

# A Framework and Guidance for Integrating Climate Adaptation and Landscape Conservation Planning

*This document is the product of a collaboration of nationally recognized scientists and policy experts, and is intended to provide a description of the tools that can be used to implement and achieve a “climate-smart” **ecological assessment**. The general purpose of this document is to help resource planners identify areas that are important to allow plant and wildlife species (biodiversity) to adapt to a changing climate, independent of any social or economic factors that are associated with **conservation planning**. The intended audience of this document is the highly informed, technical practitioner who seeks to integrate climate-smart ecological assessments into **planning for land and water use**. Additional documents are available for other audiences interested in this work, such as policy-makers and high-level decision-makers.*

## Introduction

Debates about anthropogenic origins aside, scientific evidence demonstrates that the Earth’s climate is changing. Many species are responding to this changing climate by shifting their geographic ranges. In response to climate change, we should expect both an influx of new species to geographic locations and a concomitant loss of species that have historically thrived within those locations. The differential rates at which species will shift their ranges will also result in a reshuffling of species relationships, **ecological processes**, and related **ecosystem services**.

Can visitors still expect to see mountain goats in National Parks within the Rocky Mountains? What **invasive species** may arise inside **protected areas** or across the **landscape**? Which species are particularly sensitive to climate stresses because of their narrow range of thermal and hydrologic tolerances or because they are restricted to disappearing **habitats**? Do we need to protect potential areas that represent **refugia**? Do we need to identify and manage corridors that could facilitate movements, or is it sufficient to identify and attend to barriers to movement that are limiting species range shifts across a landscape or watershed?

Conservation planners are now faced with the challenge of developing and implementing assessments for land allocation that supports biodiversity conservation in the face of climate change. While many spatial approaches and datasets supporting assessments are available for **climate adaptation**, there is considerable confusion about which approaches are best to ensure that **biodiversity** is appropriately considered in planning for land and water use.

This document presents a framework—the Yale framework—that offers a menu of approaches appropriate for ecological assessments to support conservation planning in a changing climate. It is not a step-by-step “cookbook.” It does not replace existing approaches and it does not develop new approaches. Rather, it offers guidance on appropriate strategies for **climate-smart** ecological assessments and the tools to implement them. The intention is to help identify effective and scientifically defensible climate adaptation strategies based on the best current approaches to ecological

42 assessments, with the general purpose being to enhance the effectiveness of policy  
43 decisions related to biodiversity preservation, climate change adaptation, and compatible  
44 land use. This is not a conservation prioritization exercise, instead, once conservation goals  
45 and priorities have been identified, this framework is intended to provide guidance on  
46 what analyses to undertake when developing climate-smart conservation planning.

47 Climate-smart plans are applicable to a wide range of planning situations. At one end of the  
48 spectrum, plans of non-profit conservation organizations like The Nature Conservancy or  
49 plans for National Parks or wilderness areas, may focus entirely or nearly so on  
50 conservation. In many cases, natural resource agencies at the state and federal level are  
51 required to prepare plans that have multiple objectives, including extractive uses of  
52 resources such as grazing or timber harvest as well as more conservation-oriented  
53 objectives. At the other end of the spectrum, conservation objectives may play an  
54 important but minor role in land-use plans prepared for local governments. The Yale  
55 Framework should prove useful to some degree to planners and planning processes in all  
56 of these different contexts.

57 Key examples of how the Yale Framework might be useful include the identification of  
58 important wildlife habitat and corridors to assist in a more strategic placement of  
59 renewable energy sites, and the development of a portfolio of potential conservation lands  
60 that could be acquired in anticipation of future sea level rise or loss of existing habitat.

61 The Yale Framework is being developed by a science panel drawn from state and federal  
62 government agencies, universities, and from the for-profit and non-profit private sectors.

63 The members were chosen for diverse and complementary expertise. The thirteen  
64 members are:

- 65 • Paul Beier, Professor of Conservation Biology and Wildlife Ecology, Northern  
66 Arizona University School of Forestry
- 67 • Douglas (Sandy) Boyce, National Wildlife Ecologist, USDA Forest Service
- 68 • Jason Bulluck, National Heritage Information Manager, Virginia Department of  
69 Conservation and Recreation
- 70 • Craig Groves, Director of the Conservation Methods Team, The Nature Conservancy
- 71 • Kevin M. Johnston, Product Engineer, Environmental Systems Research Institute
- 72 • Mary Klein, President & CEO, NatureServe
- 73 • Gary Knight, Director, Florida Natural Areas Inventory
- 74 • Joshua Lawler, Associate Professor, University of Washington School of Forest  
75 Resources
- 76 • Kit Muller, Strategic Planner, Bureau of Land Management
- 77 • John Pierce, Chief Wildlife Scientist, Washington Department of Fish and Wildlife
- 78 • James Strittholt, President and Executive Director, Conservation Biology Institute
- 79 • David M. Theobald, Research Scientist and Assistant Professor, Colorado State  
80 University Department of Fish, Wildlife, and Conservation Biology
- 81 • Stephen C. Trombulak, Professor of Biology and Environmental Studies, Middlebury  
82 College

83  
84 Dr. Oswald Schmitz of the Yale School of Forestry and Environmental Studies is the project  
85 lead. William Singleton of Singleton Strategies LLC has worked with Dr. Schmitz to plan and  
86 oversee the process and help guide the Science Panel in its deliberations.

88

### 89 ***Objectives and Process***

90 The goals of the Science Panel are to: (1) recommend strategies and associated tools and  
91 data to conduct assessments for biodiversity conservation in an era of climate change; (2)  
92 develop a broad framework to identify important areas needed to conserve biodiversity in  
93 a changing climate; (3) evaluate the Framework by funding independent teams to apply the  
94 Framework and by inviting peer review.

95 Thus far, the Science Panel has spent approximately six months building consensus around  
96 assessment approaches and data that can be applied to a broad range of planning contexts.  
97 This effort led to a Framework comprised of a matrix (see Table 1 below) and associated  
98 narrative intended to provide guidance and advice on how best to navigate through the  
99 different approaches, tools, and data to conduct an appropriate ecological assessment.

100 The Yale Framework will be evaluated through a process of grants to regional mapping and  
101 analysis teams that reflect the wide diversity of planning needs and challenges across the  
102 United States. These teams will use the Framework guidelines to implement geospatial  
103 analysis approaches pertinent to their respective regional planning contexts and objectives.  
104 After implementing and evaluating the Yale Framework, these teams will then provide  
105 feedback on the utility of its guidelines and the strengths and weaknesses in relation to  
106 each team's specific approach, objectives, scales, and planning timeframe. Teams will also  
107 identify improvements to the guidelines that are delineated in the Yale Framework. During  
108 this time the Science Panel will continue to refine the Framework as input from outside  
109 experts and policy makers is sought through a peer review process (Box 2).

110 Following this evaluation period, the Yale Framework will be finalized based on products  
111 and feedback provided by mapping and analysis teams during the re-grant process to  
112 better enable its potential to overcome obstacles confronted in the critical steps of the  
113 planning process. Finally, a process will be recommended for improving the Framework  
114 over time. This process will identify new tools and approaches to be developed to address  
115 future conservation planning needs, and will determine the most critical datasets for  
116 frequent and ongoing updates.

117 The tested and refined Framework will then be made available to the wider community of  
118 government and private actors, in order to help integrate climate adaptation strategies into  
119 efforts to plan for land and water use at the federal, state, county, and private-sector levels  
120 throughout the United States.

### 121 **Framework Description**

122 The Framework is intended to offer coherence on appropriate application of myriad  
123 approaches, tools, and data when conducting climate smart ecological assessments. Its  
124 development was guided by **four** requirements. (1) The Framework should not be overly  
125 prescriptive. Stakeholders and potential users should be provided with a clear overview of  
126 the major steps in an ecological assessment intended to develop climate adaptation  
127 strategies. At the same time, it should present options rather than a single prescription. (2)  
128 Emphasis should be placed on assessment approaches that are, whenever possible, based  
129 on empirical data rather than modeled data, which tend to have greater certainties, or  
130 more robust to uncertainty. Where uncertainty does exist, it should be clearly identified.  
131 (3) Recognizing the large body of scientific literature on conservation planning to meet  
132 goals related to representation, species coverage, and maintenance of ecological functions  
133 under current conditions, the Framework should focus solely on practical steps to add  
134 climate adaptation to such conservation planning efforts. (4) The Framework should focus  
135 on **spatially explicit** strategies. Some climate adaptation strategies are not spatially  
136 explicit – examples include increasing connectivity, establishing new reserves, and expand  
137 existing reserves without specifying where those should be done. The Framework focuses  
138 on spatially explicit approaches to such conservation assessments.

139 The Framework is based on the Science Panel’s consensus about assessment approaches,  
140 tools and data that offer the greatest potential to provide insights about climate adaptation  
141 as a part of conservation planning in all terrestrial and aquatic **ecosystems**. The summary  
142 matrix (Table 1) provides an overview of six different adaptation objectives that one may  
143 employ in an assessment. This matrix is intended to encourage deliberate consideration of  
144 the different approaches and tools *prior to* conducting an assessment and to foster agility in  
145 their use during the assessment process. The information provided in the matrix is focused  
146 on guidance for identifying areas of importance for biodiversity in the face of climate  
147 change. At the same time, the Science Panel recognizes that most planning efforts at a  
148 landscape or watershed scale likely will consider other objectives and resource uses that  
149 influence the conservation and management of biodiversity and natural resources. For  
150 example, some lands and waters have multiple use objectives intended to benefit society at  
151 large, such as commercial development, road building, timber harvest, grazing  
152 management, energy development, and fisheries harvest . These activities have the  
153 potential to interact synergistically with environmental impacts related to climate change.  
154 And through habitat degradation, habitat loss, and fragmentation of landscapes and  
155 watersheds, these activities can, by themselves, result in losses of biodiversity that this  
156 framework is intended to abate and mitigate. More importantly, these sorts of land-use  
157 activities will often result in additional challenges to implementing the adaptation  
158 strategies outlined below. To the degree that these sorts of landscape and watershed  
159 stressors can be addressed in a landscape plan, the adaptation strategies outlined below  
160 will have a greater probability of succeeding.

161 Human communities are responding to climate change impacts in a number of ways that  
162 planners will need to confront. For example, sea walls and dikes are being established to  
163 combat sea-level rise, biofuels are being developed in part to reduce carbon emissions,  
164 communities surrounded by forests are being “fire-proofed” in response to increasing  
165 frequency and severity of climate-induced changes in wildfire regimes, and new dams and

166 reservoirs are being proposed in areas expected to experience long-term declines in  
 167 precipitation. Although it is beyond the scope of this framework to consider how  
 168 adaptation strategies may best be implemented in all of these varied circumstances, some  
 169 segments of the biodiversity conservation community are increasingly focused on  
 170 adaptation solutions that represent “win-win” scenarios for both ecological and human  
 171 communities. In many cases, using ecosystem-based solutions to reduce climate-related  
 172 hazards to humans reduce costs because they are less reliant on expensive and repeated  
 173 engineering and management interventions. Such solutions are referred to as Ecosystem-  
 174 based Adaptation under the auspices of the United Nations Convention on Biological  
 175 Diversity. Examples of these are highlighted below in the section of this framework on  
 176 consideration of adaptation objectives.

177 An important consideration for any landscape planning context in which human  
 178 communities are responding or need to respond to climate change is whether there is  
 179 sufficient adaptive capacity within the local communities. Two factors tend to shape the  
 180 adaptation responses of human communities: 1) the existing capacity of the affected community,  
 181 and 2) the level of information about projected climate impacts and potential ways to minimize and  
 182 adapt to those impacts. To the extent that use of the framework provides relevant information, it  
 183 contributes to the adaptive capacity of human communities.

184

185 Table 1. Overview of different combinations of adaptation objectives and levels of ecological analyses that  
 186 could be the focus of assessments of climate effects on biodiversity and habitat. Each cell of the matrix lists  
 187 examples of appropriate approaches one would use to carry out an assessment. There may be approaches  
 188 that we have not listed. Appendices are provided at the end of the document with detailed methodologies.

