

Biodiversity protection prioritisation: A 25 year review

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Abstract

There are insufficient resources available globally, nationally, and in many regions to conserve all species, habitats and ecosystems. Prioritisation of targets or actions is a rational response to resource scarcity. Prioritisation can be directed at areas for reservation, species, habitats or ecosystems for management, and threat management actions. The scale at which prioritisation is applied is a fundamental decision, and the range includes global, national, regional, and patch. Choice of scale influences availability of data and methods available for prioritisation. Since 1986 availability of data, computing power, and expertise available have all improved globally and in many countries. Approaches to prioritisation have evolved during the last 25 years as researchers from several disciplines including biology, ecology, decision sciences, mathematics, and economics have sought ways to achieve greater output from the resources available for biodiversity conservation. This review surveys the literature and groups prioritisation approaches into four categories: reserves and reserve selection; prescriptive costed biodiversity prioritisation; ranked costed biodiversity projects; and contracted costed conservation actions. A concluding section considers the limitations of current prioritisation approaches and points to areas for further development.

Additional Keywords: biodiversity protection, prioritisation, reserves, actions, costs, contracts

Introduction

For at least 25 years it has been clear that there are increasing threats to biodiversity and there are insufficient resources available to provide all the actions needed to support biodiversity. It has been, and is essential to make choices over where to apply conservation effort. Weitzman (1992, 364) observed 'Yet the laws of economics apply to diversity also. We cannot preserve everything.' In 2011 the Society for Conservation Biology held its twenty-fifth conference in Auckland and two symposia at that event focused upon prioritisation and evaluation of biodiversity projects. This paper draws upon the work of several presenters at that event and reviews developments in biodiversity prioritisation

38 over the last 25 years. The topic is of course of practical importance, but the field has attracted
39 attention from a range of both applied and theoretical researchers in Australasia, USA, and Europe.
40 Conservation biology grew out of biology, and soon included ecologists, but the need for rigorous
41 approaches to biodiversity protection prioritisation attracted researchers with decision science,
42 mathematics, economics and other areas of expertise. The field also attracted specialists in linear
43 programming, dataset collection and management who developed new programs to aid biodiversity
44 protection prioritisation. For early researchers in this field the rationale for prioritisation included
45 maximising the amount of biodiversity protected and hence a focus on identifying where biodiversity
46 was located. The need to prioritise due to limited resource availability in conservation is a classic
47 microeconomic resource allocation problem and economists have increasingly focused on biodiversity
48 protection questions and developed methods to tackle prioritisation challenges. Distinctive focuses of
49 the work of [conservation] economists include the incentives faced by land managers and their
50 behavioural responses to biodiversity conservation programs.

51
52 A large number of publications between 1986 and 2012 have addressed biodiversity prioritisation.
53 There are earlier overviews of this literature and assessments of the state of the art (Margules and
54 Pressey 2000; Sarkar 2002; Wilson *et al.* 2009). The current paper surveys the main prioritisation
55 approaches developed during the past 25 years, points to key publications for each approach,
56 considers their contributions, their scales of application, data requirements and limitations. Almost all
57 of the prioritisation research completed seeks to support or promote biodiversity protection and
58 much of it adopts the perspective of a social planner. A social planner's stance does not derive from
59 biology or ecology, but from a (generally unstated) notion that biodiversity protection actions can be
60 implemented – often by the state. Designation of reserve status for land is one seemingly simple, low
61 cost way of providing biodiversity protection that a social planner can invoke. There are other ways
62 besides reserve designation that biodiversity protection can be pursued, and a social planner might
63 prescribe how best to do this. But even if those actions are delivered by the state they will require
64 expenditures that must be budgeted for or costs to individuals and society that must be taken into
65 account. There are other agencies besides the state that can provide biodiversity protection,
66 particularly on private land, and incentives matter a lot to private sector actors when decisions are
67 made about what, how and where to deliver biodiversity protection.

68
69 This review groups prioritisation approaches in four categories: 1) reserves and reserve selection; 2)
70 prescriptive costed biodiversity prioritisation; 3) ranked costed biodiversity projects and 4) contracted
71 costed conservation actions. It notes the impact that improved data availability, increased computing
72 power, and growth in availability of prioritisation expertise has on methods available for use. A

73 concluding section considers the limitations of current prioritisation approaches and points to areas
74 where prioritisation research may head. Table 1 provides a summary of selected prioritisation
75 approaches in each of the four categories.

76

77 Table 1 near here.

78

79 **Reserves and reserve selection**

80

81 An early approach to biodiversity prioritisation was provided by Myers (1988) who proposed the term
82 'biodiversity hotspots' and identified areas of such hotspots in tropical rainforest that were under
83 threat. The idea of identifying areas where exceptional concentrations of endemic species were
84 undergoing major loss of habitat seemed a useful way to identify areas that might be protected to
85 preserve species. Myers *et al.* (2000, 853) calculated that ...' as many as 44% of all species of vascular
86 plants and 35 % of all species in four vertebrate groups are confined to 25 hotspots comprising only
87 1.4% of the land surface of the Earth. This opens the way for a 'silver bullet' strategy on the part of
88 conservation planners, focusing on these hotspots in proportion to their share of the world's at risk
89 species.' The idea of biodiversity prioritisation achieved attention globally, but finding, funding, and
90 firing the silver bullet has proved a large challenge.

