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- Contact: Himlal.baral@gmail.com
-
- **Abstract**

 Human impacts on the natural environment have resulted in a steady decline in biodiversity and associated ecosystem services. A major policy and management challenge is to efficiently allocate limited resources for nature conservation to maximize biodiversity benefits. Spatial assessment and mapping of biodiversity value plays a vital role in identifying key areas for conservation and establishing conservation priorities. This study measured biodiversity value using readily available data and tools in order to identify conservation priority sites in a heavily modified and fragmented production landscape. The study also assessed trade-offs among biodiversity and other ecosystem services. We used spatial tools for assessing and mapping biodiversity such as Patch Analyst in ArcGIS 10.2 to assess landscape alteration states, and the Integrated Valuation of Ecosystem Services and Tradeoffs to identify habitat quality. Results indicated that areas of high biodiversity conservation value were concentrated in less modified land-cover types. Substantially modified land-cover types (generally associated with agriculture and irrigated pastures) had lower habitat quality and biodiversity value. The analysis revealed that assessments based solely on habitat condition may not be the most suitable basis for conservation planning because this does not include associated adjacent land uses, roads or other threats to biodiversity. Spatially targeted environmental plantings and less intensive agroforestry that reconnect native remnants in heavily fragmented landscapes can provide significant potential conservation outcomes. Planned landscape reconfiguration based on readily available spatial data can yield net positive benefits to biodiversity by halting degradation of remnant native vegetation and increasing total habitat area.

Keywords: Land-use change, ecosystem services, spatial approach, biodiversity, Australia

1. Introduction

 In recent years, the importance of biodiversity to global economies, human welfare and survival has been well documented and widely recognised (Butchart et al., 2010; Duffy, 2009; Rands et al., 2010; Steffen et al., 2009; TEEB, 2009). In Australia, biodiversity continues to decline in spite of Federal and state government efforts to manage threats (Bennett, 2003; DSE, 2010; NRMC, 2010; OECD, 2008; SoE, 2011; Steffen et al., 2009) with similar trends globally (Butchart et al., 2010; CBD, 2010; MEA, 2005; Steffen et al., 2009). Moreover, Australia has suffered the largest documented extinction of species of any continent over the last 200 years (DSEWPC, 2011). The main identified threats to biodiversity in Australia include loss, fragmentation and degradation of habitat or natural ecosystems, spread of invasive species, unsustainable use of natural resources, inappropriate fire regimes, and climate change (Bennett, 2003; NRMC, 2010; Steffen et al., 2009).

 With significant expansion in production landscapes for agricultural activity around the world and a resultant ongoing decline of natural systems (FAO, 2005; World Bank, 2010), there is an increasing focus on the role of production landscapes in conserving biodiversity and providing a variety of ecosystem services (Bélair et al., 2010; Kandziora et al., 2013; Wilson et al., 2010). Securing biodiversity in the production landscape can enhance agricultural productivity through pollination and pest regulation, water quality and nutrient regulation, soil stabilisation, and carbon sequestration (Hopper et al., 2005; Kasel et al., 2011; Scherr and McNeely, 2008; Tscharntke et al., 2005). While there is ongoing debate about the relative merits of integrated versus partitioned conservation activity (Phalan et al., 2011; Tscharntke et al., 2012), conservation policy makers and land managers are giving strong support to conserving biodiversity in highly modified production landscapes (Wilson et al., 2010). Spatial assessment and mapping of conditions suitable for biodiversity conservation or restoration are also essential for the establishment of baseline biological data that will aid successful conservation planning

 and management in highly modified landscapes (Eigenbrod et al., 2009; Jones-Walters, 2008) and help identify priority sites for allocating limited resources (Brooks et al., 2006; Higgins, 2006).

 Extent and quality of habitat conditions are often used as proxies of biodiversity (Nelson et al., 2011; Tallis et al., 2010) and remote sensing based techniques are being increasingly employed to generate biodiversity and ecosystem services indicators (García-Gómez and Maestre 2011; Lück-Vogel et al., 2013; Nagendra et al., 2013; Spanhove et al., 2012). Recent research has focused on linking current land use and vegetation types to biodiversity and associated ecosystem services (Burkhard et al., 2012; Falcucci et al., 2007; Foley et al., 2005; Hector and Bachi, 2007; Kandziora et al., 2013; Yapp et al., 2010). A variety of approaches have been used to identify conservation priority sites within production landscapes, each focused on a different aspect of biodiversity (e.g., Kandziora et al., 2013; Schneiders et al., 2012; Tallis et al., 2010) from global (Brooks et al., 2006; Jongman, 2013) to local scale (Higgins, 2006; Jongman, 2013). Given the imperative for expeditious implementation of conservation solutions (Watts and Handley, 2010), rapid assessment approaches that use readily available data and tools are highly desirable (Baral et al., 2013; Burkhard et al., 2012; Grantham et al., 2008, 2009).

 The aim of this study is to spatially characterise a heavily modified and fragmented production landscape and assess biodiversity value using readily available data and tools in order to identify conservation priority sites. An additional aim is to assess the effect of land-use change on the provision of biodiversity and associated ecosystem services. To achieve these objectives we used spatial approaches and tools for biodiversity assessment and mapping such as Integrated Valuation of Ecosystem Services and Trade-offs (InVEST) biodiversity models (Tallis et al., 2010) and patch analyst tool (Rempel et al., 1999, 2012). The resulting data and maps and subsequent analyses are used to consider the opportunities for re-configuring natural vegetation in cleared, modified and degraded landscapes to meet new sustainable landscape management objectives. Furthermore, we comment on the suitability of InVEST tools for habitat quality assessment and conservation planning.

2. Methods

2.1. Study site

 The study site is located in north-central Victoria, Australia between Kerang and Lake Boga, approximately 320 km north-west of Melbourne (35.972º S, 143.228º E, Fig. 1). The total area spans about 30,000 ha, essentially defined by the boundaries of the Little Murray and Lower Loddon Rivers in the North, West and South and the Murray Valley Highway in the West. Within the study area lies the Winlaton and Reedy Lakes Future Farming Landscapes (FFL) projects managed by Kilter Pty Ltd. The terrain is generally flat and low-lying (70-80 m above sea level) despite being a considerable distance from the coast. Mean annual rainfall of 50 years average is approximately 370 mm and mean annual 86 temperature ranges from a minimum of 9 °C to a maximum of 23 °C.