Adaptation Objectives:	Levels of Ecological Analysis		
	A. <u>Landscapes</u>	B. <u>Ecosystems</u>	C. <u>Species and populations</u>
1) Protect current patterns of biodiversity (baseline)	<ul style="list-style-type: none"> <li>• Map genetic patterns across the landscape</li> <li>• Map <b>beta and gamma diversity</b></li> <li>• Map <b>biodiversity hotspots</b></li> </ul>	<ul style="list-style-type: none"> <li>• Map terrestrial and aquatic ecosystems and their associated services</li> </ul>	<ul style="list-style-type: none"> <li>• Assess population sizes and dynamics and phenological trends, or use existing status assessments (e.g., conservation status ranks)</li> <li>• Map occurrences of rare species and plant communities</li> <li>• Map distributions of more common species</li> </ul>
2) Project future patterns of biodiversity	<ul style="list-style-type: none"> <li>• Forecast land-use change</li> <li>• Project sea-level rise</li> <li>• Analyze climate-change</li> </ul>	<ul style="list-style-type: none"> <li>• Forecast vulnerability of ecosystems to climate change</li> <li>• Map areas that would support shifts in vegetation</li> </ul>	<ul style="list-style-type: none"> <li>• Forecast vulnerability of species and rare communities to climate change based on their capacity to adapt to environmental change</li> <li>• Map areas that would</li> </ul>

	Levels of Ecological Analysis		
Adaptation Objectives:	A. <u>Landscapes</u>	B. <u>Ecosystems</u>	C. <u>Species and populations</u>
	projections <ul style="list-style-type: none"> <li>Map projected future biodiversity hotspots</li> </ul>	types and/or biomes	support shifts in species distributions of vulnerable and/or indicator species or community types
3) Maintain ecological processes	<ul style="list-style-type: none"> <li>Analyze projected precipitation and temperature trends</li> <li>Analyze projected extreme weather events</li> <li>Map fragmentation and other factors related to <b>ecological integrity</b> (e.g., distance from disturbance)</li> </ul>	<ul style="list-style-type: none"> <li>Map potential future patterns of fire, hydrology, carbon sequestration, and ecological integrity</li> <li>Map where ecosystem services operate and, thus, provide human value</li> </ul>	<ul style="list-style-type: none"> <li>Forecast how climate change factors may impact the viability of particular species populations or function of rare plant communities</li> <li>Forecast climate change effects on pests, diseases, and invasive species</li> <li>Forecast changes in animal behavior</li> <li>Forecast climate change effects in phenology</li> </ul>
4) Maintain and restore <b>ecological connectivity</b>	<ul style="list-style-type: none"> <li>Map connections between land facets, ecological land units, refugia, or areas of high ecological integrity</li> </ul>	<ul style="list-style-type: none"> <li>Map connections between current and projected future locations</li> <li>Anticipate species invasions along planned corridors</li> </ul>	<ul style="list-style-type: none"> <li>Identify areas that are critical for species movements in a changing climate</li> <li>Map movement corridors important for species life history and migration</li> </ul>
5) Protect climate refugia	<ul style="list-style-type: none"> <li>Map recent drought refugia</li> <li>Map areas of high topographic complexity</li> <li>Map locations projected to maintain stable climates</li> </ul>	<ul style="list-style-type: none"> <li>Map habitats with high natural resilience to climate change (e.g., spring-fed streams)</li> <li>Map areas projected to experience little change in vegetation</li> </ul>	<ul style="list-style-type: none"> <li>Identify areas that would continue to harbor species in the future or areas where populations would be stable or increase with climate change</li> </ul>
6) Protect the ecological stage (enduring features)	<ul style="list-style-type: none"> <li>Map ecological land units or land facets</li> <li>Map areas of high ecological integrity</li> </ul>	<ul style="list-style-type: none"> <li>Map ecological land units or land facets</li> <li>Map areas of high ecological integrity</li> <li>Map climate facets based on current</li> </ul>	N/A

	Levels of Ecological Analysis		
Adaptation Objectives:	A. <u>Landscapes</u>	B. <u>Ecosystems</u>	C. <u>Species and populations</u>
	<ul style="list-style-type: none"> <li>Map climate facets based on current climate patterns</li> </ul>	climate patterns	

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190 The matrix is organized according to three levels of ecological analysis (landscape;  
 191 ecosystems; and species and populations) that could be considered for each of six  
 192 adaptation objectives. This is based on the consensus that “climate-adaptive” conservation  
 193 plans should be geared toward conserving not only species and their habitats, but should  
 194 also ensure that ecological and evolutionary processes can continue to operate across  
 195 landscapes over the coming decades of climate change. By contrast, most assessments that  
 196 inform planning today continue to focus somewhat more narrowly on the upper-right  
 197 section of this matrix (i.e., they map current and/or future species geographic ranges).

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**Box 2: Regional case studies implementing and evaluating the Framework guidelines.**

**Climate change adaptation strategies for the Bureau of Land Management resource management in southern Nevada. (Nature Serve):** NatureServe will test several aspects of the Yale Framework by integrating and or downscaling assessment results from two BLM Rapid Ecoregional Assessments (REAs) with core recommendations from the Framework along the ecotone between the Central Great Basin and Mojave Desert Ecoregions. Results will be used to develop adaptation strategies for integration into state and field office planning by BLM Nevada to manage public land in a scientifically-defensible and effective way under rapid climate change conditions.

**Protecting the ecological stage: applying and testing a land-facet-based approach to conservation planning in a changing climate (University of Washington):** The University of Washington will explore the concept of protecting a diversity of abiotic conditions (land facets) as a means of protecting biodiversity in a changing climate. Research will be conducted across 14 ecoregions in the northwestern US and will result in mapped land facets that feed into an ongoing climate-change vulnerability assessment serving three state wildlife agencies, the National Park Service, and a regional conservation planning effort lead by The Nature Conservancy.

**Rapid Assessment of the Framework and adaption blueprint for the Pacific Coastal Rainforest (Geos Institute):** The **Geos Institute** will apply elements of the Yale Framework to Pacific coastal rainforests. Objectives are to: (1) compare baseline to future climate scenarios; (2) identify key processes likely to shift in response to climate change; and (3) identify relatively stable climatic areas that might function as microrefugia. Climate change models will be used to project potential shifts at regional, subregional, focal species, and microsite levels. The results will have application to forest planning, landscape conservation cooperatives of the US Fish & Wildlife Service, and high profile species.

**Box 2 (continued):**

**Re-evaluating Florida Ecological Conservation Priorities in the Face of Sea-level Rise (Florida Natural Areas Inventory & Florida State University):** **Florida Natural Areas Inventory & Florida State University** will incorporate a key element identified in the Yale Framework that is currently missing from Florida conservation planning—protecting the ecological stage. This project will evaluate habitat heterogeneity and available geophysical data to define the ecological stage in areas likely to be affected by sea-level rise by the end of this century. The resulting conservation value layer will be further refined to consider connectivity, habitat fragmentation, and ecological integrity, with results incorporated into ongoing statewide conservation planning efforts.

**From the mountains to the sea: applying the Yale framework in western Washington for holistic adaptation (EcoAdapt):** **EcoAdapt** will use the Framework to provide an integrated assessment of spatially explicit adaptation opportunities that address and link watershed function from terrestrial to freshwater to coastal systems in the Puget Sound Basin. The goal is to support climate savvy integrated watershed management action across ecosystem types.

**Comparing alternative approaches for predicting future habitat conditions and distribution patterns for two forest carnivores of conservation concern in the sierra Nevada, California (Conservation Biology Institute):** The **Conservation Biology Institute** has developed a project that compares and integrates alternative climate change analytical approaches at several spatial resolutions to address climate impacts on two rare forest-dependent carnivores – fisher (*Martes pennanti*) and marten (*M. americana caurina*). The integrated results on future habitat suitability for these two species will be used to advance our knowledge about how to best apply existing climate models and tools to support wildlife conservation, and will inform ongoing forest policy and management throughout the region.

201

202 ***A. General recommendations for an ecological assessment process that focuses on***  
203 ***climate change***

204 The following set of recommendations is predicated on the assumption that any  
205 assessment for biodiversity and climate adaptation has undertaken the normal preliminary  
206 steps to ensure that the assessment output will be aligned with the needs of planners.  
207 These steps include: understanding the goals and the information needs of the planning  
208 process; understanding how different stakeholder values are incorporated into the project  
209 plan; understanding the methodology and approaches used by planners in reaching  
210 decisions about land allocation for compatible uses; and understanding how stakeholder  
211 values are weighted in reaching final decisions about actions and how the final decision is  
212 reached. These general recommendations are:

213 (1) Assessments should be at a **resolution** that matches those at which decisions are made,  
214 and **spatial extent** should extend beyond the main jurisdictional area of interest, so that  
215 important ecological links to the larger landscape are considered. Given that climate  
216 change is likely to cause long-range movements by species, it will become increasingly  
217 important to conduct ecological assessments at spatial extents that represent entire  
218 **ecoregions**.

219 (2) More than just the species level of ecological analysis should be considered in  
220 assessments (hence the consideration of three levels of ecological analysis in Table 1).

221 (3) An assessment or prioritization for climate adaptation should be conducted for a 50 to  
222 100 year time horizon. The major effects of climate change are likely to occur within this  
223 time horizon, even if humans stopped emitting greenhouse gasses today. Climate change  
224 cannot reliably be predicted farther into the future. If resources and time permits, it is  
225 encouraged to conduct a temporally explicit trajectory analysis (e.g., 15, 30, 60, and 100  
226 years).

227 ***B. Consideration of adaptation objectives and levels of ecological analysis for the***  
228 ***assessment***

229 The Framework is built around the consideration of six major adaptation objectives for  
230 biodiversity conservation and climate adaptation and three levels of ecological analysis  
231 (see Table 1).

232 Users of the framework are encouraged to assess as many of the adaptation objectives and  
233 levels of ecological analysis as is feasible based on their planning context and the resources  
234 available. These objectives include:

235 1) *Protect current patterns of biodiversity*. This represents a baseline objective reflecting  
236 Aldo Leopold's admonition that "the first rule of intelligent tinkering is to keep all of the  
237 parts." Most plans will benefit from including this objective because it has the least  
238 uncertainty in the short term, and other adaptation strategies require it as a baseline  
239 state for future projections. The intent is to identify current patterns of biodiversity

240 across landscapes and reduce stressors as a way to increase the probability that key  
241 components of biodiversity (e.g., vulnerable species, habitat cores, and high value  
242 ecological processes) persist or improve into the future. This objective also recognizes  
243 that species within communities are interdependent with each other and may provide  
244 important ecological services through those interdependencies. For example, native  
245 insect pollinator species diversity may be a key determinant of the success of high-value  
246 fruit and vegetable farming, especially when commercial species of pollinators such as  
247 European honeybees are in short supply. Predator species may prevent prey population  
248 outbreaks thereby protecting ecosystems from damaging pests. Forest tree species  
249 within watersheds help to protect water quantity and quality.

250 2) *Forecast future patterns of biodiversity.* This adaptation strategy anticipates and  
251 protects the locations that will meet the habitat needs of biodiversity under future  
252 conditions. Many species and their habitats may respond to changing climate  
253 (especially temperature and hydrology) by undergoing shifts in their geographic  
254 ranges. Other climate-induced changes like sea-level rise or altered precipitation  
255 patterns may conflate these shifts in geographic ranges. Closely related to forecasting  
256 future patterns of biodiversity is the ability to forecast impacts of climate change such  
257 as sea-level rise and storm surges. Models and tools that make such predictions in  
258 combination with data on current patterns of biodiversity may help human  
259 communities develop plans that can capitalize on conserving ecosystems that provide  
260 natural solutions for reducing vulnerability.

261 3) *Maintain ecological processes.* This adaptation objective considers the functional roles of  
262 species and takes a more dynamic perspective than the previous two adaptation  
263 objectives. In addition, many ecological processes are not species-specific. Thus,  
264 processes such as fire and flooding, which have a strong biophysical component, also  
265 come into play. It also recognizes that species abundance and persistence may not  
266 simply be products of available habitat within an ecosystem, but that species may also  
267 be integral and active players determining how the ecosystem functions. Not only are  
268 ecosystems defined by their geographic location and spatial extent, they also reflect  
269 associated ecosystem services. For example, coastal ecosystems buffer coastlines from  
270 flooding and erosion during storm surges and upland forest in watersheds controlling  
271 surface runoff and erosion while reserving drinking water quality. Projects that focus on  
272 restoration of mangroves and coral reefs, for example, represent the “win-win” natural  
273 solutions to climate adaptation that help safeguard vulnerable human communities from  
274 storm surges and conserve and restore important ecological communities (see Ecosystem-  
275 based Adaptation in introductory section of this framework). The functions of such  
276 ecosystems are also maintained by food web interactions. Thus, conserving predators may be  
277 important not only to protect species with charismatic value but also to prevent loss of trees  
278 needed for watershed protection.

