

ENVIRON 761:

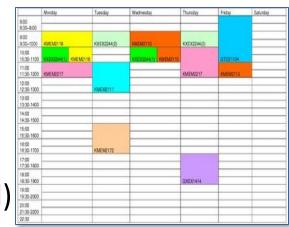
Prioritization, Optimization & Conservation Area Selection

Instructor: John Fay

Choosing classes:

Can't take them all...

- Select classes that favor criteria
 - Topic (applicable or not-related)
 - Interest (captivating or boring)
 - Logistics (schedule conflicts)
 - Requirements (GIS certificate?)



- What is the best combination of classes?
 - Depends on your preferences, your options, your situation

How do you decide?

Choosing conservation sites:

Can't protect them all...

Select sites that favor criteria

Geometry (core area, shape index)

Threats (unthreatened, desperate for protection)

Connectivity (betweenness centrality, corridor potential)

Biodiversity (richness, rarity)

■ Cost (\$\$\$)

- What is the best portfolio of potential sites?
 - Depends on mission, options, situation

How do you decide?

Prioritization & Reserve Design

General question...

How can we optimize the selection of sites for protection to meet multiple conservation objectives?

Multi-Attribute Decision Analysis

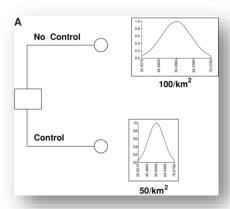
Methods for making decisions when:

- Outcome is uncertain
- Multiple [conflicting] objectives
- Multiple [conflicting] stakeholder interests

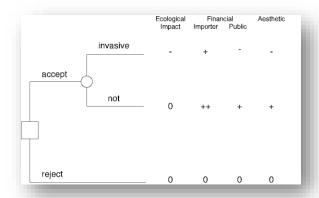
Approaches include:

- Articulating goals
- Expressing priorities among these goals
- Providing framework for communication

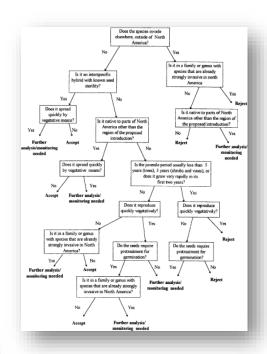
Multi-Attribute Decision Analysis



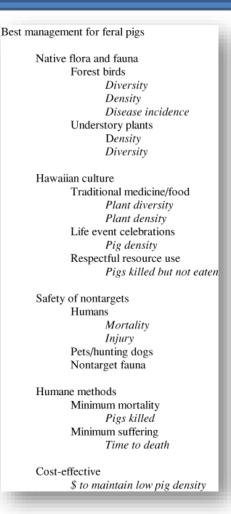
Probability models



Values models



Decision trees



Objectives hierarchy

Landscape Prioritization: Attributes

Patch/HUC Geometry

Patch/HUC Threat Patch/HUC Connectivity

Patch/HUC Biodiversity



=														
N.	OID	HABPATCH		194400	SHAPEINDEX 245	PCTCORE	WTDTHREAT 20	HUMANKDENS 0	EDIST2ROAD 3964	CDIST2DEV 3977	BETWEENNES	RICHNESS 3	EVENNESS 83	-
	0 1	1 2	162	194400	245	16	20	1	1273	1236	34	7	153	
ᅥ		3	46	0	0	12	20	3	2124	2232	2	4	91	
۲	3	4	120	1158300	289	9	40	3	0	2232 N	18	7	147	
٦	4	5	15	170100	229	0	34	1	1018	988	46	3	81	
┪	5	6	19	0	0	0	40	4	0	0	58	4	122	
╗	6	7	13	1911600	348	16	35	6	0	0	56	6	118	
	7	8	158	1393200	183	41	20	0	2072	2233	6	6	126	
	8	9	34	0	0	0	40	3	450	458	54	3	82	
	9	10	198	3061800	249	50	22	7	764	741	18	4	102	
\Box	10	11	6	178200	213	0	20	2	5022	5048	2	3	79	
Ц	11	12	44	907200	250	19	40	4	0	0	18	4	122	
Ц	12	13	35	0	0	0	25	1	1080	1058	8	3	88	
Ц	13	14	67	688500	347	1	36	0	764	844	6	3	64	
Ц	14	15	37	882900	206	22	33	0	525	555	4	5	82	
Ц	15	16	30	348300	206	0	20	0	0	11903	0	2	11	
Ц	16	17	2	259200	221	0	40	0	180	377	6	3	45	
Ц	17	18	5 36	162000	190	0 7	40	0	180	215	4	1	0	
Н	18	19		469800	217	'	20	5	4122	4144	18	3	77	
\dashv	19 20	20	179	1539000 170100	247 229	24	40 15	2	0 6004	0 6817	6	5	101	
4	20	21	6	218700	229	0	15	0	6165	12720	8	3	68	
\dashv	22	22	23	210700	231	0	10	0	3610	15776	8	2	35	
\dashv	23	24	1	0	0	0	10	0	5043	13776	14	3	74	
\dashv	24	25	87	4746600	613	11	32	0	0	15700	26	4	73	
۲	25	26	18	283500	177	0	10	0	3097	14893	10	3	96	
۲	26	27	1	251100	153	3	10	0	4075	14341	8	3	59	
٦	27	28	38	348300	145	7	20	1	450	3976	22	4	115	
-		1 00	- 40	050400	070	-	4.7		_	10570	10		400	
	Re	cord: 14 4	Record: 14 4 1 1 P N Show: All Selected Records (0 out of 671 Selected) Options +											