91

92 The first publications on prioritisation focused on reserves and reserve selection. The term 'reserves'
93 is shorthand for *in situ* protection of biodiversity. Many countries have a diverse set of parks and
94 reserves that have been established over a century or more in some cases, and often without
95 biodiversity protection as the principal selection criteria. In many cases, opportunism may have
96 played a major role determining what areas were reserved (Pressey *et al.* 1983). The 1980s saw
97 increased interest in going beyond opportunism and development of methods to systematically
98 determine which areas would be reserved. Margules (1989, 2) commented that a key question
99 tackled within this approach is ...'where should nature reserves be situated?' The focus of this
100 approach was ... 'that reserve networks should encompass maximum biological diversity' and not just
101 rare species or other goals (Margules 1989, 1). Margules commented that it was appropriate to focus
102 on maintaining biological diversity because while much conservation effort targeted specific rare
103 species, many species were unknown and hence could not be used in identification of sites to protect.
104 Reserves were the unit of choice for *in situ* protection and a clear rationale was provided for this
105 focus. Margules and Pressey (2000, 243) argued that reserves had long been used by societies to
106 preserve natural areas and the underlying notion was to ...'separate elements of biodiversity from
107 processes that threaten their existence in the wild.' It was emphasised the geographic place, was the

108 unit of analysis. Biodiversity is found at a place, places vary in the amount and importance of
109 biodiversity they contain, and resources available are limited, so places must be ranked to identify the
110 most important places to reserve (Sarkar *et al.* 2002). The success and usefulness of reserves in
111 separating biodiversity from threatening processes it was argued, would be determined, first by how
112 accurate they were in representing the range of biodiversity, and second whether reserve creation
113 resulted in reduction in threatening processes so that the target biodiversity persisted (Margules and
114 Pressey 2000). Accuracy of representation will be influenced by the way that reserves are compared,
115 ranked, and selected. Persistence of biodiversity will be influenced by what threats there are and
116 what occurs at each site.

117
118 In retrospect this approach seems to emphasise the supply of biodiversity, but to heavily downplay
119 the cost of supply. However, some proponents did link reserve selection and management actions.
120 Sarkar *et al.* (2002) proposed four stages for biodiversity planning and *management* (emphasis added).
121 They recognise that comparing, ranking, selecting areas for in situ protection required data either
122 from existing datasets, or from specifically created datasets. Data are scarce, costly to produce, and
123 rarely as complete as might be desired by analysts and decision makers. If a data set is already
124 available, and conservation goals have already been chosen, stage one required selection of
125 surrogates to represent the biodiversity target. These surrogates for biodiversity might be species
126 distributions (often vertebrates) and environmental variables such as rainfall, temperature or aspect.
127 Stage two called for ordering of places (place prioritization) according to their biodiversity content as
128 represented by the surrogates. Stage three provided a major challenge as it called for projection of
129 futures for the biodiversity of interest – ‘the viability problem’. Various methods may be used to
130 complete a projection including population viability analyses, and threat assessments. Once these
131 projections are completed, places can be reordered based upon ...’the biodiversity value of different
132 places’ (Sarkar *et al.* 2002; 340). The final stage is to devise management practices for each place, but
133 particularly those places with the most valued biodiversity.

134
135 Considerable effort has been devoted to improving the availability of data and developing tools to
136 project futures for biodiversity (Kremen *et al.* 2008). There are many aspects to biodiversity, and no
137 one measure such as character or trait diversity can completely represent biodiversity, hence
138 surrogates are required to both represent biodiversity and to measure biodiversity. Arguably this is
139 not a serious impediment to reserve selection as what are needed are indicators of relative
140 biodiversity, not absolute measures (Sarkar *et al.* 2002). Ultimately, the data on sites contains maps in
141 some form of the chosen biodiversity surrogates.

142

143 Algorithms were developed to aid selection of sites by the application of explicit rules. The principle
144 of complementarity first introduced by Vane-Wright *et al.* (1991) has received considerable attention
145 and is argued to be central to systematic conservation planning (Segan *et al.* 2011; Leathwick *et al.*
146 2010). Sites are added to the list to be reserved if they add more biodiversity features beyond those
147 already included in an existing set of reserves. Margules *et al.* (2002, 318) propose three sets of
148 interrelated principles are applied when selecting sites: persistence and vulnerability,
149 complementarity and efficiency, irreplaceability and flexibility. Other factors can be applied when
150 decisions are made on reserves including acquisition costs and opportunity costs.

151
152 Many sites can provide multiple benefits including supporting biodiversity. Sites can vary greatly in
153 the degree to which they support the persistence of biodiversity. Systematic conservation planning
154 developed to enable planners to target areas that best represent biodiversity and provided
155 opportunities for biodiversity to persist. Selecting the combination of sites which represent
156 biodiversity in the least cost way is known as the minimum set problem. The maximal coverage
157 problem aims to include as much biodiversity as possible given a pre-set budget (Segan *et al.* 2011).
158 These are conceptually straightforward problems, but practically they are complex. Finding solutions
159 to the problems requires use of large biological and socioeconomic datasets, and searching through
160 the often huge solution space (Kremen *et al.* 2008). A range of decision support tools have been
161 developed to handle these problems and they include Marxan (Possingham *et al.* 2000), Zonation
162 (Moilanen 2007), C-Plan (Pressey *et al.* 2009) and ConsNet (Sarkar *et al.* 2009) (see Segan *et al.* 2011,
163 1435.) Marxan is the most widely used of these decision support systems, and has been used in over
164 100 countries. Core outputs from Marxan are zones for protected area sites. In its most recent
165 version Marxan with Zones (Watts *et al.* 2009) enables planners to recognise sites may have multiple
166 uses, and sites provide a range of levels of protection of biodiversity and to other objectives. These
167 recent advances allow planners to identify much smaller areas for protection, at much lower cost
168 than would occur under early versions which dichotomised levels of protection at sites. In essence
169 Marxan with Zones identifies not just where to protect, but how to act at each site (Watts *et al.* 2009).

170
171 Does a focus on biodiversity richness and maximal coverage impact conservation action at a global
172 scale? Halpern *et al.* (2006) studied the expenditures by major conservation players, World Bank GEF,
173 Conservation International, The Nature Conservancy, the World Conservation Union IUCN,
174 Conservation International, World Wide Fund for Nature, and Birdlife International to determine if
175 their expenditures were correlated with global priorities as indicated by biological values and threats.
176 They conclude ... 'biological factors are having little or no influence on spending patterns'. And ...
177 'global priority models are having little effect on how money is distributed among countries

178 containing high-priority areas.’ (Halpern *et al.* 2005, 62). A range of other factors play important roles
179 driving conservation spending.

180

181 **Prescriptive costed biodiversity activities**

182

183 In the face of land use change, population growth, economic growth, and large numbers of invasive
184 species, actions are essential to enable even representative proportions of biodiversity to persist.