279 4) *Maintain and restore ecological connectivity.* This objective complements Adaptation  
280 Objective 2 by recognizing that species and their habitats could shift their distributions  
281 in response to climate change. It takes the further step to identify where that movement  
282 will likely take place across the landscape and accordingly identifies current and  
283 potential future travel routes and impediments (such as terrain, vegetation, human land

284 use, and geological barriers) to movement. The goal is to ensure that species will be  
285 able to reach new locations that can support their populations as climate changes.  
286 While increasing habitat connectivity to facilitate gene flow and decrease the incidence  
287 of local extinction is usually the focus of conservation efforts, climate change could also  
288 create corridors that reduce wildlife populations by increasing disease transmission,  
289 colonization of exotic species, or lead to non-analog communities.

290 5) *Protect climate refugia.* This adaptation objective recognizes that many species may  
291 have limited capacities to evolve tolerances at a rate that is commensurate with the rate  
292 of future climate change. Consequently, there are risks that species may become  
293 extirpated throughout parts of their geographic ranges. One way to prevent some of  
294 these losses is to identify and protect climate refugia. Refugia are effectively safe havens  
295 on the landscape that provide the diversity of habitats and stability needed to promote  
296 persistence of biodiversity as regional biotic and abiotic environmental conditions  
297 change. In essence, they are locations that biodiversity can retreat to, persist in, and can  
298 potentially expand from under changing climate.

299 6) *Protect the ecological stage.* This adaptation objective effectively identifies and protects  
300 the current variety of landscape topography, geology/soils and associated abiotic  
301 conditions (including temperature and moisture) needed to support diversity of species  
302 that have different thermal, moisture etc. requirements for survival.

303 Assessments frequently focus on a subset of the adaptation objectives. The choice of  
304 adaptation objectives should be steered by the biological characteristics of the species of  
305 concern (Box 3). For example, one may choose to conduct assessments that support the  
306 maintenance or restoration of ecological connectivity if one is dealing with species that are  
307 expected to undergo major shifts in geographic range in response to climate change  
308 (Adaptation Objective 4). One may choose to conduct assessments that identify parcels of  
309 land within a watershed or along a seacoast that will support biodiversity in the future as  
310 sea-level rises (Adaptation Objective 2). As a matter of sound practice, any assessment  
311 should be systematically motivated by a clear understanding and articulation of the  
312 conservation problem and associated ecological conditions *before* choosing the analysis  
313 approaches, tools, and data for the assessment. That is, let the conservation issue define  
314 what approaches, tools, and data are needed for the assessment. Oftentimes, assessments  
315 are driven by availability of data and tools rather than by clear problem definition, which  
316 can lead to assessment outcomes that will fail to meet the needs of planners.

317 **Box 3: Example questions that could help to identify the biological characteristics of species in order**  
318 **to choose an appropriate adaptation strategy and level of ecological analysis for a climate assessment.**

319 ***Identifying species needs***

320 What are the vegetation types a species needs? What does it use each type for?  
321 How much area does the species need to survive? Does the species require contiguous habitat, or can its  
322 habitat be fragmented? Does the species have specialized habitat or resource requirements? What are the  
323 ecological conditions a species desires? Are those conditions provided (will they be provided) on the  
324 landscape? What is the relative importance of each condition. Does the species undergo source/sink  
325 population dynamics? Does the species have different needs for different seasons? Is the species social? How  
326 does the species interact with humans or human-built environments? If the species is a predator, is its prey

327 also being protected? Is the species competing with invasive species? If considering multiple species, what  
328 things do the species have in common? What do they have that are unique?

329  
330 ***Identifying the nature of species movement***

331 Does the species migrate or disperse seasonally? How far does the species travel in a year? What is the yearly  
332 movement pattern like? Do the criteria for identifying the best ecological conditions for movement  
333 complement the criteria for identifying the best conditions for feeding and reproducing?

334  
335 ***Things to consider relative to climate change***

336 How tolerant to heat or drought is the species? How does the species respond to changes in abiotic conditions  
337 like rainfall, snowfall, flooding etc.? How does the species fare at different elevations?

338

339 Once the adaptation objectives are chosen, the assessment can proceed with any of three  
340 levels of ecological analysis:

341 A. *Landscape level*. This level recognizes that there are important patterns across  
342 landscapes that are determined by a combination of geographical features such a  
343 topography and soils (land facets and ecological land units), as well as by the degree to  
344 which species assort themselves into communities.

345 B. *Ecosystem level*. This level recognizes that species and their habitats are components of  
346 ecosystems and, as such, species influence ecological processes that provide services to  
347 humankind and habitat for other species. This level begins to consider biodiversity in  
348 terms of its functional role and associated services in addition to more classical  
349 preservation values.

350 C. *Species, population, and highly restricted plant community level*. This level targets  
351 species or populations of conservation concern. For greatest efficiency, an assessment  
352 should only develop species-specific information for those species that are not  
353 adequately assessed at the ecosystem level either because they are rare, or have very  
354 specific or limited habitat requirements. Some plant communities with limited  
355 distributions and a small spatial footprint (e.g., fens) are usually better handled at this  
356 level. Assessments can be geared to understand current and future species distributions  
357 as well as population dynamics and movement patterns.

358 Ideally, assessments should be conducted for all three levels of analysis in order to be  
359 ecologically complete. However, this may not be feasible because of limitations imposed by  
360 available data or cost, or may not be desired because of stakeholder values and planning  
361 information needs. Nevertheless, it is recommended that assessments that focus on one  
362 level of analysis at least be placed into the context of the next higher level. For example,  
363 planners may only wish to understand the fate of focal species (e.g., desert tortoise, prairie  
364 chickens, sage grouse, pikas) under climate change. But considering the community context  
365 for these species' distributions (e.g., the species' food and habitat) would strengthen the  
366 species level assessment by providing insights about the fate of important resources  
367 supporting the species. Regardless, the approaches, tools, and data used to conduct  
368 assessments will differ between the levels of ecological analysis.

369 ***C. Navigating the assessment approaches and tools***

370 The matrix (Table 1) is structured to provide a systematic way to arrive at an appropriate  
371 assessment approach and related tools. The first step is to select the desired adaptation  
372 objectives. Once the user has selected the appropriate adaptation objectives, he/she would  
373 select the desired level of ecological analyses. Most planning projects, unless they cover a  
374 very small spatial extent, will benefit from addressing all three levels of ecological analysis.

### 375 **1) Protect current patterns of biodiversity**

376 **A. Landscape level:** The landscape-level assessment aims to identify extant patterns of  
377 species and ecosystem distributions across large areas. This assessment can build on  
378 information gathered for the species and populations level by generating maps that present  
379 the aggregate of individual species distributions (i.e., provide a composite map built on  
380 individual species data layers). This composite map can be used to delineate biodiversity  
381 hotspots or quantify changes in the number and identity of species across a landscape.

382 **B. Ecosystem level:** Ecosystems – recognizable and consistent patterns of vegetation – are  
383 typically differentiated through a statistical analysis of abiotic features (e.g., soils) and  
384 vegetation observations via satellite and/or vegetation plots sampled in the field. Because a  
385 wealth of existing spatial data in this category is readily available (e.g., LANDFIRE, GAP  
386 vegetation maps, NatureServe ecosystem maps), most users can avoid developing their  
387 own classification systems and maps. A more efficient process is to use existing data on  
388 ecosystems in the focal planning jurisdiction and the surrounding landscape. Ecosystems  
389 often form the basis for evaluating potential mitigation sites, especially for wetlands.

390  
391 A list of widely-used datasets portraying current ecosystems is provided in Appendix 3.

392  
393 Building an accompanying data layer that identifies the major plant and animal species that  
394 comprise the community belonging to the suite of ecosystems within the planning area can  
395 enhance an appreciation of the level of biodiversity contained within it. Ecosystem maps  
396 can also provide an important foundation for understanding ecological processes and their  
397 associated ecosystem services, if those are also part of the assessment objectives.

398  
399 **C. Species, population, and highly restricted plant community level:** Assessments at this  
400 level typically focus on delineating the current geographic ranges of species and highly  
401 restricted vegetation communities such as fens. Mapped information is typically based on  
402 geo-referenced data and insights on species presence gathered during scientific surveys  
403 and through the opinions of experts (e.g., natural heritage element occurrences, USGS-GAP  
404 distribution models, state wildlife agency maps). Because a wealth of existing spatial data is  
405 available in this category, most users can avoid creating their own distribution maps. A  
406 more efficient process is to establish priorities for which species to assess, then use existing  
407 distribution data to visualize the current situation or as input for predicting future  
408 distributions.

409  
410 A list of widely-used datasets portraying current distributions for species and highly-  
411 restricted habitats is provided in Appendix 3.

412

413 If adequate data on current distributions are not already available for the planning area,  
414 there are a wide range of approaches and tools that quantify species geographic  
415 distributions, ranging from statistical regression that relates environmental variables and  
416 species presence and absence at particular geographic coordinates, to models and  
417 algorithms that quantify likelihoods of occurrence across a landscape. An overview of each  
418 of these approaches and tools, their data requirements, their strengths and weaknesses,  
419 and the required technical capacity of the user is provided in Appendix 1.

420  
421 The species-level assessment may be enhanced to provide a more dynamic representation  
422 of current conditions by using population abundance and demographic data to estimate  
423 species or population viability. Population viability can be estimated for the landscape as a  
424 whole or in relation to different plant communities or land uses. This approach is often  
425 limited by the availability of spatially explicit data on population demography (e.g., age and  
426 sex structure, age-specific birth and death rates, migration rates, etc.) and abundance.  
427

## 428 **2) Forecast future patterns of biodiversity**

429 **A. Landscape level:** The landscape-level assessment aims to identify future patterns in  
430 landscape conditions. An assessment can examine changes in biophysical conditions (e.g.,  
431 sea level rise, changes in precipitation patterns) using outputs from climate assessments  
432 like the IPCC. They can also build on information gathered for the species and populations  
433 level by generating maps that present the future aggregate of individual species  
434 distributions (i.e., provide a composite map built on individual species data layers). This  
435 composite map can be used to delineate biodiversity hotspots or quantify changes in the  
436 number and identity of species across landscapes.

437 **B. Ecosystem level:** Assessments at this level aim to forecast future locations of plant  
438 communities. They employ modeling approaches that can map the geographic distribution  
439 of vegetation based on biophysical processes (e.g., nutrient cycling, moisture patterns, fire  
440 regimes). The models can project potential future locations of vegetation using biophysical  
441 data from global climate models such as those used in the IPCC process.

442 **C. Species, population, and highly restricted plant community level:** Assessments of  
443 future conditions involve models to forecast the geographic distribution and fate of species.  
444 These assessments use climate data generated by a host of different global climate models  
445 that each address different assumptions about future CO<sub>2</sub> emissions (summarized in IPCC  
446 Assessment Reports:  
447 [http://www.ipcc.ch/publications\\_and\\_data/publications\\_and\\_data.shtml](http://www.ipcc.ch/publications_and_data/publications_and_data.shtml)).

448 Two basic modeling approaches – both representing types of correlative bioclimatic  
449 envelope models – have been used to forecast the potential effects of climate change on  
450 species distributions: correlative models and mechanistic models. Correlative models  
451 generally link the current distributions of species with current climate using statistical  
452 models or machine-learning techniques. These models are often called species distribution  
453 models, niche models, climate-envelope models, and more generally, bioclimatic models.  
454 Mechanistic models attempt to simulate the distribution of a species based on understood

455 mechanisms (e.g., moisture requirements, competitive interactions, experimentally-  
456 derived temperature tolerances). Theoretically, mechanistic models should be more  
457 robust for the purpose of projecting potential climate-change impacts; however, the data to  
458 build such models is often lacking. Substantial uncertainties are associated with both  
459 approaches due to uncertainties in the climate-change projections as well as in the  
460 empirical and theoretical relationships upon which the models are founded. Nonetheless,  
461 these models have been shown to capture recent range shifts for some species and provide  
462 projections that correspond with expected shifts in species distributions.

463 It is important to be mindful when using any of these approaches that future projections  
464 will be based on statistical associations, so that they cannot be used to infer cause-effect  
465 relationships. This is a limitation of any current approach to assess future consequences of  
466 climate change. Global climate models are built on uncertainties about the likelihood of  
467 different CO<sub>2</sub> emissions scenarios, as well as how different atmospheric CO<sub>2</sub> levels affect  
468 the climate system and the biophysical conditions determined by climate. Moreover, future  
469 projections based on statistical associations are inherently dependent upon the underlying  
470 assumptions of the specific model used to generate the climate and vegetation data.  
471 Consequently, decision-makers should be reluctant to use assessments based on data from  
472 a single global climate model if small changes in assumptions of any one model produce  
473 radically different projections about the future. It is therefore recommended that any of  
474 the above assessments should be repeated using input data that bracket the range of  
475 climate sensitivity projected by different global climate models. That is, it is recommended  
476 that assessments consider using worst-case change scenarios, average-change scenarios  
477 and minimal-change scenarios.