Fig 1 approximately here#

 Land and water use in the study area are dynamic. Irrigation water entitlements are being bought and sold, and there are ongoing changes in where and how farming takes place, and with people moving from rural properties to regional town centres (NCCMA, 2007). More recently, Kilter Pty Ltd (an asset management group servicing the superannuation sector), has been selecting land in north-central Victoria and managing it under Future Farming Landscapes (FFL), a long-term program that aims to restore landscapes to their most sustainable configurations. Through this program 25% or 7552 ha of the Reedy Lakes and Winlaton study area is currently being reconfigured and managed for both traditional and new income streams including agriculture, forestry, green energy, and water. This potential for future land-use change presented an ideal opportunity to assess the current status of biodiversity and associated ecosystem services provided by each land use-land cover type as a baseline for assessing the implications of future land management options.

 The area has been subject to extensive vegetation clearing for agriculture and pastoral production, with native vegetation now highly fragmented and often degraded (NCCMA, 2005). Since European

settlement in the mid 1800s, an estimated 70% of native vegetation (18,300 ha) has been cleared.

Associated effects of this clearing include widespread declines in biodiversity, increased soil and stream

salinity and soil erosion (NCCMA, 2011). Each of these land management problems is of national

importance (Steffen et al., 2009) and for this reason this study area is reflective of the challenges affecting

many parts of the region. Major land use-land cover types and the proportion of the area occupied by each

land use in Reedy Lakes and Winlaton include: (i) irrigated farming, 28%; (ii) dryland cropping, 26%;

(iii) native vegetation, 23%; (iv) degraded land undergoing rehabilitation, 10%; (v) water, 10%; and (vi)

other, 3%.

 Reedy Lakes and Winlaton covers less than 0.2 % of Victoria's land mass; however, it supports a relatively large number of threatened flora (50 species, 2.5% of the total threatened flora for Victoria) and

fauna (81 species, 45% of the total threatened species) (DSE, 2008a, b). The high levels of biodiversity,

along with the pressures on it, have resulted in Reedy Lakes and Winlaton being identified as an

important site for conservation by the Victorian Government (DSE, 2010). Wetlands within the study area

support a high diversity and abundance of waterfowl species (Lugg et al., 1989) and some are of

international significance, including the 'Kerang Wetlands Ramsar Site' (Fig. 1).

2.2. GIS data, software and analytical tools

A number of datasets were compiled for the study site from a variety of sources and stored in Geographic

Information System (GIS) database. Key datasets included: (i) a recent land use map based on the

Australian Land Use and Management (ALUM) classification (BRS, 2006) (ii) native

vegetation/Ecological Vegetation Classes (EVC) (DSE, 2011), (iii) threatened flora and fauna (DSE

2008a, b), (iv) Land Management Unit (LMU) data (Kilter Pty Ltd, 2011), (v) climate data, and (vi)

topographical data such as roads, contours and watercourses. GIS raster datasets, with a land use-land

cover code for each cell were produced by collating these datasets into ArcGIS 10.2 from ESRI Inc.

 All datasets were projected into UTM54 South using a GDA1994 geographic coordinate system 125 with the raster datasets additionally re-sampled to a common spatial resolution of a 50 m grid.

2.2.1 Patch Analyst tool

 For this study, size and distribution of landscape patches were assessed for native vegetation including grasslands using the Patch Analyst extension for ArcGIS 10.2 (Rempel et al., 1999, 2012) and the output used to classify the landscape into alteration classes. The distribution of remnant native vegetation in Reedy Lakes and Winlaton was quantified using spatial metrics such as patch size and connectivity. Remnant native vegetation was categorised into three patch sizes based on area (Michaels et al. 2008): small patches (<10 ha), medium patches (10-50 ha) and large patches (>50 ha). We analysed core area (Rempel et al., 1999) with application of different buffers of 25 m, 50 m, and 100 m following Michaels et al. (2008) and evaluated the number of patches in each of three patch area categories relative to the initial patch analysis.

2.2.2 InVEST tool

 The biodiversity model in InVEST tools generates two key sets of information useful in making an initial assessment of conservation needs: the relative extent and habitat quality in a region and its changes across time (Tallis et al., 2010). This tool assumes that large areas with a high habitat quality would support more flora and fauna species and individuals, and the areas that decrease in habitat extent and quality over time would contain reduced levels of biodiversity. More detailed description of input data for InVEST are outlined in Table 1 and a more detailed description of calculating a parcel's habitat-quality and rarity score is outlined by Bai et al. (2011), Leh et al. (2013), Nelson et al. (2011), Polasky et al. (2011), and Tallis et al. (2010).

Table 1 approximately here#

2.3. Land cover

For this study we used current land use-land cover types for the InVEST analysis (Tallis et al. 2010;

Table 1) and a possible future land use based on proposed land use reconfiguration by the Future Farming

Landscapes program to assess the impact of land-use change on biodiversity and various ecosystem

services. The planned future land use reconfiguration covers 25% of the study area and includes: (i)

irrigated cropping, 37%; (ii) biodiversity and environmental planting, 26%; (iii) grazing, 20%; (iv)

perennial horticulture, 9%; and (v) agroforestry, 5%. A large number of native tree species are included

under the environmental planting programme including Mallee Eucalypt (*Eucalyptus dumosa*), Black Box

(*Eucalyptus largiflorens*), Red Gum (*Eucalyptus camaldulensis*) and a variety of *Acacia* species (Kilter

Pty Ltd, 2011).

2.4. Conservation priority sites

 Conservation priority sites were identified according to a number of criteria including: (i) extant vegetation types and their bioregional conservation status within the region, (ii) biodiversity goals and resource condition targets of the study region, and (iii) and relative abundance of threatened fauna and flora.

