1	Reserve Selection with Minimum Contiguous Area Restrictions: An Application to
2	Open Space Protection Planning in Suburban Chicago
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28	Open Space Protection Planning in Suburban Chicago
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30	Abstract: Conservation efforts often require site or parcel selection strategies that lead to
31	spatially cohesive reserves. Although habitat contiguity is thought to be conducive to the
32	persistence of many sensitive species, availability of funding and suitable land may restrict the
33	extent to which this spatial attribute can be pursued in land management or conservation. Using
34	optimization modeling, we explore the economic and spatial tradeoffs of retaining or restoring
35	grassland habitat in contiguous patches of various sizes near the Chicago metropolitan area. The
36	underlying mathematical construct is the first exact, generalized formulation that directly models
37	spatial contiguity in optimal reserve selection. The construct allows conservation planners to
38	analyze and weigh different minimum contiguous habitat size requirements that are to be used in
39	specific land acquisition or retention projects.
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41	Keywords: reserve design, contiguity, urban sprawl, spatial optimization, 0-1 programming
42 43	Introduction:
44	
45	Land acquisitions, conservation easements and market-based incentives are the primary tools
46	available to community planners who want to preserve open space, critical habitat or key
47	ecosystem functions. These options, the first two in particular, generally require a strategy to
48	identify high-priority sites to be targeted for acquisition or retention. Finding cost-effective
49	reserve selection strategies can be difficult, however, due to the often competing conservation
50	goals or the complexity of ecological, operational and budgetary constraints. While it is widely

51 recognized that the spatial features of a reserve, contiguity in particular, can be critical to a 52 conservation effort (e.g., Williams et al., 2005 or Pressey et al., 2007), prior models that 53 attempted to incorporate contiguity were either indirect approaches that did not warrant reserves 54 with minimum contiguous habitat sizes, or were built on assumptions that tied them to very 55 specific spatial configurations, such as grids, of the candidate sites. We propose a model that 56 relaxes these assumptions and explicitly accounts for spatial contiguity in a generalized fashion. 57 The novel mathematical construct allows decision makers to analyze the tradeoffs and costs of 58 different contiguous habitat size requirements in conservation planning. 59 Why preserve urban open space? The last few decades saw a growing and increasingly 60 wealthy population in the United States demanding larger homes on larger lots. Cheap 61 transportation costs allowed these homes to be built further away from services and jobs. The 62 resulting process, known as urban sprawl, not only compromises the ecological function of 63 environmental systems but also adds pressure to a declining land-base to provide an increasing 64 amount of timber, water, food, outdoor recreation, carbon sequestration and other competing 65 services. According to Alig et al. (2003), 2 million hectares of nonfederal forestland, 66 predominantly private land, were converted permanently to urban development between 1992 67 and 1997. The total forest loss in the United States, mostly due to urban sprawl, is projected to be 68 about 9.3 million ha by 2050 (Alig et al., 2003). The trends affecting grasslands in North 69 America are similar (Grassland Conservation Council of British Columbia, 2008). Beyond the obvious but politically and culturally sensitive human population control 70 71 measures or a dramatic and lasting increase in energy prices, few options are available to society 72 to preserve urban open space and key ecosystem functions. Regulatory or market-based 73 mechanisms to compensate landowners who choose not to develop their land but to keep

74 producing ecosystem services are not yet widely available. The remaining alternatives, namely 75 land acquisition or retention initiatives, often require cost-effective strategies to select sites 76 whose characteristics or restoration potential would best serve agreed conservation goals. 77 Selecting a set of sites from a candidate pool, however, almost always leads to a tremendous 78 number of choices. This has given rise to the development of analytical models that have the 79 capacity to implicitly but rigorously evaluate these choices and find optimal site selection 80 strategies. Site selection models, most often formulated as mathematical programs, not only 81 provide case-specific policy guidance on protection strategies, but also can be used to quantify 82 the tradeoffs between conservation goals and reserve costs. This tradeoff information has significant value for conservation planners because it shows how much of one particular 83 84 conservation goal would have to be forgone to achieve a certain improvement in another goal. 85 Site selection models have been used in countries around the world where biodiversity and 86 open space is threatened and in need of protection (see Rodrigues and Gaston, 2002 for a 87 summary of published studies). Excellent reviews of reserve design principles and modeling 88 techniques are broadly available: e.g., Pressey et al. (1993), Margules and Pressey (2000), 89 Kingsland (2002), and ReVelle et al. (2002). Many of the early site selection models focused on 90 selecting sites in order to maximize species representation. One shortcoming of these models, 91 however, is that they did not consider or account for the resulting spatial design or distribution of 92 the protected sites. The recognition that reserves with specific spatial attributes, such as 93 connectivity or compactness, can be conducive to the survival and well-being of many species 94 has lead to a variety of streamlined, spatially-explicit reserve design models. The diversity of 95 models reflects the varying spatial needs of different species that are targeted for conservation. 96 Williams et al. (2005) provide a comprehensive survey of spatial site selection models.

97 Developing cost-effective, open-space acquisition strategies that satisfy specific contiguous 98 habitat area restrictions is the subject of the present study. Although work on explicitly 99 modeling this spatial attribute is limited, several *indirect* methods have been incorporated into 100 exact optimization procedures. Indirect methods promote but not guarantee the protection of 101 habitat patches that exceed minimum contiguous area thresholds. One approach is to maximize 102 the proximity of individual reserves by minimizing either the sum of the pairwise distances 103 between them (e.g., Önal and Briers, 2002; Snyder et al., 2007) or the sum of the distances 104 between neighboring sites (Önal and Briers, 2005). The assumption is that reserves close 105 together are likely to be structurally or functionally connected. A second approach is to 106 maximize the compactness of the reserve system with the assumption that compactness promotes 107 contiguity. Several authors noted that boundary minimization, which is the primary tool to 108 increase compactness, can promote large contiguous reserves as long as an appropriate minimum 109 total reserve size is specified (e.g., Fischer and Church, 2003; Önal and Briers, 2003; Tóth and 110 McDill, 2008). A third approach is to model reserve connectivity either directly (Williams 2002; 111 Cerdeira et al., 2005; Önal and Briers, 2006) by forcing the network to be fully connected (i.e., 112 one can walk between any pair of protected sites without leaving the reserve) or by maximizing 113 the number of adjacent pairs of sites in the reserve (Nalle et al., 2002), which does not guarantee 114 full connectivity. A fourth approach utilizes core and buffer zone requirements for site selection. 115 The model proposed by Williams and ReVelle (1996, 1998) maximizes the size of core areas that 116 must be surrounded by buffers. In an optimal solution, the number of buffers will be minimal 117 given the size of the core to reduce acquisition costs, which in turn leads to compactness and 118 contiguity. Finally, Onal and Wang (2008) proposed a linear integer programming model that 119 uses graph theoretical concepts to select a minimal subset of sites subject to species

representation requirements. Reserve fragmentation is kept to a minimum by minimizing the sumof gap sites in the reserve.