### 478 **3) Maintain ecological processes**

479 **A. Landscape level:** An assessment at this level of analysis aims to understand how  
480 biophysical gradients could change across landscapes. This involves mapping current and  
481 potential future climate patterns. Future climate gradients and spatial patterns in climate  
482 variability can be mapped using data from global climate models. Mapping climate  
483 patterns, especially temperature and precipitation gradients, represents a way to predict  
484 shifts in climate zones (e.g., plant hardiness zones, Holdridge life zones). These shifting  
485 climate zones can help predict distribution the distribution of species with varying climatic  
486 needs and tolerances. These changes may also stress large areas, creating the potential for  
487 catastrophic change. In addition, mapping the degree of variability in temperature and  
488 precipitation can be used to identify areas of potential climate stability across the  
489 landscape that can help to inform assessment 5 below.

490  
491 **B. Ecosystem level:** Climate warming stands to reorganize communities and associated  
492 ecosystems across landscapes through species losses and gains, as well as differential rates  
493 of movement. This process of community disassembly and reassembly also means that  
494 assessment approaches may need to examine collections of species more directly and  
495 explicitly and determine how changing species composition influences ecological  
496 processes.

497 Assessments at this level can also draw on projected shifts in the distribution of plant  
498 communities. Similar to the modeling of species distributions, both mechanistic and  
499 correlative models have been used to model shifts in the distribution of suites of plant  
500 species. In general, correlative models project changes in the areas that are climatically  
501 suitable for today's flora, although some take into account dispersal abilities as well.  
502 Mechanistic models include dynamic global vegetation models, forest gap models, and  
503 other approaches that simulate vegetation growth and competition and provide projections  
504 of how general vegetation types will likely change with changes in climate.

505 Assessments at this level of analysis may determine how changing biophysical conditions  
506 affect the components of ecosystems that drive processes (e.g., increase in fuel for fires,  
507 change in canopy cover, increase in nutrient loading, etc.). Climate warming is expected to  
508 alter chemical and biophysical conditions of ecosystems. Thus, mapping the spatial extent  
509 of biophysical change offers insight about the level that different areas of an ecosystem  
510 might be impacted. For example, sea-level rise is expected to cause the loss of habitat for  
511 coastal and estuarine species. Mapping the extent and topographic height of sea-level rise  
512 can inform which areas might be affected. Also, one could model and map change to  
513 ecological processes. Many ecosystem services (e.g., primary production, provisioning of  
514 freshwater) are dependent upon biophysical conditions like temperature, rainfall, and  
515 snowpack, which will be altered by climate change. Spatial data for these biophysical  
516 conditions can be obtained from global climate change models. These data can be used as  
517 inputs to process based models (e.g., models of primary production and hydrological flow)  
518 in order to provide spatially explicit projections of changes in the levels of ecosystem  
519 services.

520

521 Mapping ecosystem services provides important complementary insights about the value  
522 of a land area and water sources to the welfare of humans. In as much as plant and wildlife  
523 species provide these services, such a mapping approach provides a way to articulate  
524 important human dependencies on plant and wildlife species. For example, a grassland and  
525 associated riverine ecosystem that together comprise a watershed could provide several  
526 important services, including forage production for cattle and native ungulates, carbon  
527 sequestration, and water provisioning. Understanding of the rates at which these services  
528 are provisioned across the landscape can be developed using combinations of measured  
529 and modeled data. Measured data might include stream flow, primary production of  
530 different grassland plant species, and soil carbon levels. Modeled data may come from  
531 processed-based modeling of soil carbon sequestration rate based on primary production  
532 and plant species data or changes in stream flows based on hydrological modeling. Such  
533 data can provide a spatial representation of different levels of the services within the  
534 ecosystem. One can further illuminate the link between the provisioning of services and  
535 human dependency by mapping the locations of service beneficiaries (e.g., locations of  
536 ranches or agricultural communities) across the landscape.

537 ***C. Species, population, and highly restricted plant community level:*** An assessment at  
538 this level of analysis requires data on species attributes such as behavior in relation to  
539 climate, population demography (e.g., birth and death rates, migration) in relation to  
540 climatic conditions, and the timing of life-cycle events in relation to climatic conditions.

541 These data can then be used in combination with mathematical models to project how  
542 changing climatic conditions and species relationships will influence movement behavior  
543 or population growth. The degree of population growth can then be mapped in relation to  
544 climate gradients expected on landscapes under future climate change. This kind of  
545 analysis will likely not be feasible for many species because vital data on species behavior  
546 and demography in relation to climate are currently unavailable.

#### 547 **4) Maintain and restore ecological connectivity**

548 **A. Landscape level:** Given that animal and plant species are expected to shift their  
549 geographic ranges in response to changing climate, we recommend that assessments also  
550 explicitly identify land facets or ecological land units, refugia, and/or areas of high  
551 ecological integrity, and then map connections among these areas using circuit theory or  
552 graph theory models (see Appendix 2).

553 **B. Ecosystem level:** Climate warming stands to reorganize communities and associated  
554 ecosystems across landscapes because species existing within a community will not all  
555 respond in the same way to this stressor. Some species may tolerate changes in particular  
556 climatic conditions, while others may shift their geographic ranges—although they may not  
557 necessarily move in identical directions.

558 Assessments for this level of analysis aim to determine where the habitats for species will  
559 move and identify important conduits on the landscape that facilitate such movement. Such  
560 assessments can build on insights gained from the ecosystem assessment for Adaptation  
561 Objective 2. Essentially, one uses maps of current and future vegetation in conjunction  
562 with movement models applied to a variety of species.

563 **C. Species, population, and highly restricted plant community level:** An assessment  
564 approach at this level aims to identify areas or features of landscapes that are important for  
565 species movement across landscapes in order to maintain viable populations and gene flow  
566 in the face of climate change. A variety of approaches and tools are available to conduct  
567 such analyses. An overview of each of these approaches and tools, their data requirements,  
568 their strengths and weaknesses, and the required technical capacity of the user is provided  
569 in Appendix 2.

570 These approaches essentially identify or simulate potential movement pathways for  
571 species across a landscape using data on biophysical attributes of the landscape (such as  
572 terrain, vegetation, land use, geological barrier, etc.) in conjunction with data on species  
573 habitat needs. This approach estimates the relative ease of travel, in terms of relative  
574 resistance to or cost of travel between two locations. The input data of physical geographic  
575 characteristics and species-specific habitat requirements may be highly certain, but the  
576 output, or least-cost path, may be highly uncertain unless it is validated through monitoring  
577 of species movements.

578 The approaches can be extended to identify areas needed to facilitate future movement in  
579 response to climate change by using existing landscape features combined with data on  
580 changes in landscape attributes derived from assessment at the ecosystem level of analysis  
581 for Adaptation Objective 2. This kind of assessment can help to inform how species might

582 move through the landscape beyond their current distribution. One can also use predicted  
583 shifts in species distributions to map corridors and connections.

## 584 **5) Protect climate refugia**

585 **A. Landscape level:** Landscape level assessments of refugia can be mapped in several ways.  
586 One could map places associated with Pleistocene climate refugia. Pleistocene refugia are  
587 landscape units that, due to topographic features, enabled species to survive glaciation  
588 processes. These are also locations from where modern species expanded their ranges  
589 when the glaciers receded. Thus, they represent locations of potential evolutionary origin  
590 of many modern plant and animal taxa. One could map areas of high physiographic or  
591 topographic complexity. Studies have shown that areas with a high degree of variability in  
592 landscape topography and geology/soils have associated variability in climatic conditions  
593 (especially temperature and moisture) that then supports a diversity of species that have  
594 different thermal and moisture requirements for survival.

595  
596 **B. Ecosystem level:** An assessment at this level focuses on identifying ecosystems that  
597 provide environmental conditions that are expected to undergo limited change under  
598 climate warming. These could be areas that are expected to have little change in vegetation,  
599 as determined by the kinds of vegetation assessments described above. They may also  
600 involve identifying and mapping geographic locations that are expected to undergo limited  
601 changes in biophysical conditions as determined by climate models.

602  
603 **C. Species, population, and highly restricted plant community level:** Many species may  
604 have limited capacities to evolve tolerances to changing climate at a rate that is  
605 commensurate with the rate of future climate change. Consequently, such species may  
606 become extirpated in large parts of their geographic ranges. One way to prevent some of  
607 these potential losses is to identify and protect climate refugia. Refugia are effectively safe  
608 havens on the landscape that provide the diversity of habitats and stability needed to  
609 ensure species persistence as regional biotic and abiotic environmental conditions change.  
610 In essence, they are places that species can retreat to, persist in, and can potentially expand  
611 from under changing environmental conditions. Places that served as refugia during past  
612 climatic shifts offer good chances for survival under future climate change for many species  
613 because they are locations that have facilitated the survival of species under changing  
614 environmental conditions for millennia, thus making their identification important for  
615 conservation.

616 An assessment at this level involves identifying areas that will likely be suitable for species  
617 into the future or areas where species may be able to move to as climates change. Such  
618 species-specific assessments will likely rely on the models and approaches used to project  
619 the responses of species and populations to changes in climate. These models may allow  
620 researchers to identify areas that will continue to have suitable climates for a given species  
621 into the future.

## 622 **6) Protect the ecological stage**

623 **A. Landscape level:** Protecting the ecological stage could allow biodiversity to maintain its  
624 evolutionary potential. Assessments for this adaptation strategy are conducted exclusively  
625 at the landscape level. The aim is to identify and map current land facets or ecological land  
626 units and areas of high ecological integrity. The approach effectively provides a broader  
627 representation of fixed landscape features than landscape level assessments for Adaptation  
628 Objective 5.

629

630 **Data Needs**

631 A list of databases and their web links is provided in Appendix 3.

632 **Analysis and Synthesis**

633 Any assessment will invariably have the potential to produce numerous maps and data.  
634 This information needs to be synthesized in ways that can help inform planners about  
635 needs of and risks to biodiversity under potential changing climate. Given the uncertainty  
636 on how species and ecosystems may respond to climate change, we provide a solid  
637 approach for conservation planners to move forward by applying the Framework in  
638 combination with adaptive management and carefully developed monitoring programs.

639 At a minimum, maps may need to be combined as data layers. But the combined maps may  
640 need to be interpreted using statistics or indices.

641 Below we provide a short list of common ways to combine multiple maps together, though  
642 there are a variety of additional ways to do this. However, the following principles should  
643 be followed (largely drawn from Schultz 2001):

- 644 1. Normalize or standardize the values (e.g., 0.0 → 1.0, -1 to 1, or 0 to 100), and  
645 examine the distribution of values for each factor
- 646 2. Be clear what data type is represented by the various factors -- interval and ratio  
647 types can be averaged using various statistics (e.g., mean, geometric mean), but  
648 nominal (classes) data should be combined using logical rules.
- 649 3. Specify whether the individual factors are exclusive or compensatory.
- 650 4. Integrate based on empirically-based model. Develop a regression-based model  
651 using empirical data to estimate the weighting factors.
- 652 5. Integrate using ecological process. Combine factors based on the dominate  
653 ecological processes, based on a conceptual model. For example, three main  
654 factors control riparian dynamics: longitudinal hydrologic regime, upland  
655 watershed sedimentation, and lateral constraints imposed by land uses in the  
656 valley bottom.
- 657 6. Using multi-criteria analysis. Factors are often combined using weighted  
658 additive (or product) overlays, where the weights sum to 1.0. Weights should be  
659 developed and specified prior to producing an output map to avoid potential  
660 “tweaking” of weights to get a desired pattern. Rather, a formal process such as  
661 Delphi or Analytical Hierarchy Process (Saaty 1980) should be used to specify  
662 the weights, using a measure of internal logical consistency. Marxan with Zones  
663 (Watts et al. 2009) and Zonation (Moilanen 2007) are examples of widely-used  
664 tools in conservation that can help land-use planners achieve a range of social  
665 and conservation objectives.
- 666 7. Optimization. By specifying an objective function, apply an optimization  
667 algorithm (e.g., heuristic, linear programming, simulated annealing, genetic  
668 algorithm, etc.) to identify the optimal (or near optimal) solution.
- 669 8. Scenarios. Scenario planning develops a series of alternatives that are expressed

670 in terms of logical, explicit assumptions about future system conditions, and uses  
671 a series of indicators to compare across them. Web mapping tools such as  
672 *Coastal Resilience* (<http://coastalresilience.org>) can compare the social,  
673 economic, and ecological conditions under future coastal hazard scenarios,  
674 thereby providing stakeholders and decision-makers with information they can  
675 utilize in their local planning processes.