185 Biodiversity protection actions require expenditures, and often involve opportunity costs for areas
186 reserved. During the 1990s a handful of publications appeared that recognised costs needed to be

187 included in biodiversity prioritisation approaches. Not surprisingly, economists were among the first
188 authors to explicitly recognise that costs needed to be included in prioritisation analyses (Weitzman

189 1998; Metrick and Weitzman 1998; Ando *et al* 1998). Costs in these first papers were linked directly
190 to projects that would increase the probability of survival of a species. Weitzman (1998) introduced

191 the Noah’s Ark parable as a way to think about biodiversity preservation when society has a limited
192 budget constraint. He argued that we can develop a cost effective ranking approach to determine

193 which species (or other biodiversity unit) projects should have priority on the Ark. Ranking of each
194 species project R_i could be determined using the following formula.

195

196 $R_i = [D_i + U_i] \times (\Delta P_i / C_i)$

197 D_i – distinctiveness

198 U_i - utility

199 ΔP_i - Present value of change in conservation status

200 C_i - Present value of costs

201

202 Weitzman (1998) argued we should allocate the preservation budget (fill the Ark) with the highest
203 ranked species projects – the maximal coverage problem. These are conceptual means to pursue

204 biodiversity protection, but Weitzman (1998) and Metrick and Weitzman (1998) did not estimate
205 empirical costs for real species projects.

206

207 Species ranking systems may provide a cost effective way of selecting species for the Ark, but an
208 important question can be asked of outcomes from that prioritisation approach. How well will an Ark

209 full of individually selected species contribute to ecological functioning? Perry (2010) addressed that
210 question and drew upon functional ecology to construct a new measure of the ecological importance

211 of species. In his prioritisation approach ... ‘Noah must create a thriving ecosystem rather than a zoo’
212 (Perry 2010, 479). An objective function that differs from Metrick and Weitzman (1998) is proposed

213 and the objective is to maximise the sum of the expected ecological importance of species. Perry
214 argues Noah should seek species that will persist, but changing the probabilities of survival of species
215 comes at a cost, and budgets are limited. Perry shows how a ranking equation can be used to
216 prioritise species:

217

$$218 \quad \Delta p_i(M_i)$$

$$219 \quad \text{Rank}_i = \frac{\Delta p_i(M_i)}{c_i}$$

$$220 \quad c_i$$

221 Where Δp_i is the change in probability of survival of a species

222 M_i is a measure of the ecological importance of a species

223 c_i is cost of changing probability of survival of species i .

224 The implications of adopting the Perry approach are likely to be significant. He comments that some
225 charismatic species favoured under a Metrick and Weitzman (1998) type ranking system, which have
226 little current role in functioning ecosystems (spotted owl, grizzly bear, Californian Condor are
227 examples), will not rank highly in an ecosystem importance ranking approach. Perry comments that
228 the US Endangered Species Act could be revised to become the Endangered Ecological Interactions
229 Act.

230

231 While Weitzman, Metrick and Weitzman and Perry focus attention on ranking species, Ando *et al.*

232 (1998) directed their attention to selection of habitat to support species. Obtaining habitat will

233 almost invariably be costly and Ando *et al.* (1998) was amongst the first papers to include empirical

234 cost data in a habitat prioritisation analysis. In that study land prices by county were included when

235 selecting habitat for 911 species, subspecies and populations protected or proposed under the US

236 Endangered Species Act. Ando *et al.* (1998, 2127) caution that the results they generate are stylized

237 and are not policy prescriptions, but ... 'the cost per site under the cost-minimizing solution is less

238 than one-sixth of that under the site-minimizing solution.' Inclusion of economics in the analysis

239 where costs are heterogeneous can lead to much more cost effective prioritisation.

240

241 After the first explicit recognition of the role of cost, a number of papers focused on the importance

242 of costs for prioritisation at global or national scales. Balmford *et al.* (2000) use data on the likely

243 costs of conserving each country's reserve network to determine if that impacts on global priority

244 setting to achieve a range of conservation objectives. Because of the paucity of data on both species

245 and costs, they caution their results should be seen as heuristics and not a blueprint for conservation

246 investments. Nevertheless, Balmford *et al.* (2000) conclude that ... 'integrating cost data with

247 biological information substantially increases the cost-efficiency of resulting priority sets.' Once

248 sensitised to the contribution that costs might make to prioritisation results, subsequent research
249 focused on improving cost data quality, and Balmford et al. (2003) pointed to a startling result.
250 Globally, annual costs of protection of conservation sites range from less than US\$0.10 per km² to
251 more than US\$1 million per km². This seven order of magnitude spread is considerably greater than
252 the range of biodiversity benefits as measured by endemism per km² or number of threatened
253 species per km². Balmford *et al.* (2000) note that costs are lowest in less developed regions,
254 biodiversity richness is highest in low income regions, and current biodiversity protection investments
255 are greatest in high income regions. Reprioritisation of biodiversity investments on cost effectiveness
256 grounds may well be warranted. This is a crucial point of difference from earlier work on reserve
257 selection approaches which focused on biodiversity richness and encompassing maximum biological
258 diversity.

259
260
261 Most, if not all, prioritisation approaches developed before 2004 treated biodiversity and human
262 systems as static (Meier *et al.* 2004, 615). But in a world of rapid economic growth, climate change,
263 growing threats to many species, and limited annual budgets, dynamic aspects of prioritisation need
264 to be considered. Meier *et al.* (2004) examine the impact of confronting several assumptions inherent
265 in conservation planning models up until that date, including inability to reserve complete networks
266 instantaneously, uncertainty about when and where opportunities for investment may arise, varying
267 budget constraints, and degradation through time of unprotected sites. Their goal was to understand
268 how dynamics of ecological and human systems may affect performance of strategies for creating
269 reserve networks (Meier *et al.* 2004, 616). Conservation approaches need to focus on benefits, costs
270 and threats. Stochastic dynamic programming (SDP) is needed to handle these situations but SDP is
271 computationally intensive and impossible where there are more than about 20 conservation sites.
272 Meier *et al.* (2004) demonstrate that analysis of conservation planning problems can be completed
273 where degradation rates and uncertainty are high, by adopting some simplifying rules for selecting
274 sites then comparing results to ad hoc and comprehensive conservation plans. Their results suggest
275 that (Meier *et al.* 2004, 615) ... 'simple decision rules such as protecting the available site with highest
276 irreplaceability or with the highest species richness, may be more effective' ... than comprehensive
277 reserve designs which cannot be implemented immediately.