The limitation of the above models is that none guarantee the protection of habitat patches whose contiguous sizes exceed predefined limits. This is a critical issue because habitat protection plans for threatened or endangered species often include guidelines for protecting contiguous habitat patches that exceed a certain size. Further, this limitation prevents the demonstration of the financial implications of purchasing sites that lead to habitat patches of increasing minimum contiguous sizes, which is useful for conservation planners to evaluate the economic cost of increasing persistence of a species at a particular location.

Another limitation of spatial reserve design models to date is that they do not consider the location and contiguity of habitat patches within the sites. Since selection units often follow ownership rather than habitat boundaries, purchasing two adjacent sites does not necessary mean that the habitat patches within these sites will also be adjacent. The model proposed in this study will address this issue.

134 Techniques that promote reserve contiguity have been incorporated into *ad hoc* optimization 135 heuristics (Cerderia et al., 2005; Moilanen et al., 2005; Moilanen, 2005). Cerderia et al.'s (2005) 136 heuristic maintains spatial connectivity and species coverage while selecting the smallest 137 possible number of sites. Moilanen et al.'s (2005) zonation algorithm iteratively eliminates sites 138 from the periphery of the candidate pool and thus maintains structural cohesion in the remaining 139 reserve. Finally, Moilanen (2005) presents a non-linear model that indirectly promotes reserve 140 contiguity by capturing the fact that the conservation value of a site is not limited to its internal 141 qualities but also depends on the spatial structure of the rest of the reserve. The author achieves 142 this by incorporating a probability function that calculates the chance of species occurrence in

each potential site based on, among several other factors, the site's connectivity with areas that
could also sustain and disperse viable populations of the species. The proposed model ensures
proportional species coverage specifications at minimal costs. Moilanen's (2005) approach is
very attractive when the habitat needs and the population dynamics of the target species are
known. Again, none of these techniques warrant minimum contiguous habitat sizes. Moreover,
all three methods assume a regular grid network of candidate sites and cannot guarantee finding
optimal solutions.

150 There are two studies in which habitat area restrictions have been modeled directly and 151 solved with exact optimization procedures. Like Moilanen (2005), Marianov et al. (2008) make 152 use of a regular grid network of square-shaped parcels and predefine all possible spatial 153 configurations of parcel duals and quads to represent differential habitat size needs. These duals 154 and quads are then used in an integer programming model that ensures minimum contiguous 155 habitat size requirements in the selected set of parcels. The limitation of this approach is obvious 156 in situations where the parcels are irregularly shaped and dozens might be needed to form a big 157 enough patch.

158 The other example in which minimum contiguous area restrictions arise is spatial forest 159 planning. Rebain and McDill (2003a, b) develop and test an integer programming model that can 160 help forest managers schedule harvests in such a way that mature forest patches of a minimum 161 size and age would evolve over time and across the landscape. Their approach requires an a 162 priori enumeration of contiguous clusters of harvest units whose combined area just exceed the 163 minimum patch size. They then use these clusters to build constraints that ensure the minimum 164 size and age requirements. The key difference between the minimum patch size problem in forest 165 planning and the contiguity problem in reserve selection lies in the relationship between the

166 decisions to be made on the ground and the resulting landscape. In forest planning, the primary 167 management decision, whether to harvest a stand in a particular point in time or not, controls 168 only the spatial age-structure of the forested landscape. Additional constraints are needed to 169 dictate what this spatial age-structure should be like and how it should change over time. In 170 reserve selection, the spatial attributes of the habitat patches that result from a parcel selection 171 strategy are directly related to the selection decisions themselves. This requires a direct control 172 mechanism between the parcel selection decisions and the spatial attributes of the resulting 173 habitat patches.

In this study, we modify Rebain and McDill's (2003b) cluster enumeration algorithm and formulate a generalized reserve selection model that can ensure specific levels of minimum contiguous habitat sizes. We then show through a case study how the model can be used by conservation planners to formulate efficient habitat contiguity policies for suburban grasslands in the Chicago area. Finally, we discuss the potential of applying the method to other conservation projects.

180

181 Methods:

182 <u>Terminology</u>

The site selection terminology used in this study is a modified, more general version of the one introduced in Williams et al. (2005). We define *site* as a unit of land that may be selected for protection. It is usually undeveloped open space that can belong to several cover types including forest, grassland, pasture or cropland and can be spatially disjoint. We use the terms site and parcel interchangeably in this study. A *reserve* is the set of sites that has been selected for protection. Finally, a *habitat patch* is a contiguous area of habitat within a site. This terminology

190	structures and might not comprise solely areas of conservation interest.								
191									
192	Model Formulation								
193	The proposed model is a b	The proposed model is a bi-objective 0-1 mathematical program that selects a subset of							
194	habitat patches to maximize total protected habitat area while also minimizing the total								
195	acquisition or retention costs s	acquisition or retention costs subject to minimum contiguous habitat area requirements. Habitat							
196	patches must share a common	boundary to be contiguous. The model uses the concept of <i>cla</i>	uster						
197	from Rebain and McDill (200	from Rebain and McDill (2003b), which is defined here as a set of contiguous habitat patches							
198	whose combined area just exceeds the minimum contiguous area requirement. The model is:								
199									
200	$Min\sum_{i}c_{i}x_{i}$		(1)						
201	$Max\sum_{i}a_{i}x_{i}$		(2)						
202	Subject to:								
203 204	$\sum_{j\in S_i} y_j \ge x_i$	for each $i \in I$	(3)						
205	$\sum_{i \in C_j} x_i \ge \left C_j \right y_j$	for each $C_j \in C$	(4)						
206	$\sum_{i \in C_j} x_i - y_j \le \left C_j \right - 1$	for each $C_j \in C$	(5)						
207	$x_i, y_j \in \{0,1\}$		(6)						
208									
209	where the variables are:								

accounts for the possibility that sites can be spatially disjoint due to preexisting ownership

