obesulus obesulus</i>	Southern Brown Bandicoot (eastern)	Mammals		I	EN
<i>Lagorchestes hirsutus Central Australian subspecies</i>	Mala, Rufous Hare-Wallaby (Central Australia)	Mammals		I	EN
<i>Mesembriomys gouldii gouldii</i>	Black-footed Tree-rat, Djintamoonga, Manbul	Mammals		I	EN
<i>Myrmecobius fasciatus</i>	Numbat	Mammals		I	EN
<i>Neophoca cinerea</i>	Australian Sea-lion, Australian Sea Lion	Mammals		I	EN
<i>Notomys aquilo</i>	Northern Hopping-mouse, Woorrentinta	Mammals		I	EN
<i>Onychogalea fraenata</i>	Bridled Nail-tail Wallaby, Bridled Naitail Wallaby	Mammals		I	EN
<i>Parantechinus apicalis</i>	Dibbler	Mammals		I	EN
<i>Perameles bougainville bougainville = Perameles bougainville</i>	Western Barred Bandicoot (Shark Bay)	Mammals		I	EN
<i>Perameles gunnii Victorian subspecies</i>	Eastern Barred Bandicoot (Mainland)	Mammals		I	EN
<i>Petaurus australis Wet Tropics subspecies</i>	Yellow-bellied Glider (Wet Tropics), Fluffy Glider	Mammals	I		EN
<i>Petaurus gracilis</i>	Mahogany Glider	Mammals			EN
<i>Petrogale coenensis</i>	Cape York Rock-wallaby	Mammals		I	EN
<i>Petrogale concinna canescens</i>	Nabarlek (Top End)	Mammals		I	EN
<i>Petrogale concinna monastria</i>	Nabarlek (Kimberley)	Mammals		I	EN
<i>Petrogale lateralis kimberleyensis</i>	Wiliji, West Kimberley Rock-wallaby	Mammals		I	EN
<i>Petrogale lateralis lateralis</i>	Black-flanked Rock-wallaby, Moororong, Black-footed Rock Wallaby	Mammals		I	EN
<i>Petrogale persephone</i>	Proserpine Rock-wallaby	Mammals		I	EN
<i>Potorous longipes</i>	Long-footed Potoroo	Mammals		I	EN
<i>Pseudomys fumeus</i>	Smoky Mouse, Konoom	Mammals			EN
<i>Pseudomys oralis</i>	Hastings River Mouse, Koontoo	Mammals		I	EN
<i>Pseudomys shortridgei</i>	Heath Mouse, Dayang, Heath Rat	Mammals			EN
<i>Pteropus conspicillatus</i>	Spectacled Flying-fox	Mammals	I		EN
<i>Sarcophilus harrisii</i>	Tasmanian Devil	Mammals		I	EN
<i>Sminthopsis griseoventer aitkeni</i>	Kangaroo Island Dunnart	Mammals			EN
<i>Sminthopsis psammophila</i>	Sandhill Dunnart	Mammals			EN
<i>Tachyglossus aculeatus multiaculeatus</i>	Kangaroo Island Echidna	Mammals		I	EN
<i>Zyzomys palatalis</i>	Carpentarian Rock-rat, Aywalirroomoo	Mammals			EN
<i>Geocrinia vitellina</i>	Orange-bellied Frog	Amphibians	I		VU
<i>Heleioporus australiacus</i>	Giant Burrowing Frog	Amphibians	I		VU