Landscape Prioritization: Sorting

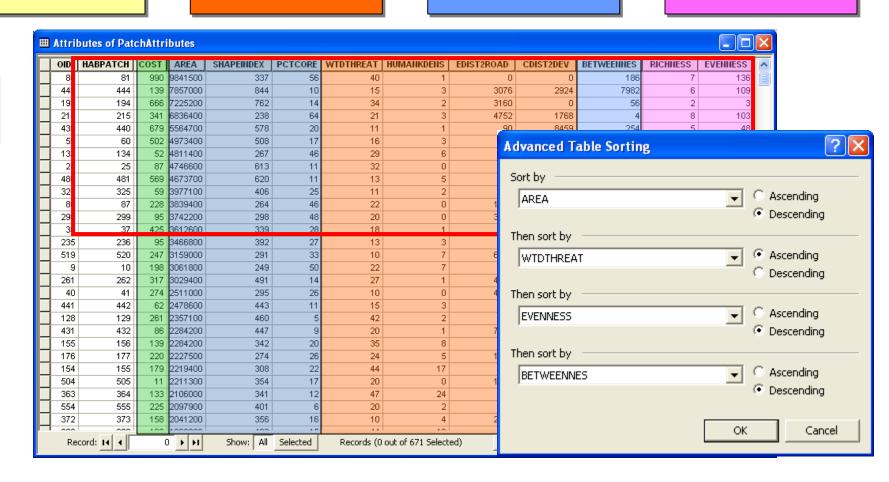
Patch/HUC Geometry

Patch/HUC Threat

Patch/HUC Connectivity

Patch /HUC Biodiversity





Landscape Prioritization: Sorting

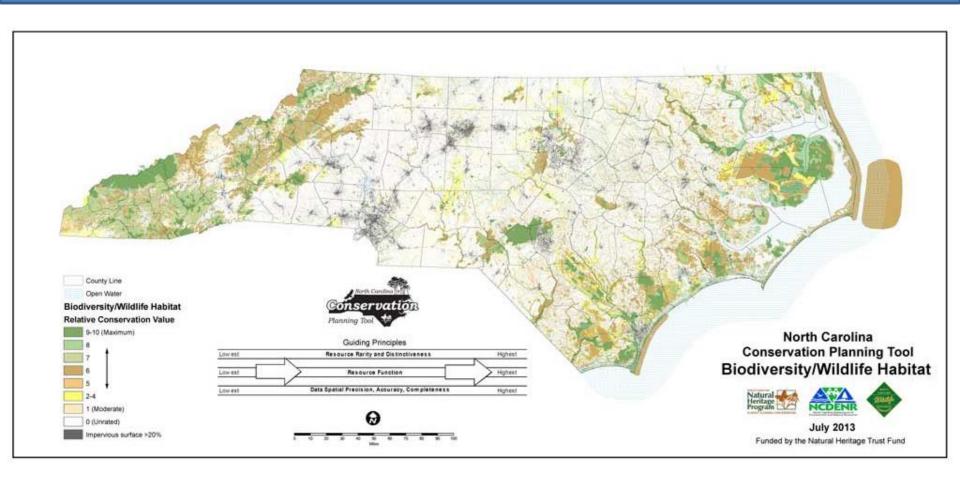
- Useful when objectives are clear and attributes accurately reflect those objectives:
 - Objective: pronghorn viability
 - Approach:
 protect as much unthreatened habitat area as possible,
 (given the budget of the program)
 - Method:
 - Sort by Area, then by Wtd. Threat
 - Select patches until budget is spent

Landscape Prioritization: Sorting

- Sort on most important attribute
 - Keep top *X*%...
 - Determine cost cuts still required
- Sort on 2nd most important attribute
 - Keep top *X*%...
 - Determine cost cuts...