2.5. Land-use changes and impact on biodiversity and associated ecosystem services

 Key ecosystem services associated with biodiversity in the study area are listed in Table 2 (DSE 2004, 2010; Parks Victoria, 2000; Steffen et al., 2009). A rapid qualitative assessment of ecosystem services provides an understanding of land use-land cover change and associated impacts on various ecosystem services. For this study we used peer reviewed papers, published reports and expert opinion for qualitative assessment and ranking (Baral et al., *in press,* Bullock et al., 2007, 2011; Cao et al., 2009; Dowson and Smith, 2007; de Groot and van der Meer, 2010; MEA, 2005; Ostle et al., 2009; Shelton et al., 2001;). In addition, feedback from other stakeholders and agencies has also been incorporated.

Table 2 approximately here#

 To assess the impacts of land use-land cover changes we used three temporal reference points – (i) pre-European condition from modelled historical vegetation data: it was assumed that the study area was intact native vegetation until European settlement and vegetation modification in the early 1850s, (ii) current or intensive agricultural focus: the large proportion of native vegetation converted to agriculture since the 1850s, and (iii) future farming landscape: proposed landscape reconfiguration through the FFL program.

3. Results

3.1. Spatial characterisation of the landscape – Patch Analyst tool

 Twenty two percent of the study area (6,800 ha) supported native vegetation. This vegetation was highly fragmented, in more than 4,000 irregularly shaped patches. Of these patches 98.5% were small sized patches (<10 ha), 1.2% were medium sized (10-50 ha) and only 0.3% were large sized (>50 ha). Although there was one large block of approximately 1,800 ha intact native vegetation (Fig. 2), the small sized patches of native vegetation dominated the landscape with mean patch size of 1.8 ha and median patch size of 0.06 ha. Small sized patches of native vegetation were distributed predominantly (82%) on privately owned land subject to agricultural and pastoral land uses. However, 40% of medium and larger patches were located on public land, often within conservation and habitat protection areas. Other metrics associated with native vegetation patch analysis such as, edge, shape and diversity and interspersion metrics are presented in Table 3.

- **# Fig 2 approximately here#**
- **# Table 3 approximately here#**

 The extent to which patches are at risk of depletion is dependent on the size of patches and the area of edge. This was assessed by measurement of various sized buffers (25 m, 50 m, and 100 m) around the patch. Increasing buffer size substantially decreased the number of patches of remnant vegetation. For example using a 25 m buffer reduced the number of vegetation patches by more than 50% (4,098 to

1,804) and a 100 m buffer, reduced the number of isolated patches by over 95%.

3.2. Relative habitat quality across the landscape – InVEST tool

 The InVEST tool indicated that a very small proportion of the landscape currently provides high habitat quality and associated biodiversity values. Larger vegetation patches usually support greater habitat quality (Fig. 3), although this depended on surrounding land use-land cover and their associated threats. Two wildlife reserves and part of a large water body i.e., Lake Boga are classified as relatively high quality habitats. Interestingly the eastern study area boundary along the Little Murray River shows a higher habitat quality which is due to reduced intensity of threats and larger areas of extant native vegetation.

Fig 3 approximately here#

3.3. Conservation priority sites

 Based on the North Central CMA's regional biodiversity goals and resource condition target and the bioregional conservation status of remnant native vegetation, the study area is classified into three categories of remnant native vegetation patches – high (44%), moderate (49%) and low (7%). The most cleared and underrepresented EVCs in the study bioregion, and therefore the high priority for conservation or restoration, are Plains Savannah, Plains Woodland, Chenopod Grassland and Semi-arid Chenopod Woodland. Moderate priority sites are represented by various EVCs such as, Lignum Swamp, Lignum Swampy Woodland, and Woorinen Mallee. Other EVCs such as Riverine Chenopod Woodland, Grassy Riverine Swamp and Lake Bed Herbland are reasonably well represented and classified under low priority sites. The sites with recorded threatened fauna and threatened flora are further classified as very high priority conservation sites (Fig. 4).

Fig 4 approximately here#

3.4. Land-use change and impact on biodiversity and other ecosystem services

 conserving small remnants patches and revegetating around them can enhance landscape connectivity by reducing fragmentation at the landscape scale. However, parts of the study area were in a relictual state with limited capacity to be restored (McIntyre and Hobbs, 1999). In many cases, fragmented remnant vegetation may contribute some biodiversity value, including their role as stepping stones for biodiversity to move to larger patches and as dispersal sources (Lindenmayer and Fischer, 2006; Michaels et al., 2008; Rubio and Saura, 2012). Hilty et al. (2006) proposed planting corridors of native vegetation as a solution to habitat fragmentation allowing species to move between isolated fragments. Others have suggested that such appropriately located biodiversity corridors may be important in allowing plant and animal species to migrate due to climate change (Baranyi et al., 2011). Such corridor plantings need to start with the protection and connection of relatively high value biodiversity patches (CEF, 2012). If remnant native vegetation is to be managed sustainably on heavily modified agricultural land, its role in providing other ecosystem services, such as carbon storage or water quality, needs to be assessed, and in turn can support, and provide funding for conservation (CEF, 2012; Crossman et al., 2011; Foley et al., 2005).

4.2. Relative habitat quality across the landscape – InVEST tool

 Vegetation condition assessment and mapping has become a major priority for Australian agencies and organizations responsible for natural resource management (Pert et al., 2012). However current approaches used in various Australian states , the 'habitat hectares approach' in Victoria (Parkes et al., 2003), 'biometric approach' in New South Wales (Gibbons et al., 2008), and 'bio-condition mapping' in Queensland (Eyre et al., 2011) focus mainly on vegetation condition with limited consideration of surrounding landscape and potential threats, and may not lead to the best biodiversity conservation decisions. The results of the InVEST tool differ to those of the Victorian government Department of 262 Sustainability of Environment for the same area (Newell et al., 2006), and indicates that a focus solely on vegetation condition without considering surrounding landscape context and potential threats may not lead to the best biodiversity conservation decisions. Patterns in biodiversity habitat quality are inherently spatial and should be analysed in conjunction with the surrounding threats (Paukert et al., 2011) and their

 relative impact, the sensitivity of habitat to each threat, and distances between the habitats and sources of threats (Pert et al., 2012; Tallis et al., 2010).