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Litoria aurea</i>	Green and Golden Bell Frog	Amphibians	I		VU
<i>Litoria dayi</i>	Australian Lace-lid, Lace-eyed Tree Frog, Day's Big-eyed Treefrog	Amphibians	I		VU
<i>Litoria littlejohni</i>	Littlejohn's Tree Frog, Heath Frog	Amphibians	I		VU
<i>Litoria alongburensis</i>	Wallum Sedge Frog	Amphibians	I		VU
<i>Litoria piperata</i>	Peppered Tree Frog	Amphibians	I		VU
<i>Litoria raniformis</i>	Growling Grass Frog, Southern Bell Frog	Amphibians	I		VU
<i>Litoria verreauxii alpina</i>	Alpine Tree Frog, Verreaux's Alpine Tree Frog	Amphibians	I		VU
<i>Mixophyes balbus</i>	Stuttering Frog, Southern Barred Frog (in Victoria)	Amphibians	I		VU
<i>Pseudophryne covacevichae</i>	Magnificent Brood Frog	Amphibians	I		VU
<i>Spicospina flammocaerulea</i>	Sunset Frog	Amphibians	I		VU
<i>Acanthophis hawkei</i>	Plains Death Adder	Reptiles			VU
<i>Anomalopus mackayi</i>	Five-clawed Worm-skink, Long-legged Worm-skink	Reptiles			VU
<i>Aprasia parapulchella</i>	Pink-tailed Worm-lizard, Pink-tailed Legless Lizard	Reptiles			VU
<i>Aprasia pseudopulchella</i>	Flinders Ranges Worm-lizard	Reptiles			VU
<i>Carinascincus palfreymani</i>	Pedra Branca Skink, Pedra Branca Cool-skink, Red-throated Skink	Reptiles			VU
<i>Christinus guentheri</i>	Lord Howe Island Gecko, Lord Howe Island Southern Gecko	Reptiles			VU
<i>Coeranoscincus reticulatus</i>	Three-toed Snake-tooth Skink	Reptiles			VU
<i>Ctenophorus yinnietharra</i>	Yinnietharra Rock-Dragon	Reptiles			VU
<i>Ctenotus lanceolini</i>	Lancelin Island Skink	Reptiles			VU
<i>Ctenotus zasticus</i>	Hamelin Ctenotus	Reptiles			VU
<i>Delma impar</i>	Striped Legless Lizard, Striped Snake-lizard	Reptiles			VU
<i>Delma mitella</i>	Atherton Delma, Legless Lizard	Reptiles			VU
<i>Delma torquata</i>	Adorned Delma, Collared Delma	Reptiles			VU
<i>Denisonia maculata</i>	Ornamental Snake	Reptiles			VU
<i>Egernia rugosa</i>	Yakka Skink	Reptiles			VU
<i>Eretmochelys imbricata</i>	Hawksbill Turtle	Reptiles			VU
<i>Furina dunmalli</i>	Dunmall's Snake	Reptiles			VU
<i>Hoplocephalus bungaroides</i>	Broad-headed Snake	Reptiles			VU
<i>Lerista vittata</i>	Mount Cooper Striped Skink, Mount Cooper Striped Lerista	Reptiles			VU
<i>Liasis olivaceus barroni</i>	Olive Python (Pilbara subspecies)	Reptiles			VU

APPENDIX 1

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<i>Liopholis kintorei</i>	Great Desert Skink, Tjakura, Warrarna, Mulyamiji	Reptiles			VU
<i>Liopholis pulchra longicauda</i>	Jurien Bay Skink, Jurien Bay Rock-skink	Reptiles			VU
<i>Notechis scutatus ater</i>	Kreff's Tiger Snake (Flinders Ranges)	Reptiles			VU
<i>Oligosoma lichenigerum</i>	Lord Howe Island Skink	Reptiles			VU
<i>Ophidiocephalus taeniatus</i>	Bronzeback Snake-lizard	Reptiles			VU
<i>Ramphotyphlops exocoeti</i>	Christmas Island Blind Snake, Christmas Island Pink Blind Snake	Reptiles			VU
<i>Uvidicolus sphyrurus</i>	Border Thick-tailed Gecko, Granite Belt Thick-tailed Gecko	Reptiles			VU
<i>Acanthiza iredalei rosinae</i>	Slender-billed Thornbill (Gulf St Vincent)	Birds	I		VU
<i>Amytornis merrotsyi merrotsyi</i>	Short-tailed Grasswren (Flinders Ranges)	Birds	I		VU
<i>Amytornis modestus</i>	Thick-billed Grasswren	Birds	I		VU
<i>Amytornis textilis myall</i>	Western Grasswren (Gawler Ranges)	Birds	I		VU
<i>Amytornis woodwardi</i>	White-throated Grasswren, Yirlinkirkirr	Birds	I		VU
<i>Anous tenuirostris melanops</i>	Australian Lesser Noddy	Birds			VU
<i>Calyptorhynchus banksii naso</i>	Forest Red-tailed Black-Cockatoo, Karrak	Birds	I		VU
<i>Cereopsis novaehollandiae grisea</i>	Cape Barren Goose (south-western), Recherche Cape Barren Goose	Birds	I	I	VU
<i>Charadrius leschenaultii</i>	Greater Sand Plover, Large Sand Plover	Birds	I		VU
<i>Diomedea antipodensis</i>	Antipodean Albatross	Birds			VU
<i>Diomedea antipodensis gibsoni</i>	Gibson's Albatross	Birds			VU
<i>Diomedea epomophora</i>	Southern Royal Albatross	Birds			VU
<i>Diomedea exulans</i>	Wandering Albatross	Birds			VU
<i>Erythrotriorchis radiatus</i>	Red Goshawk	Birds	I		VU
<i>Falco hypoleucos</i>	Grey Falcon	Birds	I		VU
<i>Falcunculus frontatus whitei</i>	Crested Shrike-tit (northern), Northern Shrike-tit	Birds	I		VU
<i>Fregetta grallaria grallaria</i>	White-bellied Storm-Petrel (Tasman Sea), White-bellied Storm-Petrel (Australasian)	Birds	I		VU
<i>Geophaps scripta scripta</i>	Squatter Pigeon (southern)	Birds	I		VU
<i>Geophaps smithii blaauwi</i>	Partridge Pigeon (western)	Birds	I		VU
<i>Geophaps smithii smithii</i>	Partridge Pigeon (eastern)	Birds	I		VU
<i>Grantiella picta</i>	Painted Honeyeater	Birds	I		VU
<i>Halobaena caerulea</i>	Blue Petrel	Birds			VU
<i>Hirundapus caudacutus</i>	White-throated Needletail	Birds	I		VU