278
279 A focus on expected benefits from protection is a distinguishing feature of much conservation
280 planning research. In contrast, Naidoo et al. (2005) focus on the gamut of costs that need to be
281 considered in biodiversity project prioritisation. They show (Naidoo *et al.* 2005, 681) that biological-
282 focused conservation planning ... 'implicitly assumes that all areas are equally costly, which is

283 incorrect.' Naidoo *et al.* (2005) identify five types of conservation costs: acquisition costs,
284 management costs, transaction costs, damage costs, opportunity costs. They expand on an important
285 point made earlier by Balmford *et al.* (2000), the importance of including costs depends not just on
286 the correlation between biological benefits and costs, but ... 'more importantly, [on] the relative
287 variability of costs compared with the variability of biological targets' Naidoo *et al.* (2005, 683). For
288 real world conservation prioritisation, dynamics and uncertainty over budgets, threats and
289 opportunities, points to the importance of prioritizing the sequence of conservation investments.

290
291 Naidoo *et al.* (2005, 685) point as well to a further limitation to conservation planning ... 'the lack of
292 implementation of most conservation plans suggests conservation planners have historically not been
293 overly concerned with practical factors that will influence implementation, such as costs of plans.'
294 Real world prioritisation as opposed to prescriptive conservation planning requires focus on genuine
295 conservation projects if it is to be effective.

296
297 Wilson *et al.* (2007) advanced prescriptive conservation planning by combining geographic priorities
298 with a fund allocation formula that recognised the costs of alternate conservation actions that
299 address specific biodiversity threats. Many conservation actions however, do not require (expensive)
300 land purchases. A six step process is developed named the Conservation Investment Framework (CIF)
301 to identify a feasible set of actions given a fixed annual budget. The six steps (Wilson *et al.* 2007,
302 Figure 2) require:

- 303 1. defining the conservation objective,
- 304 2. specifying a budget,
- 305 3. identifying key threats to achieving the objective,
- 306 4, identifying actions to abate threats (including area receiving each action, cost per unit area of each
307 action, and biodiversity benefits of each action),
- 308 5. scheduling investments in order to maximise the objective by allocating funds to actions that
309 maximise biodiversity benefits per dollar invested,
- 310 6. update species – investment relationships given changes in area receiving and requiring investment
311 in each conservation action until the end of the project term.

312 Wilson *et al.* (2007) applied this Conservation Investment Framework to 17 terrestrial Mediterranean
313 ecoregions. Data availability, information on incremental biodiversity benefits from specific actions,
314 and on incremental costs of actions are major challenges for this approach and heuristics such as
315 species – investment curves, and rules such as 'maximise short term gain', are adopted to enable
316 completion of investment prioritisation. The study found (Wilson *et al.* 2007, 1855) the interplay of
317 three main factors drives investment schedules: 1) the relationship between the additional areas

318 invested in each ecoaction and the biodiversity benefit, 2) the cost of this investment, and 3) the
319 existing level of investment. The empirical results of applying the CIF indicate that considerably more
320 biodiversity can be protected than would occur if land were purchased for protection, and priorities
321 shift through time as investments are made. An important point to note is the study, similar to many
322 other conservation plans ...' assumed that each eco-action will be totally effective in abating the
323 relevant threat' (Wilson *et al.* 2007). Complete effectiveness is of course far from assured for real
324 world biodiversity protection actions.

325

326 Polasky *et al.* (2008) develop spatially explicit biological and economic models to determine 'where to
327 put things' while considering both biodiversity and economic returns. Their biological model
328 incorporates habitat preferences, area requirements, and dispersal ability between habitat patches
329 for terrestrial vertebrate species. Their economic model incorporates site characteristics and location
330 to predict economic returns for various land uses. 'Use of the spatially explicit models enables search
331 for efficient land use patterns that maximize biodiversity conservation objectives for a given level of
332 economic returns and vice versa' (Polasky *et al.* 2008, 1524). Their model is applied to the Willamette
333 Basin, USA and the empirical results show that it is possible to maintain a high level of biodiversity in
334 the region and to generate large economic returns through careful spatial land management. A key
335 factor supporting this result is the generalist nature of much of the vertebrate biodiversity in the
336 region. Polasky *et al.* (2008, 1520) comment that the results are suggestive rather than prescriptive.
337 The most important set of issues not included relate to land use change and dynamics (Polasky *et al.*
338 2008, 1522).

339

340 These costed biodiversity prioritisation studies can be described as prescriptive conservation planning.
341 A wise social planner is present striving to find cost effective ways to protect biodiversity, often on
342 privately owned or managed land, but limited attention is provided to on the ground delivery of
343 biodiversity protection actions, the incentives for those actions, their effectiveness, monitoring of
344 actions and the level of biodiversity protection outputs (McDonald-Madden *et al.* 2011).

345

346 **Ranked biodiversity projects**

347

348 The decade since 2002 has seen the development of several prioritisation approaches which focus on
349 identifiable conservation projects. These studies put into practice the approach first proposed and
350 advocated by Weitzman (1998), namely calculation of (weighted) benefit cost ratios for a range of
351 projects, followed by prioritisation based upon each project's rank relative to other biodiversity
352 protection projects. Possingham *et al.* (2002) provide a bold early example of this approach and study

353 18 management options for Australia's terrestrial and freshwater biodiversity. For each of the 18
354 projects, nine steps were followed to enable estimation of some key metrics (Possingham *et al.* 2002):
355 1. outline the nature of the current risk to biodiversity of each threatening process
356 2. state the objective(s) in addressing each risk
357 3. list some management options to reduce or remove each risk stating these as specific and
358 quantifiable as possible
359 4. quantify the risk in terms of the number of native species at risk due to that particular threatening
360 process
361 5. extrapolate from that number of species using a choice of multipliers to calculate biodiversity
362 benefits depending on the assumed effectiveness of the action
363 6. estimate the financial cost of the management option
364 7. calculate the cost per species secured
365 8. describe the nature of the collateral benefits (beyond that to biodiversity, such as carbon storage)
366 and
367 9. estimate the value of the most important items.