 Our results indicate that different assessment approaches might yield quite different results, impacting on conservation and restoration investment choices. However, there is a positive relationship between the size of native vegetation patch and habitat quality – that was consistent with many other studies (Fischer et al., 2006; Munro et al., 2007; Newell et al., 2006). This is especially true in fragmented production landscapes where a number of threatening processes surround remnant native vegetation and where smaller patches are more susceptible than larger patches (Munro et al., 2007). To this end, conservation measures should focus on consolidating smaller vegetation patches in to larger blocks. Landscape scale biodiversity assessments need to include the whole mosaic of land cover and land uses, including small fragments or individuals in areas used for pastoral production or agriculture outside patches of native vegetation.

4.3. Conservation priority sites

 In recent years, there has been some progress towards biodiversity conservation, with an additional 2,000 ha of habitat improved for biodiversity conservation and the risk of extinction reduced for threatened flora and fauna at priority sites (NCCMA, 2011). However the study area still has a low cover of native vegetation (<30% of pre-European) and is therefore a high priority for protection of remaining EVCs based on the regional biodiversity goal and resource condition targets (NCCMA, 2003, Table S1). The location of biodiversity and associated threats are distributed unevenly therefore it is essential to prioritise the area for conservation to minimise the loss (Brooks et al., 2006; Higgins, 2006). Conservation priority maps generated in this study (Fig. 4) provide an indicative guide to natural resource managers and investors of where to allocate the limited resources available for nature conservation in order to maximize biodiversity benefits (Higgins, 2006). However, distribution of records of threatened fauna and flora are concentrated near water-bodies and accessible sites. This is mainly due to issues surrounding accessibility

and the use of water bodies for recreational purposes by those people reporting species occurrences.

Consequently, they may present a biased picture of habitat requirements, particularly for fauna.

 In areas of high priority sites, conservation organisations can partner with other stakeholders interested in a variety of services to effect outcomes, effectively increasing the resources available for conservation (Goldman et al., 2008) and maximise the return on conservation investment (Underwood et al., 2008).

4.4. Land-use changes and provision of biodiversity and ecosystem services

 The relationship between biodiversity values and the provision of ecosystem services has been extensively discussed (Hectar and Bagchi, 2007; Kandziora et al., 2013; Kareiva et al., 2011; Leadely et al., 2010; Turner et al., 2007). Ecosystems functions affected by loss of biodiversity include pollination, seed dispersal, climate regulation, carbon sequestration, and agricultural pest and disease control (MEA, 2005). This is particularly important in this study area, where ecosystem services such as water quality, soil conservation and pollination are economically important. Provision of ecosystem services further justifies conservation and restoration of native vegetation (CEF, 2012; Nelson et al., 2008). Conservation purely for the sake of biodiversity is difficult to justify without first demonstrating direct benefits to human beings (Chen et al., 2010).

 Land management has a major impact on biodiversity and the provision of ecosystem services. In many parts of the world, land-use change has altered most of the landscape and resulted in substantial ecological consequences such as decline in biodiversity and ecosystem services (Zhao et al., 2006). Our study landscape has undergone considerable habitat loss and fragmentation in a relatively short history of European occupation. We found that the proposed land-use changes in this study landscape could result in a net positive gain to biodiversity, mainly due to conversion of intensively-managed agriculture and pasture land to environmental plantings, low intensity grazing and agroforestry activities. The InVEST results inferred that smaller, fragmented patches that are exposed to threats are generally of low

 conservation value. Smaller patches may sustain smaller populations which increases the probability of extinction resulting from environmental and demographic pressures (Fischer and Lindenmayer, 2007). Therefore biodiversity plantings and other revegetation work will be more effective if they are consolidated to existing remnant vegetation patches in order to create larger habitat patches that have a higher probability of being randomly occupied by a given individual or species than smaller patches (Connor and McCoy, 1979). This confirms the view of McIntyre and Hobbs (1999) that relictual landscapes are of lower priority for conservation investments. The data from this study provides a basis for reconfiguring and consolidating the current biodiversity investment program for greater conservation benefits.

 Limitations of applying geo-spatial and remote sensing techniques including InVEST tools for biodiversity assessments include the lack of assessment of small-scale characteristics and finer details (Spanhove et al., 2012) and field verification is required in many cases (Hernández-Stefanoni et al., 2011; Lück-Vogel et al. 2013). Furthermore, the value of a patch of habitat for species or ecosystem will depend on size, quality, functional condition, surrounding land uses and suitability for rare or threatened species. While the basic biodiversity model of the InVEST tool takes surrounding land uses into consideration, the habitat value of a patch is limited to its size.

5. Conclusions

Conservation of biodiversity and associated ecosystem services in highly modified and fragmented

production landscapes is a crucial natural resource management issue in Australia and elsewhere.

Availability of data and appropriate tools are often identified as issues in assessment of biodiversity and

ecosystem services. Here we successfully demonstrate spatial approaches to classifying the landscape for

habitat quality, based on the size, density, distribution and condition of native remnant vegetation in the

landscape scale. Our findings indicate that simple and readily available spatial data, tools and models can

be useful for conservation assessment, planning and management and, as observed by Polasky et al.

- (2008), higher levels of both biodiversity conservation and the provision of ecosystem services can be
- achieved by appropriate spatial patterns of restoration activities. Conservation organisations, or catchment
- management bodies, businesses and individual landowners can use these tools to align their strategies and
- locate their restoration activities on priority sites to maximize the outcomes of their conservation
- investment (Kareiva, 2010; Underwood et al., 2008).