676 9.

677

678 Assessments that aim to project future conditions should conduct analyses that quantify  
679 the degree to which future projections change with changes in model assumptions or  
680 parameter values. These analyses can take two forms. The first is called uncertainty  
681 analysis; the second is called sensitivity analysis.

682

683 *Uncertainty analysis.* This involves scenario-generating simulation exercises using data  
684 outputs from several different global climate models that are built on different sets of  
685 assumptions. Such an analysis can boost confidence if projections of species range shifts  
686 based on data from different models are congruent. Moreover, the degree to which the  
687 data from the global climate models produce congruent projections (i.e., the quantitative  
688 variation in spatial extent of range shifts produced by different models) can help to infer  
689 whether or not a future outcome is more or less likely.

690

691 *Sensitivity analysis:* This involves systematically changing assumptions or parameter  
692 values in a single global change model to generate new sets of environmental data. It then  
693 uses those data sets to determine which assumptions or parameters produce the greatest  
694 change in projections for the future. Assumptions or parameters that lead to large changes  
695 in projections are said to be more sensitive than assumptions or parameters that produce  
696 less change.

697

## 698 **Summary**

699

700 The work of the Science Panel has produced, for the first time, a Framework that provides  
701 systematic and comprehensive guidance on the choice and application of climate  
702 adaptation objectives and assessment strategies for protecting biodiversity in an era of  
703 climate change. The utility of the Framework must still be assessed and such assessment  
704 will likely lead to refinements. With such refinements, the goal is to disseminate a state-of-  
705 the-art Framework that facilitates the integration of climate smart adaptation strategies for  
706 biodiversity conservation into efforts to plan for land and water use at the federal, state,  
707 county, and private-sector levels throughout the United States.

708

709 Questions and comments should be directed to:

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710

## 711 **Glossary**

712 **Adaptive Capacity:** the ability of a system (including natural and human systems and  
713 communities) to adjust to climate change including climate variability and extremes to moderate potential  
714 damages, to take advantage of opportunities, or to cope with consequences

715 **Analytical unit** – The area unit of analysis or description used for an **ecological**  
716 **assessment** (e.g., watersheds, ownership parcels, or regular polygon array). These units  
717 typically are intermediate in size between the **spatial resolution** of a map and the **extent**  
718 of the entire assessment area. For example, the spatial resolution of land use/land cover  
719 data for an ecological assessment of a state might be 30 x 30 m, but the analysis of those  
720 data and how they are ultimately described and reported might be done only at the level of  
721 watersheds.

722 **Beta diversity** – The change in species composition between ecosystems or along an  
723 ecosystem gradient.

724 **Biodiversity** – Life in all of its forms – plants, animals, fungi, and microbes – and at all  
725 levels of organization from the organism to **ecosystems** and **landscapes**.

726 **Biodiversity hotspots** – Geographic locations with high numbers of species.

727 **Climate adaptation strategies** – Strategies to adjust to or cope with the social and  
728 ecological changes caused by climate change. Such strategies are intended to moderate the  
729 harm caused by climate change or to take advantage of resulting beneficial opportunities.

730 **Climate-smart** – Policies and practices that incorporate consideration of the effects of  
731 climate change with respect to both mitigation and adaptation.

732 **Connectivity** – see **Ecological connectivity**.

733 **Conservation plan** – A description of a proposed course of action intended to achieve one  
734 or more conservation goals. Optimally, such plans are the result of a planning process that  
735 specifies ecological features – such as species, ecosystems, or such geophysical elements as  
736 **land facets** or **ecological land units** – that are the focus of conservation efforts, identifies  
737 important places to protect those features and threats to them, and describes specific  
738 strategies to be taken to achieve the conservation goals (Groves et al. 2002). Conservation  
739 plans can be developed by any number of planning processes, such as **systematic**  
740 **conservation planning**, but at a minimum should involve detailed **ecological**  
741 **assessments** so that the full scope of current and projected ecological conditions can be  
742 taken into account as plans are developed.

743 **Conservation target** – A concept central to conservation planning. The term  
744 “conservation target” is used in two distinct but related ways in different conservation  
745 planning processes. One process, developed by The Nature Conservancy, uses the term

746 conservation target to refer to an ecological feature – such as a species, ecosystem, or  
747 **ecological land unit** – that is part of an **ecological assessment** or **conservation plan**.  
748 The other process, characterized by most decision support tools for **systematic**  
749 **conservation planning**, uses the term conservation target to refer to the minimum  
750 number or amount of an ecological feature that is considered acceptable for a preferred  
751 conservation plan. Thus, conservation target can refer to either the minimum amount of a  
752 feature or the feature itself.

753 **Ecological assessment** – An ecological assessment identifies important patterns and  
754 trends of ecological features, which provide foundational information on which  
755 conservation objectives and strategies would be most effective to implement. Assessments  
756 can be accomplished both by direct field measurements and predictive modeling, through  
757 which responses of ecosystems to human-induced changes can be more fully understood  
758 and management options developed.

759 **Ecological connectivity** – The degree to which a landscape facilitates movement among  
760 resource patches, from ecological to evolutionary time scales (Taylor et al. 1993). Two  
761 types of connectivity can be assessed. First, structural connectivity measures the spatial  
762 arrangement of different types of habitat or ecological systems in a landscape without  
763 reference to the likelihood of movement of particular organisms through the landscape.  
764 Second, functional connectivity incorporates at least some aspects of the behavioral  
765 response of individuals, species, or ecological processes to the physical structure of the  
766 landscape (Baudry & Merriam 1988; Crooks & Sanjayan 2006).

767 **Ecological integrity** – The ability of an ecosystem to maintain an assemblage of organisms  
768 that has a composition, structure, and function that is comparable to that of natural  
769 conditions in the region.

770 **Ecological land units** – A characterization of locations based on topography, elevation, and  
771 bedrock geology. This concept is similar to **land facets**.

772 **Ecological processes** – The dynamic actions and interactions that place within any level of  
773 biological organization. Ecological processes of interest to conservation planners can take  
774 place at the species level, such as predation and pollination, or at the ecosystem and  
775 landscape levels, such as nutrient cycling and moderation of hydrological flow. This  
776 concept is the same as ecological functions.

777 **Ecoregion** – A large area within which suites of specific **ecosystems** reoccur in a frequent  
778 or predictable pattern.

779 **Ecosystem** – A community of organisms and the abiotic components that affect or  
780 exchange materials with the organisms.

781 **Ecosystem-based Adaptation**: the use of biodiversity and ecosystem services as part of an overall  
782 adaptation strategy to help people to adapt to the adverse effects of climate change. Ecosystem-based

783 adaptation uses the range of opportunities for the sustainable management, conservation, and restoration  
784 of ecosystems to provide services that enable people to adapt to the impacts of climate change.

785 **Ecosystem services – Ecological processes** perceived in terms that relate directly to  
786 human values and benefits. For example, the ecological process of pollination is related to  
787 the ecosystem service of pollination of agricultural crops, and the process of moderating  
788 hydrological flow relates to the service of reducing flooding and the loss of property.

789 **Enduring features** – Geological and geographical characteristics of the environment that  
790 are not likely to change quickly as a result of climate change, such as soil type, elevation,  
791 and aspect.

792 **Extent** – Extent can be used to describe either spatial (or area) extent or temporal (or  
793 time) extent. Spatial extent is the region on the Earth's surface that is the focus of an  
794 **ecological assessment** or **conservation plan**. It is often represented as a defined  
795 rectangle just large enough to include all mapped features that are of interest, but it can  
796 also be defined by a political boundary (e.g., state) or ecological region (e.g., Southern  
797 Rockies ecoregion). Temporal extent is the duration of time a plan or assessment is  
798 concerned with, which generally must take into account the duration of important or  
799 relevant ecological processes.

800 **Gamma diversity** – The total diversity of species across a large region or within a large  
801 **landscape**. It is a function both of the diversity of species at each location within the  
802 landscape (alpha diversity) and the diversity across ecosystems within the landscape (**beta**  
803 **diversity**).

804 **Habitat** – The area occupied by a species and/or the biophysical conditions needed to  
805 support a species.

806 **Intensity** – The precision or level of differentiation of values that are depicted on a map –  
807 such as the number of land cover classes that are contained in a dataset (e.g., 7 classes vs.  
808 21 classes).

809 **Invasive species** – An exotic species (one that is present at a location through human  
810 action) that causes ecological or economic harm.

811 **Land facets** – A characterization of locations typically based on elevation, topography, and  
812 soil characteristics (Wessels et al. 1999, Beier and Brost 2010). This concept is similar to  
813 **ecological land units**.

814 **Landscape** – A central concept to describing geographic regions that are the focus of  
815 **ecological assessments** or **conservation plans**. Some authors use the term to refer to a  
816 mosaic of ecosystems, although most use the term simply to represent a large expanse of  
817 land and water.  
818

819 **Map scale** – The ratio of a distance on the map to the corresponding distance on the  
820 ground. A large-scale map (e.g. 1:24,000) shows greater detail because the scale is a larger  
821 fraction than that of a small-scale map (e.g. 1:250,000). The concept of map scale differs  
822 from **spatial scale**, which describes altogether different characteristics of a mapped area.  
823  
824

825 **Minimum mapping unit (MMU)** – This is the size of the smallest feature that (a) can be  
826 mapped at a given map scale or (b) is selected to be displayed on a given map. An example  
827 of the former is that of land use/land cover maps created from satellite-based remote-  
828 sensing technology, where the smallest area that can be characterized, and therefore can be  
829 uniquely described on a map, is 30 x 30 m. An example of the latter is the choice to display  
830 major roads but not minor roads when map scale is less than 1:100,000.

831 **Planning for land and water use** – A phrase intended to be more inclusive than simply  
832 “land-use planning.” In its simplest form, land-use planning is the process of making  
833 decisions on how to use land and its associated resources to achieve one or more goals,  
834 such as providing food for people and maintaining **ecosystem services**. It is well  
835 recognized, however, that conservation planning requires attention to aquatic ecosystems  
836 as well, hence the expansion of the concept to include water, as well.

837 **Protected areas** – Areas that are, for the most part, permanently protected from  
838 conversion to development.

839 **Refugia** (singular: **refugium**) – Locations that historically or currently protect  
840 conservation elements that are eliminated or significant degraded elsewhere.

841 **Resolution** – Resolution can be used to describe either spatial (or area) resolution or  
842 temporal (or time) resolution. Spatial resolution (or grain) is the size of the smallest  
843 amount of detail depicted on a map. It can be thought of as the pixel (or cell) on a digital  
844 image or as the smallest mapping unit on a feature-based map. For example, the highest  
845 (or finest) resolution on a land use/land cover map created by satellite-based remote-  
846 sensing technology is 30 x 30 m, so that each 30 x 30 m cell is described by one value, and  
847 all variation within that cell is ignored. Temporal resolution describes the smallest unit of  
848 time described by data (e.g., daily average, yearly minimum). Variation within that smallest  
849 unit of time can be characterized by a statistical measure of variation (e.g., standard  
850 deviation), but the actual data associated with shorter increments of time are ignored.

851 **Scale** – A general concept that can be applied to both spatial (or area) and temporal (or  
852 time) domains as **spatial scale** and **temporal scale**. Scale, whether spatial or temporal,  
853 represents a combination of separate characterizations of area or time, particularly **extent**,  
854 **resolution**, and **intensity**.

855 **Scale matrix** – A visual representation of the general ecological relationship that exists  
856 between **spatial scale** and **temporal scale**. At one extreme are those processes that  
857 operate only over small areas and require short periods of time. At the other extreme,  
858 certain ecological processes take place over large areas and require hundreds or even  
859 thousands of years to operate.

860 **Spatial extent** – see **Extent**.