368 Completion of those nine steps enables calculation and comparison of each project's key metrics:
369 number of species saved, area of project site, cost per hectare, total costs, number of species saved
370 per million dollars, value of collateral benefits, and value of collateral benefits : cost ratio.
371 Possingham *et al.* (2002, 21) aid comparison of projects by ranking projects on two criteria, collateral
372 benefit : cost ratio and species secured per \$1m. Projects are grouped into high, medium and low
373 scores on the two main criteria. High-High ranked projects are attractive and Low-Low ranked
374 projects are unattractive. This approach to prioritisation requires input from experts as well as use of
375 existing databases. Significant assumptions are made when estimating numbers of collateral species,
376 valuing collateral benefits using value transfer approaches, and when estimating the effectiveness of
377 management options. The results calculated for each of the 18 projects are illuminating with numbers
378 of species secured per \$1m ranging from 95 to 1. Collateral benefit : cost ratios range from 40 to 0.3.
379

380 While Possingham *et al.* (2002) compare regional or national scale projects, the approach of ranking
381 projects by benefit : cost ratios can be applied at various scales. It was implemented for New Zealand
382 single species projects by Joseph *et al.* (2008, 2009), and for patch scale projects in the Kimberly
383 region of West Australia Carwardine *et al.* (2011). Joseph *et al.* (2009) adapt the Noah's Ark
384 framework by including a measure for likelihood of success of projects and focus on Project Efficiency
385 E of each project.

386
387

388 $E_i = \frac{W_i B_i S_i}{C_i}$
389

390 Where W_i is the species weight,
391 B_i is the biodiversity benefits,
392 S_i is the probability of success, and
393 C_i is the cost of project i .

394
395 Joseph *et al.* (2009) follow a nine step process to identify highest ranked projects: 1) define objectives;
396 2) list the biodiversity assets (threatened species); 3) weight the assets; 4) list the potential species
397 management projects; 5) calculate the cost of each project; 5) predict the benefits to species of each
398 project; 6) estimate the likelihood of success of each project; 7) state the constraints to protection
399 action; 8) combine all of the information on costs, values, benefits, likelihood of success and rank
400 projects on benefits/\$ and 9) choose projects based upon the weighted probabilistic benefit : cost
401 ratios.

402
403 Joseph *et al.* (2009) considered only species distinctiveness and assumed the utility of all species was
404 equal. W_i , taxonomic distinctiveness, is assumed inversely related to number of related species – the
405 inverse of the product of the number of branches at genus, family and order nodes. Benefits were
406 defined as the difference between probability of the species being secure in 50 years ‘with
407 management’ and ‘without management’. Present value of costs over 50 years were calculated using
408 a one percent discount rate. Expert judgment was used to estimate likelihood of securing each
409 species in 50 years. This expert judgement method with input from 105 persons during a 1.5 year
410 research period, calculated project efficiency scores for over 2000 biodiversity protection projects. It
411 generated a rank-ordered list of projects for senior managers to use when making resource allocation
412 decisions.

413
414 Joseph *et al.* (2009) observe that the method provides a systematic, transparent, and repeatable
415 method for prioritizing actions to minimize the number of extinctions. Empirical output from the
416 process indicates that by incorporating management costs, benefits, and likelihood of success the
417 return on conservation investment is substantially improved. The ... ‘number of species managed and
418 expected overall benefit to threatened species is increased remarkably.’ (Joseph *et al.* 2009, 337).

419
420 Carwardine *et al.* (2011) adapted the approach used in Possingham *et al.* (2002) but applied it at
421 regional scale. Given alarming declines in biodiversity in the Kimberly region, expert knowledge was
422 garnered in two workshops to: identify key threats, propose threat management actions, estimate

423 costs of actions over a 20 year period, estimate feasibility of implementation over various land
424 tenures, and estimate probabilities of persistence over 20 years (Carwardine *et al.* 2011). Outputs
425 from this approach include the likely outcomes per dollar spent on each action in each bioregion, and
426 these can be ranked in terms of their cost-effectiveness, and priority threat management actions
427 identified. Merit ordering threat management actions allows summary charts to be produced showing
428 incremental gains of wildlife species able to persist as the annual budget is increased.

429
430 Ranking of biodiversity protection projects is a considerable advance over ad hoc choice of projects or
431 approaches which summed various idiosyncratic measures to calculate a total score for each project.
432 Transparent, systematic, multiplicative means to quantify expected project output, and subsequent
433 comparison to project costs, provide a logical, defensible basis on which to rank projects and enable
434 better-informed choices by decision makers. A limitation to their effectiveness is the gap between
435 availability of project ranking systems and their implementation by decision makers.

436

437 **Contracted costed conservation actions**

438

439 This section reviews some of the key issues relevant to biodiversity prioritisation on private land.
440 Biodiversity prioritisation began by focusing on which places to reserve. Those places could be state
441 owned, private property or other tenures. Effective biodiversity protection requires implementation
442 of on ground actions. The effectiveness of actions can be influenced by take up rates of biodiversity
443 protection policies by landowners or managers, reactions by landowners to incentives provided to
444 reduce threats to or conserve biodiversity, and accuracy of metrics used to select biodiversity
445 provision. Some recent prioritisation studies include focus on these aspects of prioritisation (White
446 and Sadler 2012; Polyakov *et al.* 2012). New approaches have been used in some countries to recruit
447 landowners to deliver biodiversity protection, and new methods developed to select areas for
448 protection. Where these new approaches involve payments to landowners, accuracy of monitoring
449 and penalties for non-compliance by landowners can become important issues (Crowe *et al.* 2010).
450 Several prioritisation approaches have included consideration of the expected effectiveness of actions
451 (Joseph *et al.* 2009; Carwardine *et al.* 2011) but it has recently been identified as a component of
452 prioritisation that warrants closer attention (Pannell *et al.* 2012).