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- **Appendix A Supplementary data**
- Supplementary data associated with this article can be found, in the online version, at doi
- [information to be provided]

References

- Baral, H., Keenan, R.J., Fox, J.C., Stork, N.E., Kasel, S., 2013. Spatial assessment of ecosystem goods
- and services in complex production landscapes: A case study from south-eastern Australia.
- Ecological Complexity 13, 35–45.
- Baral, H., Keenan, R.J., Stork, N.E., Kasel, S., in press. Measuring and managing ecosystem goods and
- services in changing landscapes: a south-east Australian perspective. J. Environ. Plann. Manage.
- DOI: 10.1080/09640568.2013.824872
- Bai, Y., Zhuang, C., Ouyang, Z., Zheng, H., Jiang, B., 2011. Spatial characteristics between biodiversity and ecosystem services in a human-dominated watershed. Ecol. Complex. 8, 177–183.
- Baranyi, G., Saura, S., Podani, J., Jordán, F., 2011. Contribution of habitat patches to network
- connectivity: Redundancy and uniqueness of topological indices. Ecol. Indic. 11, 1301–1310.
- Bélair, C., Ichikawa, K.L., Wong, B.Y., Mulongoy, K.J., 2010. Sustainable use of biological diversity in
- socio-ecological production landscapes. Background to the 'Satoyama Initiative for the benefit of
- biodiversity and human well-being, Secretariat of the Convention on Biological Diversity,
- Montreal.
- Bennett, J., 2003. The economic value of biodiversity: a scoping paper. Paper presented to the national workshop The Economic Value of Biodiversity, 22–23 October 2003.
- Brooks, T.M., Mittermeier, R.A., Da Fonseca, G.A.B., Gerlach, J., Hoffmann, M., Lamoreux, J.F.,
- Mittermeier, C.G., Pilgrim, J.D., Rodrigues, A.S.L., 2006. Global Biodiversity Conservation Priorities. Science 313, 58–61.
- BRS, 2006. Guidelines for land use mapping in Australia: principles, procedures and definitions A
- technical handbook supporting the Australian Collaborative Land Use Mapping Programme.
- Edition 3, Bureau of Regional Science, Canberra.
- Bullock, J.M., Aronson, J., Newton, A.C., Pywell, R.F., Rey-Benayas, J.M., 2011. Restoration of
- ecosystem services and biodiversity: conflicts and opportunities. Trends Ecol. Evol. 26, 541–549.
- Bullock, J.M., Pywell, R.F.,Walker, K.J., 2007. Long-term enhancement of agricultural production by restoration of biodiversity. J. Appl. Ecol. 44, 6–12
- Burkhard, B., Kroll, F., Nedkov, S., Müller, F., 2012. Mapping ecosystem service supply, demand and budgets. Ecol. Indic. 21, 17–29.
- Butchart, S.H., Walpole, M., Collen, B., van Strien, A., Scharlemann, J.P., Almond, R.E., Baillie J.E.,
- Bomhard, B., Brown, C., Bruno, J., Carpenter, K.E., Carr, G.M., Chanson, J, Chenery, A.M.,
- Csirke, J., Davidson, N.C., Dentener, F., Foster, M., Galli, A., Galloway, J.N., Genovesi, P.,
- Gregory, R.D., Hockings, M., Kapos, V., Lamarque, J.F., Leverington, F., Loh, J., McGeoch, M.
- A., McRae, L., Minasyan, A., Hernández, Morcillo, M., Oldfield, T.E., Pauly, D., Quader, S.,
- Revenga, C., Sauer J.R., Skolnik, B., Spear, D., Stanwell-Smith, D., Stuart, S.N., Symes, A.,
- Tierney, M., Tyrrell, T.D., Vié, J.C., Watson, R., 2010. Global biodiversity: indicators of recent declines. Science 328(5982), 1164–1168.
- Cao, S., Chen, L., Yu, X., 2009. Impact of China's Grain for Green Project on the landscape of vulnerable
- arid and semi-arid agricultural regions: A case study in northern Shaanxi Province. J Appl. Ecol.
- 46, 536–543.
- CBD, 2010. Global biodiversity outlook 3: executive summary. Secretariat of the Convention on Biological Diversity, Montréal.
- CEF, 2012. Biodiversity fund fact sheet. Clean Energy Future, Australian Government, Canberra.
- Chen, X., Lupi, F., Viña, A., He, G., Liu, J., 2010. Using cost-effective targeting to enhance the efficiency of conservation investments in payments for ecosystem services. Conserv. Biol. 24, 1469–1178.
- Connor, E. F., McCoy, E. D., 1979. The statistics and biology of the species-area relationship. Am. Nat. 113:791–833.
- Crossman, N.D., Bryan, B. A, Summers, D.M., 2011. Carbon payments and low-cost conservation. Conserv. Biol. 25, 835–45.
- DCCEE, 2011. Securing a clean energy future: The Australian government's climate change plan,
- Department of Climate Change and Energy Efficiency, Canberra.
- de Groot, R.S., van der Meer, P.J., 2010. Quantifying and valuing goods and services provided by
- plantation forests. In: Bauhus, J., Meer, P. van der, Kanninen, M. (Eds.), Ecosystem Goods and
- Services from Plantation Forests. Earthscan, London, pp. 16–42.
- Dawson, J.J.C, Smith, P., 2007. Carbon losses from soil and its consequences for land-use management.
- Sci. Total Environ. 382, 165–190.
- DSE, 2004. Kerang Lakes Ramsar Site Strategic Management Plan, Department of Sustainability and
- Environment, East Melbourne, Victoria.
- DSE, 2008a. Threatened fauna 100 (GIS databases), biodiversity policy and programs, Department of
- Sustainability and Environment, East Melbourne, Victoria.
- DSE, 2008b. Threatened flora 100 (GIS databases), biodiversity policy and programs, Department of
- Sustainability and Environment, East Melbourne, Victoria.
- DSE, 2010. Kerang Wetlands Ramsar site ecological character description, Department of Sustainability
- and Environment, East Melbourne, Victoria.
- DSE, 2011. Simplified Native Vegetation Groups. Victorian Department of Sustainability and
- Environment, East Melbourne, Victoria.
- DSEWPC, 2011. Biodiversity Conservation. Department of Sustainability, Environment, Water,
- Populations and Community. Canberra, ACT.
- Duffy, J.E., 2009. Why biodiversity is important to the functioning of real-world ecosystems. Front. Ecol. Environ. 7, 437–444.
- Eigenbrod, F., Anderson, B.J., Armsworth, P.R., Heinemeyer, A., Jackson, S.F., Parnell, M., Thomas,
- C.D., Gaston, K.J., 2009. Ecosystem service benefits of contrasting conservation strategies in a human-dominated region. Proc. R. Soc. Biol. Sci. 276 (1669), 2903–2911.
- Eyre, T.J., Kelly, A.L., Neldner, V.J., 2011. Method for the Establishment and Survey of Reference Sites
- for BioCondition Version 2.0. Department of Environment and Resource Management (DERM),
- Biodiversity and Ecological Sciences Unit, Brisbane.
- Falcucci, A., Maiorano, L., Boitani, L., 2007. Changes in land-use/land-cover patterns in Italy and their implications for biodiversity conservation. Landsc. Ecol. 22, 617–631.
- FAO, 2005. Global Forest Resource Assessment, FAO Forestry Paper 147, Rome.
- Fischer, J., Lindenmayer, D. B., 2007. Landscape modification and habitat fragmentation: a synthesis. Global Ecol. Biogeogr. 16:265–280.
- Fischer, J., Lindenmayer, D.B., Manning, A.D., 2006. Biodiversity, ecosystem function, and resilience:
- ten guiding principles for commodity production landscapes. Front. Ecol. Environ. 4, 80–86.
- Foley, J.A., DeFries, R., Asner, G.P., Barford, C., Bonan, G., Carpenter, S.R., Chapin, F.S., Coe, M.T.,
- Daily, G.C., Gibbs, H.K., Helkowski, J.H., Holloway, T., Howard, E.A., Kucharik, C.J., Monfreda,
- C., Patz, J.A., Prentice, I.C., Ramankutty, N., Snyder, P.K., 2005. Global consequences of land use.
- Science 309, 570–574.
- García-Gómez, M., Maestre, F.T., 2011. Remote sensing data predict indicators of soil functioning in semi-arid steppes, central Spain. Ecol. Indic. 11, 1476–1481.
- Gibbons, P., Ayers, D., Seddon, J., Doyle, S., Briggs, S., 2008. Biometric, Version 2.0. A Terrestrial
- Biodiversity Assessment Tool for the NSW Property Vegetation Plan Developer Operational
- Manual. NSW Department of Environment and Climate Change, Sydney.
- Goldman, R.L., Tallis, H., Kareiva, P. Daily, G.C., 2008. Field evidence that ecosystem service projects
- support biodiversity and diversify options. Proc. Natl. Acad. Sci. U.S.A. 105, 9445–9448.
- Grantham, H.S., Moilanen, A., Wilson, K.A., Pressey, R.L., Rebelo, T.G., Possingham, H.P., 2008.
- Diminishing return on investment for biodiversity data in conservation planning. Conserv. Lett. 1, 190–198.
- Grantham, H.S., Wilson, K. A., Moilanen, A., Rebelo, T., Possingham, H.P., 2009. Delaying conservation actions for improved knowledge: how long should we wait? Ecol. Lett. 12, 293–301.
- Hector, A., Bachi, R., 2007. Biodiversity and ecosystem multifunctionality, Nature 448: 188–190.