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<i>Leipoa ocellata</i>	Malleefowl	Birds			VU
<i>Leucocarbo atriceps nivalis</i>	Imperial Shag (Heard Island), Heard Shag	Birds			VU
<i>Leucocarbo atriceps purpurascens</i>	Imperial Shag (Macquarie Island)	Birds			VU
<i>Limosa lapponica baueri</i>	Nunivak Bar-tailed Godwit, Western Alaskan Bar-tailed Godwit	Birds			VU
<i>Macronectes halli</i>	Northern Giant Petrel	Birds			VU
<i>Malurus leucopterus edouardi</i>	White-winged Fairy-wren (Barrow Island)	Birds			VU
<i>Malurus leucopterus leucopterus</i>	White-winged Fairy-wren (Dirk Hartog Island)	Birds			VU
<i>Mirafra javanica melvillensis</i>	Horsfield's Bushlark (Tiwi Islands)	Birds			VU
<i>Ninox natalis</i>	Christmas Island Hawk-Owl, Christmas Boobook	Birds			VU
<i>Pachycephala pectoralis xanthoprocta</i>	Golden Whistler (Norfolk Island)	Birds			VU
<i>Pachycephala rufogularis</i>	Red-lored Whistler	Birds			VU
<i>Pachyptila turtur subantarctica</i>	Fairy Prion (southern)	Birds			VU
<i>Petroica multicolor</i>	Norfolk Island Robin, Pacific Robin	Birds			VU
<i>Phoebastria fusca</i>	Sooty Albatross	Birds			VU
<i>Platycercus caledonicus brownii</i>	Green Rosella (King Island)	Birds			VU
<i>Polytelis alexandrae</i>	Princess Parrot, Alexandra's Parrot	Birds			VU
<i>Polytelis anthopeplus monarchoides</i>	Regent Parrot (eastern)	Birds			VU
<i>Polytelis swainsonii</i>	Superb Parrot	Birds			VU
<i>Probosciger aterrimus macgillivrayi</i>	Palm Cockatoo (Australian)	Birds			VU
<i>Psophodes leucogaster leucogaster</i>	Mallee Whipbird	Birds			VU
<i>Pterodroma mollis</i>	Soft-plumaged Petrel	Birds			VU
<i>Pterodroma neglecta neglecta</i>	Kermadec Petrel (western)	Birds			VU
<i>Sterna vittata vittata</i>	Antarctic Tern (Indian Ocean)	Birds			VU
<i>Sternula nereis nereis</i>	Australian Fairy Tern	Birds			VU
<i>Stipiturus malachurus parimeda</i>	Southern Emu-wren (Eyre Peninsula)	Birds			VU
<i>Strepera fuliginosa colei</i>	Black Currawong (King Island)	Birds			VU
<i>Strepera graculina crissalis</i>	Lord Howe Island Currawong, Pied Currawong (Lord Howe Island)	Birds			VU
<i>Thalassarche bulleri</i>	Buller's Albatross, Pacific Albatross	Birds			VU