210 $x_i = 1$ if habitat patch *i* is selected, 0 otherwise;

- 211 $y_i = 1$ if cluster *j* is protected, 0 otherwise;
- and the parameters are:
- 213 c_i = the cost of selecting habitat patch *i*. Coefficient c_i corresponds to the purchase price of
- 214 the site that contains patch *i*. If a habitat patch is to be acquired, the full price of the
- site must be paid no matter how small the patch is within the site. However, to avoid
- 216 double counting the costs, only one of the habitat patches that belongs to the same site
- 217 was assigned the full site acquisition cost in objective function (1).
- 218 a_i = the area of habitat patch *i*;
- 219 S_i = the set of clusters that contain habitat patch *i*;
- 220 I = the set of all habitat patches;
- 221 C_i = the set of habitat patches that compose cluster j;
- 222 $|C_j|$ = the number of habitat patches that compose cluster j; and
- 223 C = the set of all possible clusters.
- 224

Function (1) minimizes the total costs, while function (2) maximizes the total area of the habitat patches in the reserve. Specifying these two conflicting objectives allows maximum flexibility for the user to analyze and weigh the tradeoffs that are associated with different budget levels.

- 229 The constraint sets (3-5) are the heart of the model; they warrant reserves that comprise
- 230 clusters of habitat patches of a minimum contiguous size. Inequality (3) says that a habitat patch
- 231 can only be selected for protection if it is a member of at least one cluster that is of a minimum

232	size and selected for protection. Inequality (4) specifies that a cluster variable (y_j) may be one							
233	only if all habitat patches that compose the cluster are selected for protection. In other words, a							
234	cluster cannot be de declared to be protected unless each habitat patch that is part of the cluster is							
235	rotected. Constraint (5) works in concert with constraint (4) and forces cluster variable (y_j) to							
236	ourn on if all habitat patches that compose the cluster are on. Note that constraint (4), if alone,							
237	would allow y_j to remain 0 even if all the variables associated with the habitat patches in C_j							
238	were on. While a failure to recognize that cluster j is protected in such cases does not interfere							
239	with the proper functioning of the model (i.e., it only means that cluster <i>j</i> shares its patches with							
240	other clusters that were found via constraint (3)), constraint (5) was retained as it restricts the							
241	feasible set of solutions that need to be evaluated during optimization. This in turn could lead to							
242	better computational performance.							
243	Constraint set (6) defines the habitat patch and the cluster variables as binary. We note that							
244	this restriction on the x_i variables can be relaxed to continuous [0,1] bounds as equations (2), (3)							
245	and (4) already enforce integrality. Replacing the explicit binary restrictions with the bounds							
246	might improve the computational performance of the model.							
247	Finally, if a site includes multiple, disjoint habitat patches, as is the case in the pilot study							
248	that follows, the following logical constraints must be added to the model:							
249								
250	$x_n - x_m = 0$ for $\forall n, m (n \neq m)$ that belong to the same parcel (7)							

252 Constraint (7) states that a habitat patch *n* can be acquired only if all other patches that
253 belong to the same parcel are also acquired. An alternative, more elegant way to state this logical
254 condition is the following:

256
$$\sum_{n \in P_u} x_n = |P_u| z_u \qquad \text{for each } u \in U \tag{8}$$

257

where $z_u \in \{0,1\}$ is a variable that represents the decision whether parcel *u* should be purchased or not, P_u denotes the set of habitat patches that belong to parcel *u* and *U* is the set of available parcels. The advantage of the latter construct is that only one constraint of type (8) is needed for each parcel that contain multiple, disjoint patches, whereas in (7) one constraint must be written for each pair of patches that exist in each parcel. The disadvantage of construct (8) is that one parcel variable (z_u) must be added for each parcel that contains multiple habitat patches. The tradeoff is between the number of variables and constraints that are required by the two methods.

266 <u>The modified cluster enumeration algorithm</u>

267 The formulation of the proposed optimization model requires the generation of set C. Since 268 enumerating all clusters of habitat patches whose combined area just exceeds the minimum 269 contiguous habitat size might be computationally expensive, the use of an efficient algorithm is 270 critical. We modified Rebain and McDill's (2003b) cluster enumeration algorithm with the intent 271 to make it computationally more efficient. The key difference between the two algorithms is that 272 ours, starting from a specific habitat patch, builds each feasible habitat cluster of 2-patches first. 273 Only then does it move to the 3-patch level and keeps processing until no further patch additions 274 are necessary to generate feasible clusters. The original Rebain and McDill (2003b) algorithm on 275 the other hand, starts with one patch and keeps adding adjacent patches until the combined area 276 of the patch aggregation becomes feasible. Then it backtracks by removing the last patch from

the group and adds another one to evaluate a new cluster for feasibility. In sum, the difference isin the way the two algorithms explore the search tree of possible clusters.

279

280 The Case Study

We applied the model to a parcel network that contains patches of grassland habitat and potentially restorable grasslands in Kane County, Illinois (Figure 1). The parcels are located on the western edge of the Chicago metropolitan area and are under pressure of real-estate development. The gray patches (polygons) on the state map (upper right corner of Figure 1) represent municipal areas. The location of Kane County in relation to urban Chicago is indicated by a small rectangle with black boundaries on Figure 1.