453

454 Hajkowicz *et al.* (2007) note that competitive tendering for conservation contracts are increasingly
455 used in Australia, USA and the EU. They explore alternative techniques for the selection of
456 conservation contracts under competitive tender systems, and focus on selection of natural resource
457 management projects. Purchase of biodiversity protection contracts can be viewed as a knapsack

458 problem where each contract has a cost (takes up space in the knapsack), and delivers a benefit
459 (biodiversity gains). The budget available determines the size of the knapsack. Purchasing bodies
460 (NGO, state or national conservation organisations) can select projects that maximise total
461 biodiversity benefits, subject to the budget constraint. If there is a binary decision variable the
462 problem can be formulated as an integer linear programming problem. Hajkowicz *et al.* (2007, Table 1)
463 survey purchasing strategies employed in agricultural land management and environmental programs
464 in USA, Australia, EU and judge that the knapsack formulation represents independent environmental
465 projects quite well. They explore the relative performance of five purchasing strategies and
466 determine that improved optimisation algorithms such as a commercial software package GAMS OSL
467 3 based upon linear relaxation achieved significant increases in environmental benefit within the
468 budget compared to other purchasing strategies. They note (Hajkowicz *et al.* 2007, 53) that concerns
469 over biodiversity project complementarity continue to pose a challenge for users of integer
470 programming approaches to prioritisation.

471
472 White and Sadler (2012, 1) observe that conservation investment decisions require ... 'allocation of
473 limited public funds between assets that change stochastically through time in response to
474 management action and the environment.' They argue that while mathematical decision theory can
475 solve integer programming problems and software such as Marxan finds an approximate least cost
476 conservation plan, little attention is paid to the role of incentives in many conservation planning
477 approaches. If conservation action is to occur on private land, there is likely to be information
478 asymmetry between funding agencies and landowners. As well, conservation plans often
479 underestimate the costs of effective action to protect biodiversity. White and Sadler (2012) target is
480 to develop a more realistic model of conservation planning and they pursue this by auctions for
481 supply of biodiversity protection by landowners. Their model sees a regulator recruiting bush
482 fragments to a conservation scheme, within a fixed budget. An empirical case study in North East
483 Wheatbelt Regional Organisation of Councils (NEWROC), Western Australia, uses Landsat data on land
484 condition for 465 bush fragments from 1988-2007. Markov transition matrices are used to model
485 change in land condition, and existing species-area relationships are applied to the study region.
486 White and Sadler (2012) compare two planning schemes for selecting bush fragments: a first best
487 scheme that assumes perfect information on effort and fencing by landowners with payment based
488 on actual effort, and a second-best fixed payment scheme based on observed fencing but
489 unobservable effort. Extension of the models occurs by way of various sensitivity analyses including
490 level of conservation effort and adverse selection. The authors judge the research results indicate
491 that society should consider innovative approaches to biodiversity protection such as use of output-
492 based (or mixed input and output-based contracts) as they avoid the moral hazard problem, provide a

493 strong incentive for landowners to understand biodiversity condition and learn how to reduce risk of
494 failure to achieve outcomes.

495

496 The use of contracts for biodiversity protection requires purchasers to select from the bids of
497 competing suppliers, and so to prioritise. There is a derived demand for on ground actions by
498 landowners as the ultimate goal sought is enhanced biodiversity. Contracting, monitoring and
499 enforcement are not costless, and there are challenges in measurement of output. But contracted
500 supply of biodiversity protection offers new opportunities to prioritise using rigorous, transparent
501 procedures. It demands at least some measurement of output, and bypasses implementation gaps.
502 Audits should report if there are stark cases of 'money for nothing'.

503

504 **Evolution in approaches to prioritisation**

505

506 A retrospective review of research and empirical application of biodiversity prioritisation methods
507 reveals multiple approaches to prioritisation have been developed during the last 25 years. There are
508 a range of scales at which prioritisation can be applied. Prioritisation can be directed at places,
509 species, actions, and purchases. Significant changes in thinking about many of these topics have
510 occurred since 1986. The earliest prioritisation research focused heavily on place and on reserve
511 selection. Deciding which places to prioritise requires information, which is always scarce for planners.
512 The prescriptive stance adopted in many of the 'reserve selection' studies is that of a wise social
513 planner. Improvements in availability of data and in decision support software have increased the
514 sophistication of the work of the wise planners. But the chasm between reserve selection and
515 implementation of selections provides a large reality check whether at global, national or regional
516 scale. As Margules and Pressey (2000, 250) observed 'There is a world of difference between the
517 selection process ... and making things happen on the ground.' 'Some only exist on paper, never
518 having been implemented.'

519

520 Choices almost always involve cost, such as the opportunity cost of habitat reserved or protected, and
521 very often operational costs of managing sites, and species, or delivering actions. Ranking approaches
522 that include economic costs of protection as denominators, lead decision makers towards
523 prioritisation based upon cost-effectiveness. A range of studies that include economic considerations
524 alongside biological and ecological considerations, consistently point to superior outcomes, whether
525 in a maximal coverage or a minimum set formulation.

526

527 Application of ranking approaches in real project decision-making has recently occurred in a few
528 countries. Researchers and conservation agencies report that application of economic considerations,
529 together with models from biology and ecology does bring large gains from this mode of prioritisation.

530
531 Biodiversity protection can occur on both public and private land. A new set of challenges must be
532 met when attempting to prioritise actions on private land, including incentive provision, behavioural
533 responses, monitoring and contract enforcement. This newest area of prioritisation research contains
534 a number of areas of ongoing study including choice of output metrics, accuracy of effectiveness
535 estimates, and adequacy of monitoring levels.

536

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540

541 **References**

542 Ando, A., Camm, J., Polasky, S., and Solow, A. (1998). Species distributions, land values and efficient
543 conservation. *Science* 279, 2126-2128.

544 Balmford, A et al (2003). Global variation in terrestrial conservation costs, conservation benefits and
545 unmet conservation needs. *PNAS* 110(3), 1046-1050.