861 **Spatial scale** – A general concept used to characterize aspects of an area that is the focus of  
862 an **ecological assessment** or **conservation plan**. Spatial scale includes three important  
863 descriptions of how the area is characterized: **extent, resolution, and intensity**. In  
864 conducting ecological assessments, it is important to explore the appropriate spatial  
865 scale(s) needed to adequately address the conservation needs of particular species,  
866 ecosystems, or ecological processes. Some ecological processes and species life histories  
867 take place over very small areas (e.g., a vernal pool, a rotting log, or a rock outcrop). These  
868 are said to operate at a “small” spatial scale (i.e. *plot or stand scale*; 1 m<sup>2</sup> – 1 km<sup>2</sup>). Other  
869 species and processes (e.g., grizzly bears and forest fires) occur over broader (or “larger”) *regional scales* (1 km<sup>2</sup> – 10,000 km<sup>2</sup>), while still others (e.g., climate and some species  
870 migrations) operate at even greater the *continental* (10,000 km<sup>2</sup> – 100,000 km<sup>2</sup>) or even  
871 *global scales* (>100,000,000 km<sup>2</sup>). Note that this is the opposite of the usage of **map scale**.  
872 It is generally felt that a general ecological relationship exists between spatial and temporal  
873 scales, described by a **scale matrix**.  
874

875 **Spatially explicit** – Referring to the condition of having the specific location of something –  
876 ecological feature, process, or conservation action – specified.

877

878 **Systematic conservation planning** – A specific framework for developing a **conservation**  
879 **plan** intended to identify conservation goals, locations where conservation actions are  
880 priorities for achieving the goals, and strategies that will improve the chances that actions  
881 taken at those locations will succeed (cf., Margules & Pressey 2000). **Ecological**  
882 **assessments** are a critical part of such a framework.

883 **Target** – see **Conservation target**.

884 **Temporal scale** – A general concept used to characterize aspects of time, especially as they  
885 relate to the goals or process of **conservation planning**. As with **spatial scale**, temporal  
886 scale includes two important descriptions of how time is characterized: **extent** and  
887 **resolution**. In conducting **ecological assessments**, it is important to explore the  
888 appropriate temporal scale(s) needed to adequately address particular species,  
889 ecosystems, or ecological processes. Some ecological processes and species life histories  
890 take place over very short periods of time (e.g., storms, seed germination, mating, and  
891 nesting). Other processes, however, operate over longer durations (e.g., climate change,  
892 speciation, and extinction). It is generally felt that a general ecological relationship exists  
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- 958
- 959

## Appendix 1

### Approaches and Tools for Conducting Assessments of Species Distributions

Appendix 1 describes a sample of modeling approaches commonly used to estimate and map species distribution. Practitioners are also encouraged to search for and use existing species distribution maps. However, when using currently available species distribution maps it is important for the practitioners to understand and report the data and methods used to generate the maps.

#### A) Generalized linear model and logistic regression model

##### *Overview*

Generalized linear model (GLM) approaches use least squares methods to fit the relationship between the mean of the response variable and the linear combination of the explanatory variables. The response variables for distribution models are usually represented with simple species presence, presence–absence or abundance observations at geographic locations based on random or stratified field sampling, expert opinion, or observations obtained opportunistically. Explanatory variables in this approach represent environmental data that are assumed to directly or indirectly effect on species (Austin, 2007). The assumed relationship between the response and explanatory variables are defined with one of several link functions describing the probability distributions (e.g., normal, Poisson, negative binomial, or gamma distribution) (Guisan et al., 2002).

Logistic regression is a special kind of GLM used to evaluate how a suite of environmental variables predict the presence of a species. The species data are summarized into binomial response (presence or absence) for each sampled area. The logistic regression model constrains the probability of presence and absence between zero and 1 with a logit link function and assumes the error term has a binomial distribution.

##### *Data Requirements*

Both GLM and logistic regression model require field observations and measurements of environmental factors expected to influence organism's distribution. The environmental data can be collected with in situ field sampling methods or with remote sensing methods.

##### *Strengths*

GLM (and logistic regression) has long been used in biological research for a wide breath of studies to estimate species' distribution (Guisan and Thuiller, 2005). The approach allows much flexibility in selecting the environmental data. This approach allows researchers to test several working hypotheses by using maximum likelihood methods to determining the most parsimonious model that best fits the observed data.

##### *Weaknesses/Assumptions*

GLM models are dependent upon the quality of data and the structure of the candidate models developed by the researcher. The logistic regression analysis is dependent upon the

1005 assumption that a species does not occur where it is deemed absent (as opposed to being  
1006 present but undetected). There may be uncertainty about the whether or not locations  
1007 were sampled extensively enough to verify that individuals are not present.

1008 Also, spurious results can occur if the environmental variables that have little or no  
1009 influence on the response variable (Burnham and Anderson, 2002).

1010

1011 Linear regressions are parametric statistical analysis limited by the following four main  
1012 assumptions

- 1013 • Each environmental variable's error is assumed to be identically and independently  
1014 distributed;
- 1015 • The variance of the response variable is constant across observations;
- 1016 • Each environmental variable's error are assumed to follow the selected link functions  
1017 describing the probability distribution;
- 1018 • The regression function is linear in the predictors.

1019

### 1020 ***Capacity Needed (construct and run model)***

1021 Regression models are relatively easy to construct, run, and interpret with the help of many  
1022 statistical packages (e.g., SAS and R).

1023

## 1024 **B) Occupancy models**

1025

### 1026 ***Overview***

1027 An occupancy modeling approach estimates the distribution or proportion of geographical  
1028 locations occupied by a species (MacKenzie et al., 2002). Since the probability of observing  
1029 a species can be  $< 1$  when the species is present, the occupancy model also incorporates the  
1030 probability of detecting the species within a site along with allowing the probability to vary  
1031 as a function of site characteristics, time, or environmental variables (MacKenzie et al.,  
1032 2002). With multiple site visits to detect the species, this approach estimates the  
1033 probability that a species will be detected at site given a likelihood that it is present  
1034 (Mackenzie et al., 2005).

1035

### 1036 ***Data Requirements***

1037 A species' occupancy within a site and distribution between sites involves multiple visits to  
1038 sites when a species may be detectable (MacKenzie et al. 2002). For this approach sites  
1039 may represent discrete habitat patches or sampling units (e.g., quadrats) regularly visited  
1040 as part of a large-scale monitoring program. Each survey is conducted on discrete time  
1041 periods where an investigator records if the species was present or absent at each  
1042 occasion. The set of detection histories for each site is used to estimate the proportion of  
1043 sites occupied by the species. Investigators can also collect site-level characteristics (e.g.,  
1044 area and dominant vegetation) and environmental variables expected to influence  
1045 probability of detecting organisms (e.g., weather conditions and time of sampling).

1046

### 1047 ***Strengths***

1048 The occupancy modeling approach can be implemented more easily and less expensively  
1049 than the methods used for abundance estimation. In addition, occupancy modeling can be

1050 applied to large-spatial extent monitoring programs to determine a species spatial  
1051 distribution throughout a region. Covariates expected to influence detection or occupancy  
1052 can be easily included in the occupancy model to account for the heterogeneity in  
1053 probability detection and varied occupancy by site. Missed sampling events can be adjusted  
1054 for by slightly modifying the maximum likelihood model that estimates likelihood of  
1055 presence.

1056

### 1057 ***Weaknesses/Assumptions***

1058 One of the main weaknesses in this method is the requirement of many visits to a single  
1059 site. For some study systems it may be logistically difficult and time consuming. Habitat  
1060 patches need to be delineated by the investigator. But, increasing the number of visits per  
1061 site improves the precision of the estimated occupancy rate, and the resulting increase in  
1062 information improves the accuracy of the estimate when detection probabilities are low  
1063 (MacKenzie et al., 2002). This approach only provides information on occupancy of a patch  
1064 and no information about the population dynamics or abundance of the species in the  
1065 patch. Therefore, it is difficult to use these data to speculate on the viability of the  
1066 population.

1067 Key assumptions for the occupancy modeling approach include (MacKenzie et al., 2002):

- 1068 • Sites are closed to changes in occupancy during sampling (i.e., closed system). Sites are  
1069 occupied by the species of interest for the duration of the survey period, with no new  
1070 sites becoming occupied after surveying has begun, and no sites abandoned before the  
1071 cessation of surveying
- 1072 • Detection of the species at a site is also assumed to be independent of detecting the  
1073 species at all other sites.
- 1074 • Species are never falsely detected at a site when absent, and a species may or may not  
1075 be detected at a site when present.

1076

### 1077 ***Capacity needed***

1078 The development of the occupancy modeling approach has lead to detailed documentation  
1079 describing sampling procedures and analysis (Mackenzie et al., 2005). In addition, a freely  
1080 downloadable program PRESENCE is available to analyze the data (version 3.1 at  
1081 <http://137.227.242.23/software/presence.html>)

1082

## 1083 **C) Maximum entropy models**

1084

### 1085 ***Overview***

1086 A maximum entropy (MaxEnt) modeling approach using a machine-learning algorithm to  
1087 predict a species' geographic distribution based on locations of known occurrences and  
1088 layers of environmental data (Elith et al., 2006; Phillips et al., 2006). The maximum  
1089 entropy modeling approach estimates the species distribution by finding the maximum  
1090 entropy (i.e., closest to uniform) distribution, constrained by the environmental data  
1091 associated with species known locations (Phillips et al., 2006).

1092

### 1093 ***Data Requirements***

1094 Maximum entropy modeling requires two types of input data, the geographic coordinates  
1095 of species occurrences and geographically explicit environmental variables likely to  
1096 influence the distribution of a species at the relevant spatial and temporal scale (Phillips et  
1097 al., 2006). Occurrence locations only need to represent presence only records (e.g., natural  
1098 history museum or herbarium) records and at least 50 to 100 occurrence locations are  
1099 recommended to obtain predictions close to optimal distribution (Phillips et al., 2006).

1100

### 1101 ***Strengths***

1102 There are many advantages to using the Maximum entropy approach when modeling  
1103 species distribution (Phillips et al. (2006)):

- 1104 1) Presence only data are required for species occurrences
- 1105 2) Environmental grids can contain continuous and categorical information
- 1106 3) There is an efficient deterministic algorithm for obtaining the optimal probability  
1107 distribution, obviating the need for uncertainty analyses
- 1108 4) Over fitting features can be avoided by adjusting the regularization parameter
- 1109 5) One of the output products is a continuous map allowing fine distinctions between the  
1110 species distribution throughout the entire region
- 1111 6) Provides insight into relative importance and relationship of each environmental  
1112 feature predicting species distribution

1113

### 1114 ***Weaknesses/Assumptions***

1115 Maps (geo-referenced data) of the environmental variables or covariates representing  
1116 environmental conditions need to be available for the entire landscape. In addition, the  
1117 environmental variables and the species occurrence locations should be measured for  
1118 similar time periods (Phillips et al., 2006). The number of environmental variable used in  
1119 conjunction with the occurrence locations may not be sufficient to describe the species  
1120 distribution. The occurrence locations may be biased, spatially auto-correlated, or sampling  
1121 intensity/methods may have widely varied across the study area (Phillips et al., 2006). For  
1122 example, museum samples may have been collected near roads and within a small segment  
1123 of the population. There could also be errors when recording the occurrence locations or  
1124 the species may have been misidentified during field observations.

1125

### 1126 ***Capacity needed***

1127 Basic knowledge of GIS is needed to ensure that all environmental data have the same  
1128 format (projection, extent, and resolution). A freely downloadable program Maxent is  
1129 available to analyze the occurrence locations and environmental grids  
1130 (<http://www.cs.princeton.edu/~schapire/maxent>).

1131

## 1132 **D) Resource selection probability functions**

1133

### 1134 ***Overview***

1135 A resource selection probability function (RSPF) is a mathematical function that predicts a  
1136 species use of resources or habitats relative to availability of the resources or habitats  
1137 (Manly et al., 2002)—hence a habitat suitability measure. The approach uses species  
1138 occurrence location data to estimate where habitat use exceeds availability. RSPF can take

1139 many mathematical forms (Manly et al., 2002) but logistic regression is the most common  
1140 form used to estimate habitat suitability.

1141

### 1142 **Data Requirements**

1143 There are three data requirements to estimate RSPF.

1144 1) Coordinates of species observations, known as used locations

1145 2) Coordinates of locations where the species may occur within the study area to define  
1146 potential habitat, known as available locations. These are typically defined as random  
1147 subset of points within an individual's home range.

1148 3) Environmental data expected to influence the species distribution.

1149

### 1150 **Strengths**

1151 RSPF are flexible enough to parameterize the environmental data with a wide range of  
1152 functional relationships (e.g., polynomial terms and interactions). This approach easily fits  
1153 into maximum likelihood framework with model selection to determine which  
1154 environmental variables influence species distribution. A RSPF approach allows  
1155 researchers to easily interpret environmental variables estimated in the "best" model. The  
1156 analysis can be conducted at multiple ecological levels (individual, populations, or species).