287 We used existing GIS coverages (as described in Snyder et al., 2007) to identify parcels and 288 habitat patches within parcels. Each parcel represents an individual ownership that is potentially 289 available for acquisition. Habitat patches are existing and restorable grasslands found within the 290 parcels. Existing and restorable grasslands can provide habitat for several sensitive birds such 291 as the Henslow's Sparrow (Ammodramus henslowii), the Upland Sandpiper (Bartramia 292 *longicauda*) and the Eastern Meadowlark (*Sturnella magna*). These birds are grassland obligates 293 that lived in tallgrass prairie that once covered more than half of Kane County (Kilburn, 1959). 294 Much of the prairie had been converted to agricultural land, however, due to the rich soils. 295 Although most of the obligate grassland species have been able to persist in large patches of 296 cultivated grasslands such as hayfields (Miller, 2006), these habitats are often designated as 297 "high-risk" today due to ongoing development pressures that result from the growing Chicago 298 metropolitan area (Openlands Project, 1999).

299 The silver lining of urbanization is a greater support among voters for land protection and a 300 greater tax base to fund local conservation efforts (Trust for Public Land and Land Trust 301 Alliance, 2004). The primary player in open space protection in Kane County is the Forest 302 Preserve District, which owns 6,934 ha of land (5.1% of the area of Kane County) and is actively 303 pursuing further acquisitions. The District is also committed to restoring agricultural land to 304 natural prairie habitat. "The primary purpose of forest preserves is to protect plant and animal 305 life so that present and future generations can enjoy their wonders," says the mission statement 306 of the District on their website (http://www.kaneforest.com).

307

/Figure 1/

308 We analyze habitat acquisition and restoration strategies in Kane County based on the needs 309 of grassland birds, which are some of the most visible and popular elements of the grassland 310 fauna. They are also vulnerable as the Biodiversity Recovery Plan of the Chicago Wilderness 311 consortium lists most grassland birds found in the region as globally critical or important 312 (http://www.chicagowilderness.org/). As it has been pointed out earlier, a common structural 313 feature of grassland habitat in the Midwest is its extensive spatial fragmentation. Habitat 314 contiguity is therefore one of the most pressing needs for birds that have evolved to survive on 315 once vast tracts of prairie. It is documented that the likelihood of occurrence as well as nest 316 success among these birds increases with larger habitat fragments (Herkert et al., 1996). While 317 there is a general agreement that the protection and restoration of large contiguous patches of 318 grassland habitat should be a strategic priority for conservation planners (Snyder et al., 2007), it 319 is not clear what contiguity thresholds should be used. Herkert et al. (1996) cite a 10-100 ha 320 patch size range as a minimum for most grassland birds but note that a few larger species would 321 need at least 200 ha. Herkert and his colleagues (1996) also point out that the actual area required

322 by many species at a particular location depends on the broader land use context as well. If the 323 overall grassland cover in the surrounding area is substantial, then smaller individual patches 324 might be adequate. However, if the general grassland availability is minimal, then larger patches 325 will be required. There is also some evidence that nest success is lower on smaller prairie 326 fragments due to higher levels of nest predation and parasitism (Nelson and Duebbert, 1974; 327 Johnson and Temple, 1986, 1990). Patches above 1,000 ha seem to offer more protection than 328 patches below 100 ha (Herkert et al., 2003). Finally, there are a few grassland birds, such as the 329 Western Meadowlark (Sturnella neglecta) that were found to be insensitive to patch size (Davis, 330 2004). It is obvious that a single contiguous habitat size rule to enhance grassland bird 331 persistence is unrealistic. Planners would greatly benefit from an analytical tool that can provide 332 them with information on how sensitive acquisition costs and other conservation criteria, such as 333 total reserve size, are to different levels of contiguous habitat size requirements. What would the 334 extra cost be to purchase a set of parcels that form patches of grassland habitat with each at least 335 200 ha in size versus buying a set with at least 100 ha minimum patch size? If there is a budget 336 restriction, would the overall size of the reserve be compromised due to doubling the minimum 337 patch size requirement? If it would, how much total area would have to be forgone? The case 338 study demonstrates how the proposed model can help analysts answer these types of questions. 339 The following steps were taken to develop the dataset for the case study, and formulate and run 340 the optimization model.

<u>1.) Identify Sites:</u> Given recommendations that new acquisitions and the associated
restoration efforts are more beneficial to grassland birds if they are done in the neighborhood of
already existing preserves (Johnson and Igl, 2001), we chose the 409.1 ha Dick Young Forest
Preserve in southeastern Kane County as the core for our site selection model (Figure 1). The

first step was to identify a set of sites in the vicinity of the Preserve that contained suitable
habitat. This was done by eliminating all parcels from the analysis that were either more than 6
km away from the center of the Preserve, or were classified as residential, commercial or
industrial, or were entirely wooded (Figure 1). After Herkert et al. (1996), pastures and hayfields
were considered suitable. Row crops were also included in the analysis as there is evidence that
they can be restored, at an extra cost, to suitable habitat (Snyder et al., 2007). This classification
resulted in a total of 1,136 sites (6,095.9 ha) eligible for new purchases.

352 <u>2.) Identify habitat patches within sites:</u> Since not all sites are comprised solely of suitable or
353 restorable habitat, the effective habitat patches had to be delineated within the sites. After
354 accounting for 50 m wide buffers between the effective and unsuitable habitats (Figure 2), we
355 delineated 996 habitat patches totaling 4,172.4 ha. The buffers served to eliminate the negative
356 edge effects that are of concern for some of the grassland birds (Forman et al., 2002).

357 <u>3.) Eliminate habitat patches < 5ha:</u> To minimize the anticipated computational expense of
and solving the optimization model, we eliminated all suitable or restorable
habitat patches that were less than 5 ha. The resulting 233 polygons summed to 3,445.7 ha
(Figure 1).

361

/Figure 2/

<u>4.) Create adjacency matrix for habitat patches:</u> An adjacency matrix listing all pairs of
 habitat patches that shared a common boundary served as input for the cluster enumeration
 algorithm. Although adjacency can also be defined based on proximity, we used shared
 boundaries for simplicity and illustration purposes. To account for the preexisting Dick Young
 Forest Preserve, we instructed the cluster enumeration algorithm to list all habitat patches
 adjacent to the Preserve as a feasible clusters if the combined area of the core and the patch

368 exceeded the minimum contiguity threshold. In the optimization model, we designated a dummy 369 habitat patch variable for the core and fixed its value to one implying that the core is already 370 purchased. We accounted for the core in the objective functions with a zero acquisition cost and 371 a zero area coefficient. If the planning analyst wants to discourage the selection of habitat 372 clusters near the core, perhaps in an effort to establish new core areas as a means of promoting 373 persistence, the core would have to be removed from both the formulation and the cluster 374 enumeration process.