How much more important is attribute 1 than 2, and so on??

NC Conservation Plan



http://portal.ncdenr.org/web/cpt/cpt-report

NC Conservation Planning tool

Appendix C: Relative Criteria Ranking for the BIODIVERSITY / WILDLIFE HABITAT ASSESSMENT

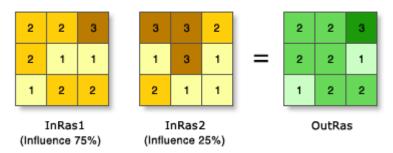
Lowest	Resource Rarity and Distinctiveness	Highest
Lowest	Resource Function	Highest
Lowest	Data Spatial Precision, Accuracy, Completeness	Highest

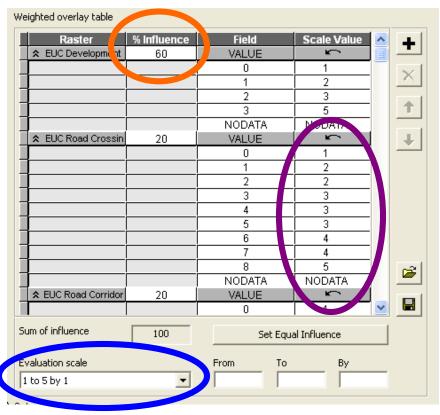
Moderate								Max	kimum
1	2	3	4	5	6	7	8	9	10
	CREWS-			NWI	CREWS -	CREWS			
	Beneficial			Wetlands	Substantial	Exceptional			
LHI Guild									LHI Guild
(1)									(10)
							HQW (select)	ORW	
								(select)	
							Oyster		
							Sanctuaries		
					Submerged		Fish Nursery		
					Aquatic		Areas		
					Vegetation				
				Shellfish		Hard	Shellfish		
				Closed -		Bottom	Open -		
				Shellbottom		DWQ	Shellbottom	DWQ	
						Stream		Stream	
						Bioclass		Bioclass	
						Good		Excellent	
							Anadromous	Wild	
							Fish	Trout	
							Spawning	Waters	
All		Streams in				Stream			
Streams		Priority				Buffer tribs.			
		Watersheds				to T&E			
					Important Bird Areas				
							0.1114		011114
					SNHA – General		SNHA – High and		SNHA – Outstanding
					Rating		Moderate		and Very
					reading		Ratings		High
									Ratings
			EO -	EO - High					
			Other						