546 Carwardine, J., O'Connor, T. Legge, S. Mackey, B. Possingham, H.P. and Martin T.G. (2011). Priority
547 threat management to protect Kimberly wildlife. CSIRO Ecosystem Sciences, Brisbane.

548 Crowe, BC, White, B., and Panell, D. (2010). The impact of inaccurate and costly assessment in payments
549 for environmental services. 54th Australian Agricultural and Resource Economics Society annual
550 conference, Adelaide.

551 Faith, D.P. Carter, G., Cassis, G., Ferrier, S., Wilkie, L. (2003). Complementarity, biodiversity viability
552 analysis and policy-based algorithms for conservation. *Environmental Science and Policy*. 6, 311-328.

553 Hajkowicz, S., Higgins, S.A., Williams, K., Faith, D.P., and Burton M. (2007). Optimisation and the selection
554 of conservation contracts. *Australian Journal Agricultural and Resource Economics* 51, 39-56.

555 Halpern, B.S., Pyke, C.R., Fox, H.E., Haney, J.C., Schlaepfer, M.A., and Zaradic, P. (2006). Gaps and
556 mismatches between global conservation priorities and spending. *Conservation Biology* 20, 56-65.

557 Joseph, L., Maloney, R., O'Connor, S.M., Cromarty, P., Jansen, P.L., Stephens, T., and Possingham, H.P.
558 (2008). Improving methods of allocating resources among threatened species: the case for a new
559 national approach in New Zealand. *Pacific Conservation Biology*, 14 154-158

560 Joseph, L, Maloney, R, and Possingham, HP (2009). Optimal allocation of resources among threatened
561 species: A Project Prioritization protocol. *Conservation Biology*. 23(2) 328-338.

562 Kremen, C., Cameron, A. Moilanen, A., Phillips, S., Thomas, C. D., Beentje, H., Dransfeld, J., Fisher, B.
563 L Glaw, F., Good, T., Harper, G., Hijmans, R.J., Lees, D. C., Louis, E., Nussbaum, R. Razafimpahanana,
564 A., Raxworthy, C., Schatz, G. Vences, M., Vieites, D. R., Wright, P. C., and Zjhra, M. L.(2008). Aligning
565 conservation priorities across taxa in Madagascar, a biodiversity hotspot, with high-resolution
566 planning tools. *Science*, 320, 222-226.

567 Leathwick, J.R., A. Moilanen, S. Ferrier and Julian, K. (2010). Complementarity-based conservation
568 prioritization using a community classification, and its application to riverine ecosystems. *Biological*
569 *Conservation* 143, 984-991.

570 McDonald-Madden, E., Baxter P.W.J., Fuller R.A., Martin, T.G., Game E.T., Montambault J., and
571 Possingham H.P. (2011). Should we implement monitoring or research for conservation? *Trends in*
572 *Ecology & Evolution* 26, 108-109.

573 Margules, C.R. (1989). Introduction to some Australian developments in conservation planning.
574 *Biological Conservation* 50, 1-11.

575 Margules C.R.,and Pressey R.L. (2000). Systematic conservation planning. *Nature*. 405: 243-53.

576 Margules C.R., Pressey,RL., and Williams P.H. (2002). Representing biodiversity: data and procedures
577 for identifying priority areas for conservation. *Journal of Biosciences (suppl. 2)* 27, 309-326.

578 Meier, E., Andelman, S., and Possingham, H.P. (2004). Does conservation planning matter in a dynamic
579 and uncertain world? *Ecology Letters* 7, 615-622

580 Metrick A, and Weitzman M.L. (1998). Conflicts and choices in biodiversity preservation. *Journal of*
581 *Economic Perspectives* 12: 21-34.

582 Moilanen, A. (2007). Landscape Zonation, benefit functions and target-based planning: unifying reserve
583 selection strategies. *Biological Conservation* 134, 571-579.

584 Moilanen, A. (2010). Reserve selection and conservation prioritization. in A. Hastings and L. Gross,
585 editors. *Sourcebook of theoretical ecology*. University of California Press.

586 Myers, N (1988). Threatened 'hotspots' in tropical forests. *Environmentalist* 8, 187-208

587 Myers, N., Mittermeier,R.A., Mittermeier, C.G., de Fonseca, G.A.G and Kent, J. 2000. Biodiversity
588 hotspots for conservation priorities. *Nature* 403, 853-858

589 Naidoo R., Balmford, A., Ferraro P.J., Polasky S., Ricketts T.H., and Rouget, M. (2006). Integrating
590 economic costs into conservation planning. *Trends in Ecology and Evolution* 21, 681-687.

591 Pannell D.J., Roberts A.M., Park, G., Alexander J., Curatolo A., and Marsh S.P. (2012). Integrated
592 assessment of public investment in land-use change to protect environmental assets in Australia. *Land*
593 *Use Policy* 29, 377–387.

594 Perry, N. (2009). The ecological importance of species and the Noah's Ark problem. *Ecological*
595 *Economics* 69(3), 478-485.

596 Polasky, S., Nelson, E., Camm, J., Csuit, B., Facker, P., Lonsdorf, E., Montgomery, C., White, D., Arthur,
597 J., Garber-Yonts, B., Haight, R., Kagan, J., Starfield, A., and Tobalske, C. (2008). Where to put things?
598 Spatial land management to sustain biodiversity and economic returns. *Biological Conservation* 141,
599 1505-1524.

600 Pressey R.L., Humphries C.J., Margules C.R., Vane-Wright R.I., and Williams P.H. (1993). Beyond
601 opportunism: key principles for systematic reserve selection. *Trends in Ecology & Evolution* 8, 124-
602 128.

603 Polyakov, M., Pannell, D., Rowles, A., Park, G., and Roberts, A. (2012). Optimising revegetation for
604 woodland bird species in a Victorian agricultural landscape. 56th Australian Agricultural and Resource
605 Economics Society annual conference, Fremantle.

606 Possingham, H.P., Ball, I., Andelman, S., (2000). Mathematical methods for identifying representative
607 reserve networks. In: Ferson, S., Burgman, M. (Eds.), *Quantitative Methods for Conservation Biology*.
608 Springer-Verlag, New York, pp. 291-305.