375

/Table 1/

376 5.) Run cluster enumeration algorithm: We ran the cluster enumeration algorithm for ten 377 different contiguity thresholds: 100, 120, 150, 200, 250, 300, 350, 400, 450 and 500 ha (Table 1). 378 The goal was to evaluate the financial and spatial tradeoffs that were associated with these 379 hypothetical minimum contiguous habitat size policies. The algorithm yielded the highest 380 number of clusters for the 200 ha limit (second column from the left in Table 1) but the number 381 of clusters dropped rapidly as the size limit was set to be lower or higher than 200 ha. In general, 382 as the threshold is raised, an increasing number of patch combinations are possible to form 383 feasible clusters. However, the spatial configuration of the sites limited the extent to which the 384 contiguity threshold could be raised: the largest possible contiguous habitat cluster in the test 385 area was 544 ha.

<u>6.) Calculate cost coefficients:</u> The cost coefficients of the proposed 0-1 program were
calculated based on the sums of the estimated property values in the south central section of the
county (US\$98,800 per ha) and averaged estimates of restoration costs (US\$4,133 per ha for
sites of "row crop" designation and US\$2,066 per ha for mixed agriculture and grassland
designations). The restoration costs were obtained from two firms that specialize in prairie

restoration projects in the Midwest (Snyder et al., 2007). The restoration cost of the habitat
patches within each site was based on the total habitat area and land use (e.g., row crop or mixed
agriculture) of the site.

394 <u>7.) Formulate model:</u> We used custom computer programming code to formulate the
 395 optimization models populated with data that was generated in steps 1-6. Table 1 provides
 396 information about the size of the resulting 0-1 programs in terms of the number of variables and
 397 constraints.

398 8.) Solve model: The ten models, corresponding to the ten contiguity settings and a US\$49-399 50 million budget range, were solved to optimality using a combination of commercial solvers 400 and multi-objective mathematical programming techniques. The total available expenditures 401 were defined based on the funding levels raised by the Forest Preserve District of Kane County 402 for new land acquisitions through referenda and grants (Snyder et al., 2007). A multi-objective 403 optimization technique, the Alpha-Delta Algorithm (Tóth et al., 2006), was used to enumerate all 404 habitat selection strategies within the US\$49-50 million budget range and subject to each of the 405 ten contiguity thresholds. Each alternative strategy found by the algorithm was Pareto-optimal 406 with respect to the dual objectives of reserve area maximization and cost minimization. A habitat 407 selection strategy is Pareto-optimal (Pareto, 1909) or non-dominated in the context of this bi-408 objective optimization model if no other strategy is available that would improve at least one of 409 the two objectives without compromising the other.

The Alpha-Delta Algorithm was designed to solve multi-objective optimization problems, where the available decision alternatives are discrete. In the case of reserve selection problems, "discrete" refers to the fact that conservation agencies, such as the Forest Preserve District, can either purchase a site in its entirety or not. Fractional parcel purchases are not possible. The

414 algorithm first finds the best site selection strategy by calling a commercial solver (4-thread 415 parallel solver, CPLEX 11.0, ILOG, 2007) that solves the optimization problem given the 416 maximum, US\$50 million budget. The algorithm then identifies the rest of the compromise site 417 selections between the preset bounds of US\$49 and 50 million by sequentially constraining the 418 budget levels and calling CPLEX 11.0 repeatedly. The goal was to find multiple solutions at 419 each contiguity threshold that differ in total acquisition costs. For example, a conservation 420 organization might want to know how much less total area can be protected at a given contiguity 421 threshold, say at 100 ha, if they wish to spend US\$1 million less on new acquisitions. The 422 mechanics of the Alpha-Delta Algorithm is described in Tóth et al. (2006): there are two 423 parameters, alpha and delta, which were set to 1 degree and US\$1, respectively. These settings 424 ensured that all alternative site selections were found between the US\$49 and 50 million budgets 425 that are more than US\$1 apart from one another in terms of acquisition costs.

We sought to demonstrate the exact nature of the tradeoffs between total land area purchasedand acquisition cost for ten different levels of the minimum patch size requirement.

428

429 **Results and Discussion:**

The results of the case study are summarized in Figure 3 and Table 2. The diagram in the center of Figure 3 illustrates how the size of the new acquisitions is traded off against acquisition costs and minimum patch size requirements. Each point in the chart, indicated by diamonds or squares, represents a Pareto-optimal reserve selection strategy and corresponds to one entry in Table 2. The parcel selections that are associated with the same minimum contiguity threshold are connected by lines. Solutions do not exist on the lines between adjacent points. The resulting curves form the so-called *efficient* or production possibilities frontiers that visualize the tradeoffs

437 between acquisition costs and total reserve size as a function of contiguity thresholds. These non-438 contiguous curves bear a unique significance for conservation planners: each separate the region 439 where dominated site selections might exist from the region where no solutions exist. Clearly, 440 site selections above the curves would be of no interest to decision makers because at least one 441 of the solutions on the curves offers better achievements in terms of both objectives. 442 The most important result is that there is hardly any tradeoff between the minimum 443 contiguity requirements in the 100-350 ha range and the total size of the reserve. More than 444 tripling the contiguity threshold would only result in a roughly 10 ha ($\sim 2\%$) loss in total 445 protected area (Table 2). There are no tradeoffs at all among the 250, 300 and 350 ha thresholds 446 as the Pareto-optimal site selections are identical in the US\$49-50 million budget range. In other 447 words, if a 250 ha minimum patch size is specified, the optimal parcel selections will provide 448 effective habitat patches that are already more than 350 ha in size. The acquisition cost savings 449 and gains in total reserve sizes are minimal even when the minimum patch size requirement is 450 reduced to 200 ha. The efficient frontiers that correspond to the 200 vs. the 250-350 ha 451 thresholds are essentially identical.