1157

### 1158 **Weaknesses**

1159 Model output can be sensitive to sampling of available locations in relation to observed  
1160 used locations.

1161

### 1162 **Capacity needed**

1163 Basic knowledge of GIS. A GIS tool to execute RSPF has been developed by Yellowstone

1164 Ecological Research Center ([http://www.yellowstoneresearch.org/projects\\_rspf-  
1165 down.html](http://www.yellowstoneresearch.org/projects_rspf-down.html)).

1166

## 1167 **F) Multivariate Models**

1168

### 1169 **Overview**

1170 A commonly used multivariate modeling approach to estimate species distribution is  
1171 Mahalanobis distance (MD). MD is a dimensionless measure of dissimilarity by  
1172 representing the standard squared distance between a set of environmental variables and  
1173 ideal habitat quality (Clark et al., 1993). A distance threshold is then used to define the  
1174 boundary of the species distribution (Tsoar et al., 2007). When mapping species  
1175 distribution in relation to habitat quality, the MD metric can be used to rank each cell in the  
1176 habitat map relative to a statistical description of habitats used by a species. Each cell on  
1177 the MD habitat map is relative to the vector describing the multivariate characteristics of  
1178 habitats at cells where the species was located.

1179

### 1180 **Data Requirements**

1181 Species occurrence data. Environmental data expected to influence species distribution.

1182

1183

1184

1185 **Strengths**  
1186 Environmental variables can be correlated and the assumption of multivariate normality  
1187 does not have to be met because MD creates new and uncorrelated variables (Clark et al.,  
1188 1993; Knick and Dyer, 1997). Environmental data can be continuous or categorical.

1189  
1190 **Weaknesses/Assumptions**  
1191 The MD approach assumes that the species is distributed optimally at the mean  
1192 environmental conditions, and that any deviation from the mean (optimal) conditions is  
1193 associated with lower suitability (Farber and Kadmon, 2003). Similar to many multivariate  
1194 analysis, it may be difficult to interpret how the environmental variables directly relate to  
1195 species distribution.

1196  
1197 **Capacity needed**  
1198 A surface representing Mahalanobis distance for species distribution can be calculated with  
1199 statistical software (e.g., R or SAS). This analysis can also be conducted using multivariate  
1200 statistical software such as PCord (<http://home.centurytel.net/~mjm/>)

1201  
1202 **E) Expert opinion**

1203  
1204 **Overview**  
1205 When data are limited investigators may consult groups of experts to subjectively delineate  
1206 species distributions or define environmental features that influence species distributions.  
1207 Expert opinion can be incorporated into species distribution modeling by providing input  
1208 into data preparation, identifying suspect records of species occurrences, selecting relevant  
1209 environmental features influencing species distribution, developing various models, or by  
1210 grouping vegetation into habitat suitability classes (Pearce et al., 2001).

1211  
1212 **Data Requirements**  
1213 This approach requires limited field data collection. However, it is a time consuming  
1214 process of identifying and interviewing experts for various ecosystems or species.  
1215 Published literature (peer-reviewed articles and reports) should also be reviewed to  
1216 supplement expert opinion information. If expert opinion models are displayed spatially  
1217 then all relevant environmental features are needed in a spatial data layers such as grids or  
1218 vectors.

1219  
1220 **Strengths**  
1221 Since there is little or no field data collection this method is relatively inexpensive. For a  
1222 few species and ecosystems, experts are available with extensive knowledge based on  
1223 decades of field experience.

1224  
1225 **Weaknesses**  
1226 There is limited publishing information or available expert knowledge for many rare and  
1227 federally protected species. When experts are available, the degree of their expertise may  
1228 be difficult to evaluate and it can be difficult to standardize interview techniques. While it is  
1229 a cost-effective approach with regard to limited field data collection, incorporating expert  
1230 opinion into distribution modeling can be a slow and tedious process and is usually

1231 performed on a species-by-species basis (Seoane et al., 2005). Distribution models created  
1232 from expert opinion are rarely validated with independent data. Therefore, a high level of  
1233 uncertainty is present in the model until observations confirm the presence of the species  
1234 in relation to environment.

1235  
1236 To address some of the uncertainties with varying expert opinions, species distribution  
1237 models created with expert opinion can be subject to a pairwise comparison technique  
1238 (Analytic Hierarchy Process) developed by Saaty (1980), whereby experts rank the relative  
1239 importance of each variable in a pair using a continuous scale. For example, each expert  
1240 selects the variable deemed to be more important in each of pairwise comparisons and  
1241 rank how important the selected variable is, compared with the others, on a scale of 1  
1242 (equally important) to 9 (extremely more important). The pairwise comparisons are  
1243 transformed into a matrix of ranks based on the Analytic Hierarchy Process model. Those  
1244 ranks can be calculated by averaging the survey scores of all respondents for each pairwise  
1245 comparison to represent the relative importance of each variable against another variable.

1246  
1247 **Capacity needed**  
1248 Beyond locating and interviewing experts, modeling species distribution with expert  
1249 opinion usually requires GIS knowledge to compile a map overlaying relevant  
1250 environmental features expected to influence species distribution.

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- 1342

## Appendix 2

1343

### 1344 **Approaches and Tools for Conducting Assessments of Species Landscape Movement**

1345 Appendix 2 describes a sample of tools commonly used to assess and map species ability  
1346 and willingness to traverse among natural and human-modified landscape features. When  
1347 assessing and predicting species movement on a landscape, practitioners should build off  
1348 existing information on the species movement behavior in the literature and expert  
1349 opinions. For example, if information on species ability or inability to traverse steep  
1350 terrain has been previously determined to be an important factor influencing movements  
1351 then an elevation raster and slope model should be used when mapping species  
1352 movements.

1353

#### 1354 **A) Least-cost Path Models**

1355

##### 1356 ***Overview***

1357 Least-cost distance accounts for the affects of landscape structure on movement by depicting  
1358 the relative resistance of different land-cover types or land uses encountered during species'  
1359 movements. In other words, each land-use characteristic thought to influence movements is  
1360 assigned a friction value, which approximates how much that feature impedes or facilitates  
1361 movement (Adriaensen et al., 2003). The minimum cumulative cost between resource  
1362 patches based on the resistance surface is known as the least-cost path (Adriaensen et al.,  
1363 2003). The least-cost path can be associated landscape connectivity through a two step  
1364 process; 1) calculate the least-cost distance from a source over a cost surface and 2)  
1365 perform a connectivity analysis with the least-cost surface. Within GIS there are two  
1366 options for connectivity analysis. The first option is to estimate the least-cost path which  
1367 requires a set of possible destinations to calculate the back link in the cost distance  
1368 analysis. The other, more computational option to estimate connectivity is to run a corridor  
1369 analysis where a second cost-distance is calculated from the destination. This surface is  
1370 then combined with cost distance from the source and destination at a set threshold value.

1371

##### 1372 ***Data Requirements***

1373 This approach requires two types of data

- 1374 • Spatial distribution of habitat patches, and
- 1375 • Resistance surface containing friction values representing how environmental features  
1376 influence movement ability.

1377 The most important step when creating a resistance surface for this method is estimating  
1378 biologically relevant friction values (Adriaensen et al., 2003). Due to the lack of detailed  
1379 information about dispersal and movement behavior, friction values for most species are  
1380 usually defined subjectively based on expert opinion, or are converted from species habitat  
1381 preferences during common daily activities, and therefore not representative of dispersal  
1382 behavior (Schultz and Crone, 2001; Schadt et al., 2002).

##### 1383 ***Strengths***

1384 Due to the limited data requirements it is relatively easy to calculate least-cost path  
1385 between habitat patches with minimal animal movement data.

1386

1387 ***Weaknesses/Assumptions***

1388 Friction values derived from these routine movements may not accurately depict an  
1389 individual's reaction to landscape features outside their habitat because behavior may differ  
1390 during dispersal through non-habitat (Palomares et al., 2000). Studies rarely validate friction  
1391 values and resistance surface derived from expert opinion or daily activities with independent  
1392 movement data. Therefore, surfaces are not confirmed in relation to observed movements.  
1393 Resistance surfaces require continuous land-cover maps spanning large spatial extents.

1394

1395 The least-cost distance approach has two improbable assumptions

- 1396 • Individuals have complete knowledge of their surroundings
- 1397 • Individual select the [global optimum least-cost path](#) between patches

1398

1399 ***Capacity Needed (construct and run model)***

1400 Least-cost distance can be calculated in GIS software.

1401

1402 **B) Circuit Theory Models**

1403 ***Overview***

1404 Circuit theory models assume that species movements are analogous to electrical current  
1405 flowing over a landscape composed of conductors with various amounts of resistance,  
1406 represented by a raster dataset. Circuit theory models can be considered an efficient  
1407 analytical equivalent to simple individual-based models known as “biased random walk”  
1408 models (McRae et al., 2008), and allow dispersal corridors and “pinch points”, where animal  
1409 movements are constricted to only a few possible paths, to be mapped quickly and  
1410 effectively. This model also allows the investigator to quantify the relative strength of  
1411 connections between all habitat patches, based on their distance and the quality of  
1412 intervening habitat.

1413

1414 ***Data Requirements***

1415 Circuit theory models require two inputs.

- 1416 • A raster where valued cells represent occurrences of the focal species.
- 1417 • A raster of resistances that represent the relative impermeability of different landscape  
1418 features to dispersing organisms.

1419

1420

1421

1422

1423 ***Strengths***

1424 Every grid cell in a landscape receives a relative movement ability estimate in Circuit  
1425 theory models. One is able to identify pinch-points and landscape corridors a species has a  
1426 high likelihood of passing through when moving between patches (McRae et al., 2008).

1427

1428 ***Weaknesses/Assumptions***

1429 The modeling outcome is based on resistance surface supplied by the investigator.  
1430 Therefore, there will always be uncertainty in selecting biologically relevant friction values  
1431 for the resistance surface and appropriate cell resolution. Edges of maps (i.e., landscape  
1432 features data) limit estimation of the potential movement route. Movement is assumed to  
1433 occur with the same ease in forward and backward directions. Therefore, species  
1434 movements influenced by directional features like elevation or water currents may not be  
1435 appropriate for this approach (McRae et al., 2008).

1436 Circuit theory models are restricted to Markovian random walks with no “memory”  
1437 between steps. This framework cannot incorporate correlated random walks, changes in  
1438 movement behavior with time, or mortality rates that increase with an organism’s age  
1439 (McRae et al., 2008). Barriers to movement need to be identified and delineated.

1440

1441 ***Capacity Needed (construct and run model)***

1442 The investigator will have to know basic GIS processing to prepare grids. The model can be  
1443 processed in freely available software Circuitscape (<http://www.circuitscape.org>).

1444

1445 **C) Graph Network Models**

1446 ***Overview***

1447 Graph network models are able to summarize the spatial relationship between points of  
1448 interest and estimate the optimal flow patterns or connectivity through a network (West,  
1449 1996). A graph network data structure is a set of nodes (points) connected to some degree  
1450 by links or edges. Nodes in the graph networks are typically denoted as habitat patches and  
1451 edges usually represent the movement ability between pairs of patches. Potential  
1452 connections between habitat patches exist if the focal species movement ability is greater  
1453 than the edge’s distance. Once a network is created, several network-level and patch-level  
1454 graph metrics can be calculated to evaluate the topology of the network and centrality or  
1455 juxtaposition of each habitat patch.

1456

1457 For many habitat connectivity studies, the flow of individuals between habitat patches is  
1458 estimated for a wide range of distinct edge threshold distances (Bunn et al., 2000; e.g.,  
1459 Urban and Keitt, 2001). Habitat patches within the threshold distance are defined as  
1460 connected while patches beyond the distance threshold are defined as disconnected (Keitt  
1461 et al., 1997; Minor and Urban, 2008). This approach evaluates connectivity to movement  
1462 ability and can reveal a sharp transition between connected and disconnected landscapes  
1463 (Urban and Keitt, 2001). This sharp transition is then compared to a fixed distance that  
1464 represents typical or maximum dispersal distance and that is based on literature review  
1465 (Roshier et al., 2001; e.g., Lookingbill et al., 2010).

1466

1467 ***Data Requirements***

1468 The only data required to create the simplest graph networks for landscape connectivity  
1469 model is the location of habitat patches. The simplest graph networks are based solely on  
1470 the spatial distribution of the habitat patches and assume that connectivity is only a  
1471 function of distance between patches. More complex network models account for varying

1472 ability to move through the environment (Calabrese and Fagan, 2004; Minor and Urban,  
1473 2007). These more complex models replace the Euclidean distance matrix that is populated  
1474 with all pairwise combination of habitat patches with least-cost distances. The distance  
1475 matrix is then converted into a directed or undirected graph network.