APPENDIX 1

Scientific name	Common Name	Taxa	Sound	Vision	Status
<i>Thalassarche bulleri platei</i>	Northern Buller's Albatross, Pacific Albatross	Birds			VU
<i>Thalassarche carteri</i>	Indian Yellow-nosed Albatross	Birds			VU
<i>Thalassarche impavida</i>	Campbell Albatross, Campbell Black-browed Albatross	Birds			VU
<i>Thalassarche melanophris</i>	Black-browed Albatross	Birds			VU
<i>Thalassarche salvini</i>	Salvin's Albatross	Birds			VU
<i>Thalassarche steadi</i>	White-capped Albatross	Birds			VU
<i>Thinornis cucullatus cucullatus</i>	Eastern Hooded Plover; Eastern Hooded Plover	Birds	I		VU
<i>Turnix melanogaster</i>	Black-breasted Button-quail	Birds	I		VU
<i>Turnix varius scintillans</i>	Painted Button-quail (Houtman Abrolhos)	Birds	I		VU
<i>Tyto novaehollandiae castanops (Tasmanian population)</i>	Masked Owl (Tasmanian)	Birds	I		VU
<i>Tyto novaehollandiae kimberli</i>	Masked Owl (northern)	Birds	I		VU
<i>Zoothera lunulata halmaturina</i>	South Australian Bassian Thrush, Western Bassian Thrush	Birds	I		VU
<i>Antechinus bellus</i>	Fawn Antechinus	Mammals			VU
<i>Antechinus minimus maritimus</i>	Swamp Antechinus (mainland)	Mammals			VU
<i>Bettongia lesueur Barrow and Boodie Islands subspecies</i>	Boodie, Burrowing Bettong (Barrow and Boodie Islands)	Mammals	I	I	VU
<i>Bettongia lesueur lesueur</i>	Burrowing Bettong (Shark Bay), Boodie	Mammals	I	I	VU
<i>Chalinolobus dwyeri</i>	Large-eared Pied Bat, Large Pied Bat	Mammals	I		VU
<i>Conilurus penicillatus</i>	Brush-tailed Rabbit-rat, Brush-tailed Tree-rat, Pakooma	Mammals		I	VU
<i>Dasyuroides byrnei</i>	Kowari, brushy-tailed marsupial rat, Byrne's crest- tailed marsupial rat	Mammals		I	VU
<i>Dasyurus geoffroii</i>	Chuditch, Western Quoll	Mammals		I	VU
<i>Dasyurus maculatus maculatus (Tasmanian population)</i>	Spotted-tail Quoll, Spot- tailed Quoll, Tiger Quoll (Tasmanian population)	Mammals		I	VU
<i>Hipposideros semoni</i>	Semon's Leaf-nosed Bat, Greater Wart-nosed Horseshoe-bat	Mammals	I		VU
<i>Isoodon auratus auratus</i>	Golden Bandicoot (mainland)	Mammals		I	VU
<i>Isoodon auratus barrowensis</i>	Golden Bandicoot (Barrow Island)	Mammals		I	VU
<i>Isoodon obesulus nauticus</i>	Southern Brown Bandicoot (Nuyts Archipelago)	Mammals		I	VU