452

/Figure 3/

A relatively large jump occurs in total new reserve size (5-8 ha) and acquisition cost savings (roughly US\$500,000-800,000) when the minimum patch size requirements are lowered from the 200 ha to the 100-150 ha level (Figure 3). Looking at the maps that illustrate some of the solutions in the 100, 120 and 150 ha range (Parcel Selections 3, 4 and 5) versus the ones that correspond to the 200-350 ha range (Parcel Selections 1 and 2), and analyzing Table 2, one could speculate that the stricter contiguity requirements allow only two patches (rarely three) to be

459 acquired where three or four patches are possible if the size requirements are lowered to the 100-460 150 ha range.

The vertical spacing of the frontiers for the 100, 120 and 150 ha minimum patch sizes implies that moving from 100 to 150 ha costs only US\$200,000 on average or less (0.4% of the total budget) in terms of acquisition and restoration expenditures. By looking at the horizontal spacing of the three curves, one can also observe that the same change in contiguity policy would lead to a minute 3-4 ha loss in the total area of new acquisitions.

466 Site selections subject to the 400, 450 and 500 ha contiguity thresholds (shown on the small 467 sub-diagram on the lower left of the main chart area) were only possible by acquiring habitat 468 patches next to the core (see the map of Parcel Selection 6 on the lower left of Figure 3). This is 469 because all potential contiguous habitat aggregations that are independent of the core, are smaller 470 than 400 ha. Consequently, only very few new parcels need to be acquired if the minimum patch 471 size is set to 400-500 ha no matter how much funding is available. The leftover budget can, of 472 course, be used to purchase additional parcels with the caveat that none will allow habitat 473 patches that are larger than 400 ha. After instructing the optimization model to build patches that 474 are at least 200, 250, 300 or 350 ha in size while retaining the now >500 ha core, we found that 475 the best option is to purchase 12 extra parcels that form 295.6 ha of contiguous grassland habitat 476 independent of the core. This 430.6 ha new acquisition would cost the District US\$49.94 million. 477 Compared to Parcel Selection 1 (Figure 3), where a 489.9 and a 379.8 ha patch can be protected 478 for roughly the same price (US\$49.91M), this choice would mean a loss of 30 ha in total new 479 reserve area. It is up to the District to decide if having a 544.1 ha instead of a 489.9 ha patch is 480 worth the loss in total area or the loss in the size of the second patch.

481

/Table 2/

482 In addition to reserve sizes and acquisition costs, Table 2 provides information about the 483 patch size distributions that are associated with each Pareto-optimal parcel selection strategy. It 484 is notable that while three or even four contiguous patches are the norm for the 100-150 ha 485 series, only two or maximum three patches are possible for the 200-350 ha contiguity settings. 486 This could be viewed as the fragmentation effect of looser contiguity policies because the total 487 reserve sizes are roughly the same in both groups. The relative rigidity and irregularity of the 488 individual patch sizes are the result of the discrete nature of the site selection problem. 489 Finally, Figure 3 reveals that some of the patches have irregular shapes and potentially high 490 perimeter-area ratios. There is evidence that the relative amount of edge versus interior habitat in 491 a landscape might be a better predictor of occurrence of some grasslands birds than total 492 contiguous habitat area alone (Helzer and Jelinsky, 1999; Davis, 2004). Optimization modeling 493 techniques, developed to allow natural resource analysts to control the shape of habitat patches in 494 conservation and forest planning (Fischer and Church, 2003 and Tóth and McDill, 2008), can 495 easily be incorporated in the proposed model to ensure lower perimeter-area ratios. For an 496 analysis on how much compactness of old forest habitat patches might cost to forest managers, 497 see Tóth and McDill (2008).

The management implications of the above results for the Forest Preserve District of Kane County are clear. If it is known that more is better for grassland birds in terms of contiguous habitat size, then it might make sense to consider a 150 ha requirement versus a 100 ha one, or a 350 ha versus a 200 ha one because the associated extra acquisition costs or losses in total reserve size are minimal. There is an 8-10 ha loss in total reserve size when a 200-350 ha policy is followed instead of a 100-150 ha policy. A 30 ha loss in total reserve size must be accepted if the District wants at least one patch to be larger than 500 ha. These are helpful recommendations

505 for a conservation planner if the wildlife biological investigations that consider grassland bird 506 reproduction and dispersal success as a function of contiguous habitat size are inconclusive. 507 Additional, potentially expensive, biological experiments to determine whether a species 508 disperses better on contiguous habitat patches that are larger than 150 ha versus 100 ha might not 509 be necessary if there are no extra costs associated with moving from a 100 ha to a 150 ha rule. 510 While the management implications of this particular case study are clear, none of these can 511 be generalized to other conservation projects. The spatial arrangement and the size or shape of 512 the parcels or the effective habitat patches might be very different even in nearby areas. Land 513 prices and restoration costs might be different, as well as the contiguity requirements of the 514 target species. A rigorous analytical tool, such as the one proposed in this paper, is needed to 515 identify cost-efficient opportunities to preserve reserves with spatial attributes that are as 516 conducive to the survival of certain species or ecosystems as possible. 517 Grassland birds in the American Midwest are not the only sensitive species that suffer if

518 large contiguous patches of suitable habitat are unavailable. Fragmentation of open space, 519 especially near urban centers, is a global problem. As an example, the Northern Spotted Owl 520 (Strix occidentalis caurina) in the Pacific Northwest prefers interior old-forest habitat in large 521 patches surrounded by edges that provide habitat for its prey. The financial ramifications of 522 implementing forest management plans that ensure such habitat structures are forgone timber 523 revenues. The biological conservation implications of the study presented in this paper is that 524 opportunities might exist in the course of a site acquisition or retention effort or during forest 525 management planning that lead to significant improvements in contiguous habitat protection at 526 minimal costs. The proposed model can help conservation planners identify these opportunities. 527

528 <u>Conclusion:</u>

529 This article presented the first site selection model that explicitly accounts for minimum 530 contiguous habitat size requirements regardless of the shape or the spatial configuration of the 531 candidate sites. The model allows conservation planners to rigorously analyze and weigh the 532 pros and cons of different minimum habitat patch size policies in open space acquisition or 533 retention projects. A pilot application of the model to grassland conservation in the Midwestern 534 United States clearly demonstrated that the tradeoff information provided by the approach can 535 have a tremendous value for decision makers. In the specific example presented in this study, 536 land acquisition expenditures as well as the total size of the potential reserves were found to be 537 largely insensitive to broad ranges of contiguous habitat size specifications. Clearly, the 538 management implications of this information are significant in terms of how Kane County 539 community planners will set aside reserves in the future for grassland birds that are sensitive to 540 habitat contiguity. The utility of the approach arises from the fact that, due to the combinatorial 541 nature of reserve site selection problems, it is nearly impossible to foresee what the tradeoffs or 542 costs of different habitat size specifications would be with respect to a variety of conservation 543 criteria at a particular site.