 Hernández-Stefanoni, J.L., Alberto Gallardo-Cruz, J., Meave, J. A., Dupuy, J.M., 2011. Combining geostatistical models and remotely sensed data to improve tropical tree richness mapping. Ecol.

Indic. 11, 1046–1056.

- Higgins, I., 2006. Vegetation condition mapping and catchment management: The North Central Victorian experience. Ecol. Manage. Restor. 7, S68–S71.
- Hilty J.A., Lidicker Jr. W.Z., Merenlender, A.M., 2006. Corridor Ecology: The Science and Practice of Linking Landscapes for Biodiversity Conservation. Island Press, Washington, DC.
- Hooper, D.U, Chapin, F.S., Ewel, J.J., Hector, A., Inchausti, P., Lavorel, S., Lawton, J.H., Lodge, D.M.,
- Loreau, M., Naeem, S., Schmid, B., Setälä, H., Symstad, A.J., Vandermeer, J., Wardle, D.A., 2005.
- Effects of biodiversity on ecosystem functioning: a consensus of current knowledge. Ecol. Monogr.
- 75, 3–35.
- House, A.P.N., Macleod, N.D., Cullen, B., Whitbread, A.M., Brown, S.D., Mcivor, J.G., 2008.
- Integrating production and natural resource management on mixed farms in eastern Australia : The
- cost of conservation in agricultural landscapes. Agric. Ecosyst. Environ. 127, 153–165.
- Jones-Walters, L., 2008. Biodiversity in Multifunctional landscapes, J. Nat. Conserv. 16, 117–119.
- Jongman, R.H.G., 2013. Biodiversity observation from local to global. Ecol. Indic. 33, 1–4.
- Kandziora, M., Burkhard, B., Müller, F., 2013. Interactions of ecosystem properties, ecosystem integrity
- and ecosystem service indicators—A theoretical matrix exercise. Ecol. Indic. 28, 54–78.
- Kareiva, P., 2010. Conservation science: Trade-in to trade-up. Nature 466, 322–323.
- Kareiva, P., Tallis, H., Ricketts, T.H., Daily, G.C., Polasky, S., 2011. Natural capital: theory and practice of mapping ecosystem services. Oxford University Press, Oxford.
- Kasel, S., Singh, S., Sanders, G.J., Bennett, L.T., 2011. Species-specific effects of native trees on soil
- organic carbon in biodiverse plantings across north-central Victoria, Australia. Geoderma 161, 95– 106.
- Keenan, R.J., Caripis, L., Foerster, A., Godden, L., Peel, J., 2012. Science and the governance of
- Australia's climate regime. Nature Clim. Change 2, 477–478.
- Kilter Pty Ltd 2011. Land Management Unit (LMU) databases, Google Earth file and associated spreadsheets. Kilter Pty Ltd., Bendigo, Victoria.
- Leadley, P., Pereira, H.M., Alkemade, R., Fernandez-Manjarrés, J.F., Proença, V., Scharlemann, J. P.W.,
- 483 Walpole, M., 2010, Biodiversity Scenarios: Projections of 21st century change in biodiversity and
- associated ecosystem services. 132 pp. Global Biodiversity, Secretariat of the Convention on
- Biological Diversity, Montreal.
- Leh, M.D.K., Matlock, M.D., Cummings, E.C., Nalley, L.L., 2013. Quantifying and mapping multiple ecosystem services change in West Africa. Agric. Ecosyst. Environ. 165, 6–18.
- Lindenmayer, D.B., Fischer, J., 2006. Habitat Fragmentation and Landscape Change: An Ecological and Conservation Synthesis. CSIRO Publishing, Melbourne, Victoria.
- Lück-Vogel, M., O'Farrell, P.J., Roberts, W., 2013. Remote sensing based ecosystem state assessment in the Sandveld Region, South Africa. Ecol. Indic. 33, 60–70.
- Lugg, A., Heron, S., Fleming, G., O'Donnell, T., 1989. Conservation Value of Wetlands in the Kerang
- Lakes Area. Report to the Kerang Lakes Area Working Group. Report No. 1 Department of Forests, Conservation and Lands, Bendigo.
- McIntyre, S., Hobbs, R., 1999. A Framework for Conceptualizing Human Effects on Research Models. Conserv.Biol.13, 1282–1292.
- Michaels, K., Lacey, M., Norton, T., Jann, W., 2008. Vegetation Futures for Tasmania. In: Vegetation Futures. Australia's national vegetation conference, 20–22 Oct 2008, Toowoomba.
- MEA, 2005. Ecosystems and human well-being: Synthesis. Millennium Ecosystem Assessment. Island Press, Washington, DC.
- Munro, N.T., Lindenmayer, D.B., Fischer, J., 2007. Faunal response to revegetation in agricultural areas of Australia: A review. Ecol. Manage. Restor. 8, 199–207.
- Nagendra, H., Lucas, R., Honrado, J.P., Jongman, R.H.G., Tarantino, C., Adamo, M., Mairota, P., 2013.
- Remote sensing for conservation monitoring: Assessing protected areas, habitat extent, habitat