609 Possingham, H.P. et al, (2002). Sustaining our natural systems and biodiversity. Prime Minister's
610 Science, Engineering and Innovation Council Eighth Meeting – 31 May 2002. Canberra.

611 Pressey, R.L, Matthews, W.S., Barrett, T.W., Ridges, M., (2009). The C-Plan conservation planning system:
612 origins, applications, and possible futures. In: Moilanen, A., Possingham, H.P., Wilson, K.A. (Eds.), *Spatial*
613 *models for conservation*. Oxford University Press, Oxford.

614 Sarkar S, Aggarwal A, Garson J, Margules CR, and Zeidler J. (2002). Place prioritisation for biodiversity
615 content. *Journal of Biosciences (suppl. 2)* 27, 339-346.

616 Sarkar, S., R. L. Pressey, D. P. Faith, C. R. Margules, T. Fuller, D. M. Stoms, A. Moffett, K. A. Wilson, K. J.
617 Williams, P. H. Williams, and Andelman, S. (2006). Biodiversity Conservation Planning Tools: Present
618 Status and Challenges for the Future. *Annual Review of Environment and Resources* 31, 123-159.

619 Sarkar, S., Fuller, T., Aggarwal, A., Moffett, A., Kelley, C.D., (2009). The ConSNet software
620 platform for systematic conservation planning. In: Moilanen, A., Possingham, H.P., Wilson, K.A. (Eds.),
621 *Spatial Conservation Prioritization*. Oxford University Press, Oxford.

622 Segan DB, ET Game, WE Watts, RR Stewart and Possingham, H.P. (2011). An interoperable decision
623 support tool for conservation planning. *Environmental Modelling and Software* 26, 1434-1441.

624 Vane-Wright, R.I., Humphries, C.J., and Williams, P.H. (1991). What to protect? – systematics and the
625 agony of choice. *Biological Conservation* 55, 235-254.

626 Watts, M.E., Ball, I.R., Stewart, R.S., Klein, C.J., Wilson, K., Steinback, C., Lourival, R., Kircher, L., and
627 Possingham, H.P., (2009). Marxan with zones: software for optimal conservation based land- and sea-
628 use zoning. *Environmental Modelling and Software* 24 (12), 1513-1521.

629 Weitzman M (1992). On diversity, *Quarterly Journal of Economics* 107, 363-405.

630 Weitzman M (1998). The Noah's Ark problem. *Econometrica* 66, 1279-1298.

631 White B., and Sadler, R. (2012). Optimal conservation investment for a biodiversity-rich agricultural
632 landscape. *Australian Journal of Agricultural and Resource Economics*, 56, 1-21

633 Wilson, K. A., J. Carwardine and Possingham, H.P. 2009. Setting Conservation Priorities. *Annals of the*
634 *New York Academy of Sciences The Year in Ecology and Conservation* 1162, 237–264.

635 Wilson, K. A., E. C. Underwood, S. A. Morrison, K. R. Klausmeyer, W. W. Murdoch, B. Reyers, G. Wardell-
636 Johnson, P. A. Marquet, P. W. Rundel, M. F. McBride, R. L. Pressey, M. Bode, J. M. Hoekstra, S. J.
637 Andelman, M. Looker, C. Rondinini, P. Kareiva, M. R. Shaw, and Possingham, H.P. (2007). Conserving
638 Biodiversity efficiently: What to do, Where and When. *PLoS Biology* 5, 1850-1861.

639

Table 1. Features of selected approaches to biodiversity prioritisation

Authors	Objective	Scale	Methods	Comments
Reserve selection Myers, 1988	Maximise retention of biodiversity	Global	Use criteria and data to find global hotspots	Potential supply only, no explicit costs. Expert input.
Margules, 1989	Maximise retention of biodiversity	Patch, region	Heuristic for minimum set of reserves	Potential supply only, no explicit costs. Databases needed
Mittermeier et al, 1999	Reserve selection	Global	Rank sites for their endemism /km ²	Potential supply only, no explicit costs. Databases needed
Possingham et al, 2000	Maximise retention of biodiversity	Patch, region	Rank sites using SDP, Marxan	Potential supply only, no explicit costs. Databases needed.
Moilanen et al, 2007	Maximise retention of biodiversity	Patch, region	Rank sites using Zonation	Potential supply, no explicit costs. Databases needed
Prescriptive costed prioritisation Weitzman, 1992	Efficient protection of diversity	National	Diversity theory	Prescriptive only
Metrick and Weitzman 1998	Most valuable species on Noahs Ark	National	Rank species by Benefit : Cost ratios	Benefits and Costs considered but not real projects
Wilson et al, 2007	Cost effective protection	17 ecoregions	Conservation Investment Framework	Benefits and costs recognised for planning, but not real actions
Polasky et al, 2008	Optimal choice of habitat	Patch	Benefits and Costs for each habitat patch	Benefits and costs recognised for planning
Perry, 2009	Maintain ecosystem functioning	National	Rank Ecosystems by their contribution	Ecosystem benefits and costs considered, but not real projects
Ranked costed projects Possingham et al, 2002	Select high output projects	Patch, national	Rank by Benefit : Cost ratios	Potential projects, proxies for benefits and costs. Expert input needed
Faith et al, 2003	Maximise gain in biodiversity persistence	Regional	Biodiversity Viability Analysis	Potential projects, species distribution and other databases needed
Joseph et al, 2009	Cost effective actions for species	Patch, national	Project Prioritisation Protocol	Real projects, considers B:C ratios. Expert input and databases
Carwardine et al, 2011	Cost effective effort selection	Patch, state	Rank actions by Benefit : Cost ratios	Real projects, considers B:C ratios. Needs expert input and databases
Contracted costed actions Hajkowicz, 2007	Optimisation of conservation actions	Patch, region	Linear programming	Real projects, recognises costs, uses proxies for benefits
White and Sadler, 2012	Optimal conservation investments	Patch, region	Conservation planning model	Real projects, models supply behaviour, and changes in condition