544 The limitation of the method is its potentially high computational cost. Both the formulation 545 of the model, which requires a specialized recursive enumeration, and the solution procedure can 546 entail substantial computing times. The computational expense of the cluster enumeration effort 547 primarily depends on the number, spatial connectivity and average size of the candidate habitat 548 patches relative to the contiguity threshold. The more connected and more numerous the patches 549 are and the greater the contiguity threshold is relative to the size of the patches, the more effort is 550 needed to enumerate the clusters. The computational boundaries, in turn, limit the spatial and 551 temporal scale at which the proposed method can be applied today. Ongoing dramatic

552	improvements in computational power and optimization technology, however, suggest that the
553	future role of combinatorial optimization models in conservation planning will likely become
554	more significant than it is today.

555 Finally, the model presented in this paper is static in a sense that it assumes that land prices 556 do not change over time or as a result of conservation purchases. This assumption might not hold 557 if the availability of open space for conservation or real estate development is limited and yet the 558 demand is high for these uses (Polasky, 2006). Although using specialized combinatorial 559 techniques it is possible to extend the discussed model to account for land price feedback effects, 560 we opted not to include a dynamic version of the model in this presentation in order to retain the 561 focus on contiguity. The development of a spatially-explicit reserve selection model with 562 adaptive cost coefficients is the subject of ongoing research.

563

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/1/	Captions:	
718		
719	Table 1.	Model size and computational expense
720	Table 2.	Acquisition cost, total protected effective area and patch size distribution for each
721		efficient parcel selection strategy. Each row corresponds to an optimal solution in the
722		US\$49-50 million budget range. The last three or four columns list the patch sizes that
723		make up the solution. Note that the size of an individual patch can far exceed the
724		contiguity threshold due the interactions between contiguity and budget specifications
725		in the model.

- 1 -

a ...

- Figure 1. The geographical location of the Kane County study area (source: Illinois Natural
 Resources Geospatial Data Clearinghouse). The gray patches (polygons) on the
 state map (upper right corner) represent municipal areas. The location of Kane
 County in relation to urban Chicago is indicated by a small rectangle with black
 boundaries.
- 731 **Figure 2.** Spatial terminology: parcels (sites), habitat patches, clusters and buffers
- 732 **Figure 3.** Efficient parcel selections near the Dick Young Forest Preserve using 100, 120, 150,
- 733 200, 250, 300, 350, 400, 450 and 500 ha minimum contiguous patch sizes

7	2	5
1	J	J

Table 1.							
Minimum	Number of				Solution 7	Solution Time (hrs)	
Patch Size (ha)	Clusters	Variables (columns)	Constraints (rows)	Efficient Solutions	Total	Average	
100	21,443	21,374	42,632	31	20.74	0.67	
120	48,762	48,477	96,838	37	66.11	1.79	
150	124,012	122,891	245,685	24	273.30	11.39	
200	227,692	222,162	444,227	22	266.12	12.10	
250	96,418	77,425	154,766	12	19.14	1.60	
300	31,412	8,223	16,392	12	0.07	0.01	
350	8,900	1,330	2,627	12	0.05	0.00*	
400	141	46	82	1	0.00*	0.00*	
450	284	294	578	1	0.00*	0.00*	
500	490	500	990	1	0.00*	0.00*	

*: Solution times were 17 seconds or less

Table 2.