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<i>Lagorchestes conspicillatus conspicillatus</i>	Spectacled Hare-wallaby (Barrow Island)	Mammals		I	VU
<i>Lagorchestes hirsutus bernieri</i>	Rufous Hare-wallaby (Bernier Island)	Mammals		I	VU
<i>Lagorchestes hirsutus dorreae</i>	Rufous Hare-wallaby (Dorre Island)	Mammals		I	VU
<i>Lagostrophus fasciatus fasciatus</i>	Banded Hare-wallaby, Mermine, Marnine, Munning	Mammals		I	VU
<i>Leporillus conditor</i>	Wopilkara, Greater Stick-nest Rat	Mammals		I	VU
<i>Macroderma gigas</i>	Ghost Bat	Mammals	I		VU
<i>Macrotis lagotis</i>	Greater Bilby	Mammals		I	VU
<i>Mastacomys fuscus mordicus</i>	Broad-toothed Rat (mainland), Tooarrana	Mammals		I	VU
<i>Mesembriomys gouldii melvillensis</i>	Black-footed Tree-rat (Melville Island)	Mammals		I	VU
<i>Mesembriomys gouldii rattooides</i>	Black-footed Tree-rat (north Queensland), Shaggy Rabbit-rat	Mammals		I	VU
<i>Mirounga leonina</i>	Southern Elephant Seal	Mammals		I	VU
<i>Notomys fuscus</i>	Dusky Hopping-mouse, Wilkiniti	Mammals			VU
<i>Nyctophilus corbeni</i>	Corben's Long-eared Bat, South-eastern Long-eared Bat	Mammals	I		VU
<i>Osphranter robustus isabellinus</i>	Barrow Island Wallaroo, Barrow Island Euro	Mammals		I	VU
<i>Perameles gunnii gunnii</i>	Eastern Barred Bandicoot (Tasmania)	Mammals		I	VU
<i>Petauroides volans</i>	Greater Glider	Mammals			VU
<i>Petrogale lateralis centralis</i>	Warru, Central Australian Rock-wallaby	Mammals		I	VU
<i>Petrogale lateralis hacketti</i>	Recherche Rock-wallaby	Mammals		I	VU
<i>Petrogale penicillata</i>	Brush-tailed Rock-wallaby	Mammals		I	VU
<i>Petrogale sharmani</i>	Mount Claro Rock Wallaby, Sharman's Rock Wallaby	Mammals		I	VU
<i>Petrogale xanthopus celeris</i>	Yellow-footed Rock-wallaby (central-western Queensland)	Mammals		I	VU
<i>Petrogale xanthopus xanthopus</i>	Yellow-footed Rock-wallaby (SA and NSW)	Mammals		I	VU
<i>Phascogale calura</i>	Red-tailed Phascogale, Red-tailed Wambenger, Kenngoor	Mammals		I	VU
<i>Phascogale pirata</i>	Northern Brush-tailed Phascogale	Mammals		I	VU
<i>Phascogale tapoatafa kimberleyensis</i>	Kimberley brush-tailed phascogale, Brush-tailed Phascogale (Kimberley)	Mammals		I	VU
<i>Phascolarctos cinereus</i> (combined populations of Qld, NSW and the ACT)	Koala	Mammals	I		VU

APPENDIX 1

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<i>Potorous tridactylus tridactylus</i>	Long-nosed Potoroo (SE Mainland)	Mammals		I	VU
<i>Pseudomys australis</i>	Plains Rat, Palyoora, Plains Mouse	Mammals			VU
<i>Pseudomys fieldi</i>	Shark Bay Mouse, Djoongari, Alice Springs Mouse	Mammals			VU
<i>Pseudomys novaehollandiae</i>	New Holland Mouse, Pookila	Mammals			VU
<i>Pseudomys pilligaensis</i>	Pilliga Mouse, Poolkoo	Mammals			VU
<i>Pteropus poliocephalus</i>	Grey-headed Flying-fox	Mammals	I		VU
<i>Rhinolophus robertsi</i>	Large-eared Horseshoe Bat, Greater Large-eared Horseshoe Bat	Mammals	I		VU
<i>Rhinoicteris aurantia (Pilbara form)</i>	Pilbara Leaf-nosed Bat	Mammals	I		VU
<i>Saccolaimus saccolaimus nudicluniatus</i>	Bare-rumped Sheath-tailed Bat, Bare-rumped Sheath-tail Bat	Mammals	I		VU
<i>Setonix brachyurus</i>	Quokka	Mammals		I	VU
<i>Sminthopsis butleri</i>	Butler's Dunnart	Mammals			VU
<i>Sminthopsis douglasi</i>	Julia Creek Dunnart	Mammals			VU
<i>Trichosurus vulpecula arnhemensis</i>	Northern Brushtail Possum	Mammals			VU
<i>Xeromys myoides</i>	Water Mouse, False Water Rat, Yirrkoo	Mammals			VU
<i>Zyzomys maini</i>	Arnhem Rock-rat, Arnhem Land Rock-rat, Kodjper	Mammals			VU

* Species of fish, turtles/tortoises, sea-snakes and whales are excluded. We have been conservative in not including small mammals as taxa that can be adequately monitored via camera trapping.

** Some species of herpetofauna may be able to be monitored using camera traps, however these require targeted methods (Welbourne *et al.* 2020).