- condition, species diversity, and threats. Ecol. Indic. 33, 45–59.
- NRMC, 2010. Australia's Biodiversity Conservation Strategy 2010–2030. Natural Resource Management
- Ministerial Council, Australian Government, Department of Sustainability, Environment, Water, Population and Communities, Canberra.
- NCCMA, 2003. North Central Regional Catchment Strategy 2003–2007. North Central Catchment
- Management Authority, Huntly, Victoria.
- NCCMA, 2005. North Central native vegetation plan, North Central Catchment Management Authority, Huntly, Victoria.
- NCCMA, 2007. Loddon Campaspe Irrigation Region Land and Water Management Plan Summary, North Central Catchment Management Authority, Huntly, Victoria.
- NCCMA, 2011. Annual Report 2010–11, North Central Catchment Management Authority, Huntly,
- Victoria.
- Nelson, E., Cameron, D.R., Regetz, J., Polasky, S., Daily, G., 2011. Terrestrial biodiversity. In: Natural
- Capital. Theory and Practice of Mapping Ecosystem Services, (Eds.) Karieva, P., Tallis, H.,
- Ricketts, T.H., Daily, G.C., Polasky, S. Oxford University Press, Oxford, pp 34–50.
- Nelson, E., Polasky, S., Lewis, D.J., Plantinga, A.J., Lonsdorf, A., White, D., Bael, D., Lawler, J.J., 2008.
- Efficiency of incentives to jointly increase carbon sequestration and species conservation on a
- landscape. Proc. Natl. Acad. Sci. U.S.A. 105, 9471–9476.
- Newell, G.R., White, M.D., Griffioen, P., Conroy, M., 2006. Vegetation condition mapping at a landscape-scale across Victoria. Ecol. Manage. Restor. 7, S65–S68.
- Ostle, N.J., Levy, P.E., Evans, C.D., Smith, P., 2009. UK land use and soil carbon sequestration. Land Use Policy 26, S274–S283.
- OECD, 2008. OECD Environmental Outlook to 2030. Organization for Economic Co-operation and Development, Paris.
- Parks Victoria, 2000. Strategic Directions Statement for Victoria's Ramsar Sites. Parks Victoria, Melbourne.
- Parkes, D., Newell, G., Cheal, D., 2003. Assessing the quality of native vegetation: The 'habitat hectares'approach Ecol. Manage. Resto. 4, 29–38.
- Paukert, C.P., Pitts, K.L., Whittier, J.B., Olden, J.D., 2011. Development and assessment of a landscape-scale ecological threat index for the Lower Colorado River Basin. Ecol. Indic. 11, 304–310.
- Pert, P.L., Butler, J.R.A., Bruce, C., Metcalfe, D., 2012. A composite threat indicator approach to monitor vegetation condition in the Wet Tropics, Queensland, Australia. Ecol. Indic. 18, 191–199.
- Phalan, B., Onial, M., Balmford, A., Green, R.E., 2011. Reconciling food production and biodiversity conservation: land sharing and land sparing compared. Science 333, 1289–1291.
- Polasky, S., Calderone, G., Duarte, T., Goldstein, J., Hannahs, N., Ricketts, T., Tallis, H., 2011. Putting
- ecosystem service models to work: conservation, management, and trade-offs, in: Kareiva, P.,
- Tallis, H., Ricketts, T.H., Daily, G.C., Polasky, S. (Eds.), Natural Capital : Theory and Practice of Mapping Ecosystem Services. Oxford University Press, Oxford.
- Polasky, S., Nelson, E., Camm, J., Csuti, B., Fackler, P., Lonsdorf, E., Montgomery, C., White, D.,
- Arthur, J., Garberyonts, B., 2008. Where to put things? Spatial land management to sustain biodiversity and economic returns. Biol. Conserv. 141, 1505–1524.
- Rands, M.R.W., Adams, W.M., Bennun, L., Butchart, S.H.M., Clements, A., Coomes, D., Entwistle, A.,
- Hodge, I., Kapos, V., Scharlemann, J.P.W., Sutherland, W.J., Vira, B., 2010. Biodiversity
- Conservation: Challenges Beyond 2010. Science 329, 1298–1303.
- Reeson, A.F., Rodriguez, L.C., Whitten, S.M., Williams, K., Nolles, K., Windle, J., Rolfe, J., 2011.
- Adapting auctions for the provision of ecosystem services at the landscape scale. Ecol. Econ. 70, 1621–1627.
- Rempel, R.S., Carr, A., Elkie, P., 1999. Patch Analyst and Patch Analyst (grid) function reference. Centre for Northern Forest Ecosystem Research, Ontario Ministry of Natural Resources, Lakehead
- University, Thunder Bay, Ontario.
- Rempel, R.S., D. Kaukinen., D., Carr, A.P., 2012. Patch Analyst and Patch Grid. Ontario Ministry of
- Natural Resources. Centre for Northern Forest Ecosystem Research, Thunder Bay, Ontario.