1476

### 1477 ***Strengths***

1478 Graph networks are able to incorporate spatial arrangement of habitat patches and attributes of the habitat  
1479 patch (Keitt et al., 1997; Bunn et al., 2000; Urban and Keitt, 2001). Graph networks do not require knowledge of  
1480 behavior, fecundity, or mortality parameters. However, as data on a species become available they can be  
1481 incorporated and used to create an ecologically rich graph model. For example, as mark-recapture data  
1482 become more available for a species the estimated probability of long-distance dispersal events can be  
1483 included in graph network model.

### 1484 ***Weaknesses/Assumptions***

1485 Habitat patches need to be identified and delineated and are simplified into a single point  
1486 with little or no habitat quality information. Therefore, gradient of habitat quality within a  
1487 patch is usually not represented in graph networks.

1488

### 1489 ***Capacity Needed (construct and run model)***

1490 Graph networks can be created within R software with separate packages such as igraph,  
1491 network, or sna. Free software called Pajek is also available to download  
1492 (<http://vlado.fmf.uni-lj.si/pub/networks/pajek>).  
1493

## 1494 **D) Agent-based Models**

### 1495 ***Overview***

1496 Agent-based model (also known as individual-based models) is a spatially-explicit  
1497 simulation modeling approach that attempts to capture the variation among individual  
1498 movements in order to understand landscape-level movement behavior. Individuals are  
1499 discrete agents with various properties that change during the life cycle (e.g., age, weight,  
1500 and reproductive status) (Grimm and Railsback, 2005). For every time step (e.g., year or  
1501 season) dynamic movement behavior for each agent or individual is governed by local rules  
1502 (JOHNSON et al., 1992). As a result each individual has a unique history of interactions with  
1503 its environment and other agents (DeAngelis and Mooij, 2005).

1504 Random walk in a homogeneous environment is one of the simplest agent-based models.  
1505 This model assumes that step directions are random and independent of each other and  
1506 movement from a source is similar to diffusion model (Turchin, 1998). The investigator  
1507 can increase the complexity of the model by correlating species movements with  
1508 heterogeneous environments. This is accomplished by adjusting the probability of moving  
1509 into a cell based on the species preference/ability to traverse through that land-cover  
1510 feature and a correlation between previous step and the next step can be adjusted for each  
1511 land-cover to mimic straight or curved movements.

1512

### 1513 ***Data Requirements***

1514 Detailed individual-level movement data (e.g., radio-telemetry) throughout various land-  
1515 cover types are required to accurately parameterize species movements (Belisle and

1516 Desrochers, 2002). When modeling movements in different environments, continuous  
1517 raster of all environmental data are required.

1518

1519 ***Strengths***

1520 Very flexible modeling approach where many different types of information regarding  
1521 species biology, environmental interactions, and intra/inter species interactions can be  
1522 incorporated into the model. Once the simulation model is constructed, it can be easily  
1523 altered to account for different behavior rules between species or landscape features. This  
1524 approach allows models constructed with movement data from a short temporal scale to  
1525 represent the population or system at wider temporal scale.

1526

1527 ***Weaknesses/Assumptions***

1528 This approach can be data intensive. Many movement studies are needed to inform the  
1529 local rules needed to mimic a species movement behavior. Each movement decision is  
1530 based on the immediate surrounding cells. Therefore, this approach is very sensitive to the  
1531 raster resolution selected by the modeler. The simulated patterns are rarely compared  
1532 with independent movement data to determine closeness of fit between model predictions  
1533 and observed movements.

1534

1535 ***Capacity Needed (construct and run model)***

1536 This approach requires a high skill level in computer programming.

1537

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1604

### Appendix 3

1605

1606 **Data Types to Consider**

1607 Foundational Datasets These datasets can form the basis of assessments that are  
 1608 comparable across jurisdictions and regions. In some cases state or regional entities may  
 1609 have improved upon these data locally. Providing links to those locally-relevant data sets is  
 1610 beyond the scope of this data table. Criteria for inclusion in the table include:

- 1611 • Dataset is widely available across most, if not all of the U.S.
- 1612 • Dataset is of known quality and utility
- 1613 • Metadata and/or online guidance provide adequate information about appropriate  
 1614 uses of the data
- 1615 • For composite datasets, documentation provide a complete description of how the  
 1616 data were derived

Matrix Element	Data Type	Information/Examples	Level of Synthesis *	Scope (Global, National, Regional, State)	Maintenance Status
<b>Abiotic</b>					
	Bathymetry Surveys	Example datasets	DO, SR-2	N	Regular Updates
	Climate Change Uncertainty	Example datasets	CO	G,N,R	Active Research
	Elevation – DEM, 30m	Information Example datasets	SR-1	N	Regular Updates
	Elevation – DEM, 10m	Information	SR-1	N	Regular Updates
	Elevation – DEM, 3m	Information	SR-1	R,S	Regular Updates
	Fire Fuel	Information Example datasets	CO	N	Regular Updates
	Fire Regimes	Information Example datasets	CO	N	Regular Updates
	Floodplain	Information	DO, SR-2	N	Regular Updates
	Geology	Example datasets	SR-2	N,R, S	Irregular Updates
	Historic Precipitation (1950-2000) 1km	Example datasets	CO	N	Complete

	Historic Temperature (1950-2000) 1km	Example datasets	CO	N	Complete
	Hydrology - lakes	Example datasets	SR-1,SR-2	N,R,S	Irregular Updates
	Hydrology - streams	Example datasets	SR-1,SR-2	N,R,S	Irregular Updates
	Hydrology - Stream Reach	Example datasets	SR-1,SR-2	N,R,S	Irregular Updates
	Physical Habitats	Example datasets	CO		Active Research
	Predicted Future Precipitation	Example datasets	CO	N	Active Research
	Predicted Future Temperature	Example datasets	CO	N	Active Research
	Sea Level Rise	Example datasets	CO	R	Active Research
	Slope and Aspect	Information Example datasets	SR-1	N	Regular Updates
	Soils - SSURGO	Example datasets	SR-2	R	Regular Updates
	Soils - STATSGO2	Information Example datasets	SR-2	N	Regular Updates
	Storm Surge	Information	CO	N,R	Active Research
	Watersheds (Hydrologic Units)	Information Example datasets	SR-2	N	Complete

1617

1618 *\* Level of Synthesis*

1619 DO – Direct Observation

1620 SR-1 – Spatial Representation, based on continuous data (e.g., satellite imagery)

1621 SR-2 – Spatial Representation, based on interpolation between observed points

1622 CO – Composite synthesis of multiple types of data, (e.g., the Human Footprint)

1623

Matrix Element	Data Type	Information/Examples	Level of Synthesis *	Scope (Global, National, Regional, State)	Maintenance	Status
<b>Cultural</b>						

	Agricultural Land	Example datasets	SR-1	S	Regular Updates
	Cities & Towns	Example datasets	DO	G,N,S	Regular Updates
	Conservation Easements, NCED Partnership	Example dataset	DO	N	Regular Updates
	Crucial Habitat	Information Example datasets	CO	N,R,S	Active Research
	Dams & Reservoirs	Example datasets	DO, SR-1	N,S	Regular Updates
	Designated Critical Habitat	Information Example datasets	DO	N,R	Irregular Updates
	Designated Roadless Areas	Example datasets	DO	N	Complete
	Energy – Biomass	Example datasets	CO	N,R,S	Regular Updates
	Energy – Coal	Example datasets	CO	N,R,S	Irregular Updates
	Energy – Oil & Gas	Example datasets	DO	N,R,S	Regular Updates
	Energy – Solar Energy Study Areas	Example datasets	DO, CO	N,R	Regular Updates
	Energy – Wind	Example datasets	DO, CO	N,R,S	Regular Updates
	Forest Harvest History and Forecast, CROP	Information	DO	N/S/R	Regular Updates
	Human Footprint	Example datasets	CO	N/R	Active Research

	Human Population	Example datasets	DO	N	Regular Updates
	Impervious Surface – National Land Cover Data	Information Example datasets	CO	N	Regular Updates
	Livestock Grazing Allotments	Example datasets	SR-2	S/R	Regular Updates
	Mine Locations	Example datasets	DO	N	Irregular Updates
	National Cultural Landmarks	Example datasets	DO	N	Irregular Updates
	Power Lines & Pipelines	Example datasets	DO	R	Regular Updates
	Place Names	Information		N	Regular Updates
	Public Land Survey (PLS)	Information Example datasets	DO	N,R,S	Regular Updates
	Protected Areas	Example datasets	DO	N,R,S	Regular Updates
	Railway Network	Example datasets	DO	N	Irregular Updates
	Recreational Facilities	Example datasets	DO	N	Irregular Updates
	Rights-of-Way	Example datasets	DO	N	Regular Updates
	Roads	Information Example datasets	DO	N	Regular Updates
	Trails	Example datasets	CO	R	Irregular Updates
	Urban Boundaries	Example datasets	SR-1	G	Regular Updates
	Water Use by County	Example datasets	CO	N	Irregular Updates

	Wood Mills	Example datasets	DO	R	Irregular Updates
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1625 *\* Level of Synthesis*

1626 DO – Direct Observation

1627 SR-1 – Spatial Representation, based on continuous data (e.g., satellite imagery)

1628 SR-2 – Spatial Representation, based on interpolation between observed points

1629 CO – Composite synthesis of multiple types of data, (e.g., the Human Footprint)

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Matrix Element	Data Type	Information/Examples	Level of Synthesis *	Scope (Global, National, Regional, State)	Maintenance Status
<b>Biological</b>					
	Atlas of Bird, Mammal and Fish Distributions	Information	SR-2	R	Regular Updates
	Biome Shifts				
	Breeding Bird Survey	Information	DO	N	Regular Updates
	Connectivity	Example datasets	CO	R,S	Active Research
	Ecological Systems – NatureServe	Information		N	Active Research
	Ecological Systems – USGS ReGAP	Information	CO	N,R,S	Regular Updates
	Ecoregions – WWF	Example datasets	CO	G,N,R,S	Complete
	Ecoregions – EPA	Example datasets	CO	G,N,S	Complete
	Element Occurrences	Information	DO	N,S	Regular Updates

	Ecoregions – USFS	Example datasets	CO	N	Irregular Updates
	Existing Vegetation (cover, height, type)	Information	CO	N	Regular Updates
	Fish Distributions	Information Example datasets	DO	R	Regular Updates
	Fish Habitat	Information	SR-2	N	Irregular Updates
	Forest Cover 1930 – PNW	Example datasets	SR-2	R	Complete
	Forest Fragmentation	Example datasets	CO	N	Regular Updates
	Forest Insect & Disease Damage and Risk	Information Example datasets	CO	N	Regular Updates
	Forest Inventories / Statewide Forest Plans	Information	CO	S	Irregular Updates
	USFS FIA Plots	Information	DO	N	Regular Updates
	General Land Cover – National Land Cover Database	Example datasets	CO	N	Regular Updates
	Important Bird Areas (IBAs)	Information	DO,CO	N,S	Regular Updates
	Intact Natural Landscapes	Example datasets	CO	G,N,R	Irregular Updates
	Invasive Species	Information Example datasets	DO,CO	N,R,S	Regular Updates
	Landscape Condition	Information Example datasets	CO	R,S	Active Research

	Old-growth Forests	Example datasets	DO,SR-1	R,S	Active Research
	Pre-settlement Vegetation	Information	CO	N	Complete
	Salmon ESUs	Information Example datasets	SR-2	R	Irregular Updates
	Species Distributions	Information Example datasets	SR-2	N,R,S	Active Research
	Species Mortality - Roadkill	Information	DO	S	Regular Updates
	Species range maps	Information Example datasets	SR-2	G,N,R	Active Research
	State Wildlife Action Plan priorities	Information	CO	S	Irregular Updates
	TNC ERA Portfolio	Example datasets	CO	N	Irregular Updates
	Vertebrate Habitat Models	Information Example datasets	CO	R	Active Research
	Wetlands	Example datasets	CO	N	Irregular Updates

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1632 ***\* Level of Synthesis***

1633 DO – Direct Observation

1634 SR-1 – Spatial Representation, based on continuous data (e.g., satellite imagery)

1635 SR-2 – Spatial Representation, based on interpolation between observed points

1636 CO – Composite synthesis of multiple types of data, (e.g., the Human Footprint)

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1638 Home pages for most-cited data aggregation sites:

1639 DataBasin <http://databasin.org/>

1640 ESRI ArcGIS Online Data [http://www.esri.com/products/index.html#data\\_panel](http://www.esri.com/products/index.html#data_panel)

1641 National Atlas <http://www.nationalatlas.gov/>

1642 NPScape <http://science.nature.nps.gov/im/monitor/npscape/index.cfm>

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