Minimum Contiguous Habitat: 100ha							Minimum Contiguous Habitat: 120ha						М	Minimum Contiguous Habitat: 150ha						Minimum Contiguous Habitat: 200ha					
	Cost	Cost Total Patch Sizes (ha)					Cost Total			Patch Sizes (ha)				Cost	Total Patch Sizes (ha)		ha)		Cost	Total	Patch Sizes (ha)				
	(US\$M)	Area (ha)	Patch1	Patch2	Patch3	Patch4		(US\$M)	Area (ha)	Patch1	Patch2	Patch3		(US\$M)	Area (ha)	Patch1	Patch2	Patch3		(US\$M)	Area (ha)	Patch1	Patch2	Patch3	
1	49.97	471.1	264.8	104.8	101.5		1	49.95	469.9	337.4	132.5		1	49.99	468.5	278.7	155.8	34.0*	1	50.00	460.8	254.5	206.4		
2	49.88	470.9	337.4	104.8	28.7*		2	49.94	469.2	306.4	134.2	28.7*	2	49.92	467.5	278.7	154.8	34.0*	2	49.99	460.7	254.5	206.2		
3	49.84	469.9	263.6	104.8	101.5		3	49.87	468.5	337.4	125.7	5.4*	3	49.84	466.7	278.7	154.0	34.0*	3	49.91	460.6	379.8	80.8*		
4	49.79	469.4	337.4	103.3	28.7*		4	49.86	468.0	266.6	132.5	69.0*	4	49.81	466.4	278.7	159.1	28.7*	4	49.88	460.0	247.6	207.1	5.4*	
5	49.78	469.0	247.6	120.0	101.5		5	49.80	468.0	278.7	125.7	63.6*	5	49.81	466.2	278.7	153.5	34.0*	5	49.86	459.9	247.6	206.9	5.4*	
6	49.73	468.8	262.5	104.8	101.5		6	49.79	467.7	337.4	125.0	5.4*	6	49.80	466.0	278.7	153.3	34.0*	6	49.83	459.8	247.6	206.9	5.4*	
7	49.73	468.8	262.4	104.8	101.5		7	49.70	467.5	306.4	132.5	28.7*	7	49.79	465.9	278.7	158.6	28.7*	7	49.78	459.4	364.6	94.7*		
8	49.72	468.7	233.7	104.8	101.5	28.7*	8	49.68	466.5	337.4	129.1		8	49.75	465.5	278.7	158.2	28.7*	8	49.71	459.3	247.6	206.4	5.4*	
9	49.69	468.4	337.4	102.4	28.7*		9	49.62	466.1	306.4	125.7	34.0*	9	49.72	465.2	278.7	152.5	34.0*	9	49.70	459.2	247.6	206.2	5.4*	
10	49.67	467.6	278.7	120.0	28.7*		10	49.61	465.5	278.7	123.2	63.6*	10	49.66	465.0	278.7	152.3	34.0*	10	49.65	458.7	247.6	211.1		
11	49.59	467.5	232.5	104.8	101.5	28.7*	11	49.60	465.4	306.4	125.0	34.0*	11	49.66	465.0	278.7	152.3	34.0*	11	49.53	457.8	376.9	80.8*	F 4+	
12	49.56	466.6	337.4	100.5	28.7"		12	49.54	465.3	306.4	125.0	34.0"	12	49.62	464.9	278.7	157.6	28.7"	12	49.49	456.5	247.6	203.6	5.4"	
13	49.50	400.0	337.4	100.4	28.7°	20 7*	13	49.53	465.1	306.4	130.1	28.7	13	49.57	464.6	2/8./	157.3	28.7	13	49.45	456.2	247.0	208.6	<u>00 7</u> *	
14	49.40	400.4	231.4	104.0	101.5	20.7	14	49.51	465.0	300.4	107.4	20.7	14	49.44	464.0	270.7	150.7	20.7	14	49.44	400.1	224.7	202.7	20.7	
16	49.40	400.4	201.4	104.0	24.0*	20.7	16	49.49	404.9	266.6	127.4	62.6*	16	49.30	403.2	210.1	161.6	20.7	16	49.40	455.7	200.0	202.7	5 / *	
17	49.40	405.2	220.3	103.9	101 5	34.0*	17	49.49	404.4	200.0	124.2	5.0	17	49.30	402.1	200.0	15/ 8	28.7*	17	49.29	455.7	247.0	202.7	5.4	
18	49.40	465.0	224.7	104.0	101.5	28.7*	18	49.43	464.2	337.4	121.0	5.4*	18	49.31	461.4	278.7	154.0	20.7	18	49.24	454.7	247.0	201.0	5.4	
19	49.37	464.9	247.6	115.8	101.5	20.7	19	49.42	464 1	337.4	126.7	0.4	19	49.20	460.9	278.7	153.5	28.7*	19	49.22	454.2	385.2	69.0*		
20	49.36	464.7	253.0	104.8	101.5	5 4*	20	49.36	463.8	278 7	121.6	63.6*	20	49 19	460.7	278.7	153.3	28.7*	20	49.09	454.0	247.6	206.4		
21	49.28	464.2	247.6	111.8	101.0	0.1	21	49.36	463.7	278.7	121.0	63.6*	21	49 11	459.8	278.7	152.5	28.7*	21	49.08	453.8	247.6	206.2		
22	49.25	464.2	325.3	104.8	34.0*		22	49.35	463.2	337.4	125.8	00.0	22	49.05	459.7	278.7	152.3	28.7*	22	49.01	453.8	372.9	80.8*		
23	49.21	463.2	251.5	104.8	101.5	5.4*	23	49.32	463.1	325.3	132.5	5.4*	23	49.04	459.6	278.7	152.3	28.7*							
24	49.18	463.0	322.3	106.6	34.0*		24	49.26	463.1	337.4	125.7		24	49.03	458.9	278.7	151.6	28.7*	Min. Contig. Habitat: 250-300-35						
25	49.12	462.7	337.4	120.0	5.4*		25	49.25	462.6	266.6	132.5	63.6*								Cost	Total	Patc	h Sizes ((ha)	
26	49.07	462.4	323.6	104.8	34.0*		26	49.24	462.5	306.4	127.4	28.7*								(US\$M)	Area (ha)	Patch1	Patch2	Patch3	
27	49.06	462.2	278.7	120.0	63.6*		27	49.24	462.4	337.4	125.0								1	49.91	460.6	379.8	80.8*		
28	49.04	462.1	255.8	104.8	101.5		28	49.21	462.4	278.7	120.1	63.6*							2	49.85	459.8	371.5	88.3*		
29	49.01	461.8	247.6	107.3	101.5	5.4*	29	49.18	462.4	337.4	125.0								3	49.78	459.4	364.6	94.7*		
30	49.01	461.6	247.6	107.2	101.5	5.4*	30	49.18	462.0	306.4	121.6	34.0*							4	49.73	459.2	378.3	80.8*		
31	49.00	461.5	247.6	112.5	101.5		31	49.17	461.8	306.4	121.4	34.0*							5	49.67	458.3	370.0	88.3*		
							32	49.16	461.7	306.4	126.7	28.7*							6	49.53	457.8	376.9	80.8*		
							33	49.14	461.4	323.6	132.5	5.4*							7	49.45	455.8	372.9	82.9*		
							34	49.09	460.9	285.5	146.7	28.7*							8	49.30	455.3	379.8	75.5*		
							35	49.08	460.9	264.8	132.5	63.6*							9	49.24	454.4	371.5	82.9*		
							36	49.06	460.7	294.3	132.5	34.0*							10	49.20	454.2	385.2	69.0*		
							37	49.01	460.7	306.4	125.7	28.7*							11	49.12	453.8	378.3	75.5*		
																			12	49.01	453.8	372.9	80.8*		
																			Min Contig Habitat: 400-450-500ba						
																				Cost	Total	Pate	h Sizes ((ha)	
																				(115\$M)	Δrea (ha)	Patch1	Patch?	Patch?	
• p	atches	smaller th	nan the n	ninimuu	m conti	nuoue k	ahita	at size s	necificatio	n are a	diacent	to the	409 -	ha core	2				1	18.76	135 1	135.1	i alunz		
. r	Patches smaller than the minimum contiguous habitat size specification are adjacent to the 409.1 ha core												10.70	135.1	133.1										





Legend



Feasible Cluster of Habitat Patches

Figure 2.



Available Parcels

760



Figure 3.