Nature. United Nations Environment Programme, Geneva.

- Tscharntke, T., Klein, A.M., Kruess, A., Steffan-Dewenter, I., Thies, C., 2005. Landscape perspectives on agricultural intensification and biodiversity – ecosystem service management. Ecol. Lett. 8, 857– 874.
- Tscharntke, T., Clough, Y., Wanger, T.C., Jackson, L., Motzke, I., Perfecto, I., Vandermeer, J.,
- Whitbread, A., 2012. Global food security, biodiversity conservation and the future of agricultural intensification. Biol. Conserv. 151, 53–59.
- Turner, W.R., Brandon, K., Brooks, T.M., Costanza, R., da Fonseca, G.A.B., Portela, R., 2007. Global Conservation of Biodiversity and Ecosystem Services. BioScience, 57, 868–873.
- Underwood, E.C., Shaw, M.R., Wilson, K.A., Kareiva, P., Klausmeyer, K.R., McBride, M.F., Bode, M.,
- Morrison, S.A., Hoekstra, J.M., Possingham, H.P., 2008. Protecting biodiversity when money matters: maximizing return on investment. PLoS ONE 3, 7.
- Watts, K., Handley, P., 2010. Developing a functional connectivity indicator to detect change in fragmented landscapes. Ecol. Indic. 10, 552–557.
- Wilson, K.A., Meijaard, E., Drummond, S., Grantham, H.S., Boitani, L., Catullo, G., Christie, L., Dennis,
- R., Dutton, I., Falcucci, A., Maiorano, L., Possingham, H.P., Rondinini, C., Turner, W.R., Venter,
- O., Watts, M., 2010. Conserving biodiversity in production landscapes, Ecol. Appl. 206, 1721–
- 1732.
- Windle, J., Rolfe, J., McCosker, J., Lingard, A., 2009. A conservation auction for landscape linkage in the southern Desert Uplands, Queensland. Rangeland J. 31, 127–135.
- World Bank, 2010. Rising Global Interest in Farmland, World Bank Report, Washington D.C.
- Yapp, G., Walker, J., Thackway, R. 2010. Linking vegetation type and condition to ecosystem goods and services. Ecol. Complex. 7, 292–301.
- Zhao, S., Peng, C., Jiang, H., Tian, D., Lei, X., Zhou, X., 2006. Land use change in Asia and the
- ecological consequences. Ecol. Res. 21, 890–896.

607 **Table 1** Input data for InVEST biodiversity model

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609 LULC, Land use-land cover

611 **Table 2** Key ecosystem services associated with biodiversity in the Reedy Lakes and Winlaton study area. Letters in brackets represent

- 612 Millennium Ecosystem Assessment categories: provisioning (P), Regulating (R), Cultural (C) and Supporting (S) services.
- 613

614 **Table 3**Summary of native vegetation patch analysis in the Reedy Lakes and Winlaton study area.

615

626

Figure Captions

Fig. 1 Location of the Reedy Lakes, Winlaton study area and major land use-land cover types in north central Victoria, Australia.

Fig. 2. Distribution of native vegetation patches in Reedy Lakes and Winlaton according to patch size. Areas currently being converted to biodiversity planting as a part of Future Farming Landscapes are highlighted as are examples of landscape alteration states (a1) intact, (a2) variegated, (a3) fragmented, and (a4) relictual (after McIntyre and Hobbs, 1999), (b) extant native vegetation, (c) pre-European (1750) vegetation distribution (colours represent simplified native vegetation groups, see Table S2).

Fig. 3 The InVEST model of relative habitat quality.

Fig. 4 Conservation priority sites based on bioregional conservation status and north-central regional biodiversity goal and resource condition target, and sites with recorded threatened fauna and flora.

Fig. 5 Typical land-use transition in the Reedy Lakes and Winlaton study area and potential trade-offs among multiple ecosystem services: (a) pre-1850s, (b) 1850s to current, and (c) future landscape under the Future Farming Landscapes (FFL) program. The provision of ecosystem services is applicable to particular transitions and indicative only (figure inspired by Foley et al., 2005).

Fig 5

Appendix A

Supporting material for: "Spatial assessment and mapping of biodiversity and conservation priorities in a heavily modified and

fragmented production landscape in north-central Victoria, Australia" by Himlal Baral, Rodney J. Keenan, Sunil K Sharma, Nigel E. Stork

5 and Sabine Kasel

Table S1 Biodiversity goals and resource condition targets of the study region (NCCMA, 2003).

Table S2 Original and recent (2006) extent of Ecological Vegetation Classes in the Reedy

Lakes and Winlaton study area and their bioregional conservation status (DSE, 2011).

References:

- DSE, 2011. Simplified Native Vegetation Groups. Victorian Department of Sustainability and Environment, East Melbourne.
- NCCMA, 2003. North Central Regional Catchment Strategy 2003-2007. North Central Catchment Management Authority, Huntly, Victoria.