Page 6 of Chapter 4: Maximum Ranking Approach

Landscape Prioritization: Weighted Overlay



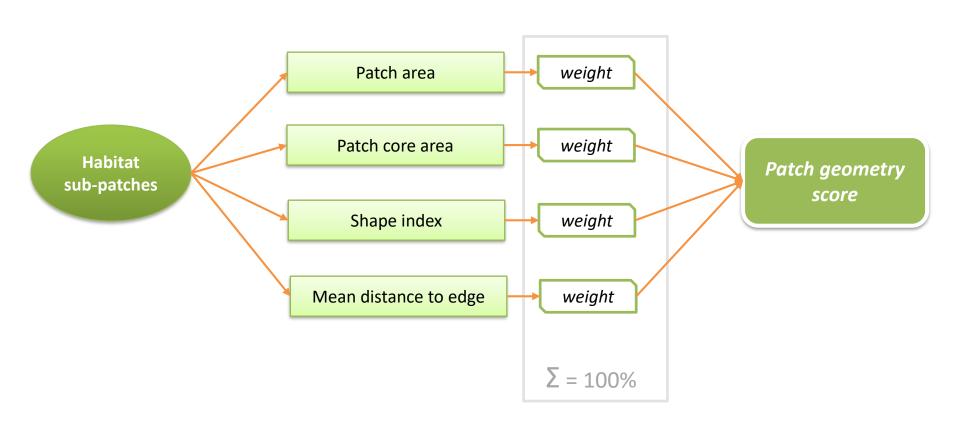


 Number of output classes

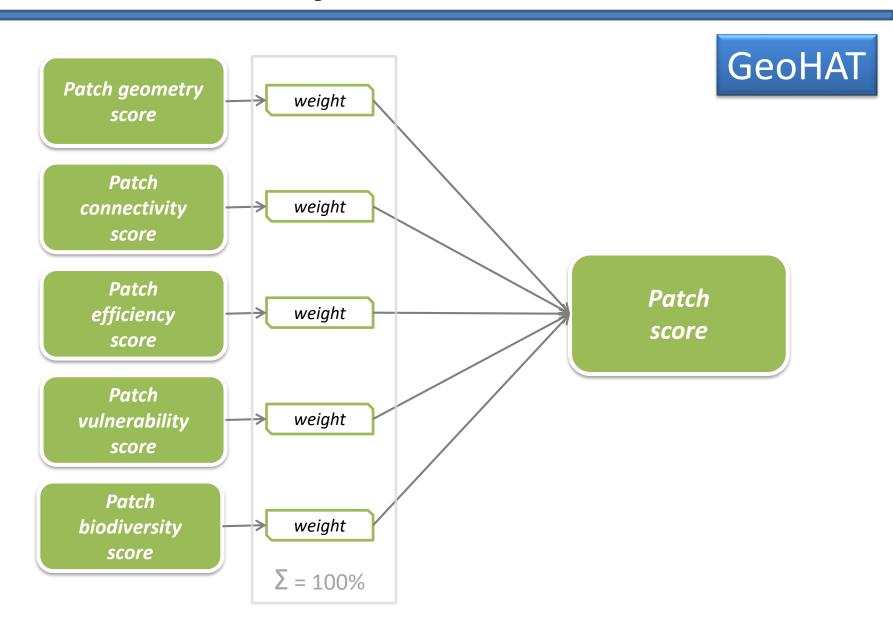
- % influence of each input
 - Development = 3x others
- Scale values
 - Extreme impact = 5
 - Minimal impact = 1

Landscape Prioritization: Weighted Overlay





Multi-attribute synthesis



Selection algorithms: Greedy

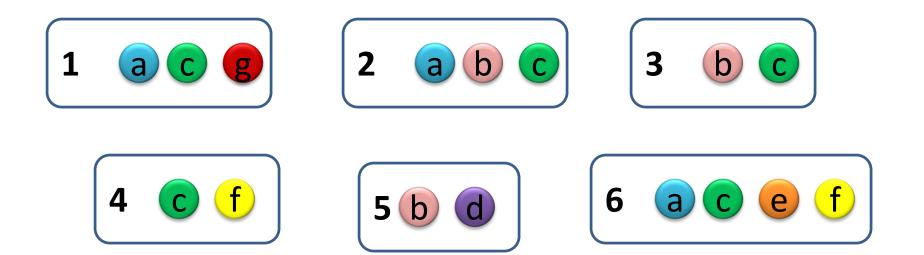
Sorting (on raw data or weighted overlay data) is a purely greedy approach:



 Searches for (via sorting) and takes the best X number of patches until criteria is met

It does not necessarily arrive at most parsimonious solution!

Selection algorithms: *Greedy*



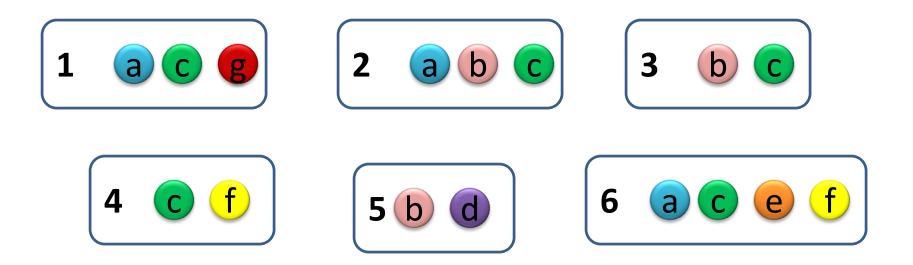
Pick #1: *Site 6*

Pick #2: *Site 1* or *2*

Pick #3: *Site 1* or *2*

Choose the richest remaining site...

Selection algorithms: Greedy Heuristic



Pick #1: *Site 6*

Pick #2: *Site 5*

Pick #3: *Site 1*

Choose the best remaining site that complements chosen sites

Greedy heuristics ...

Advantages:

- intuitive
- easy for small number of sites and targets (perhaps by inspection)

Disadvantages:

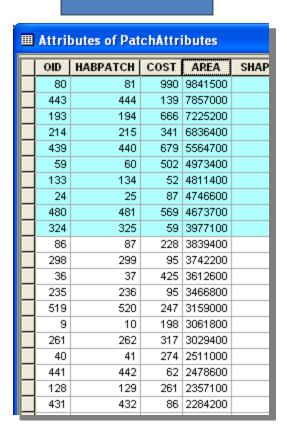
- hard or slow for large number of sites or targets
 - Have to examine each alternative; sequence matters...
- may not get the right answer (!)

Greedy heuristics ...

<u>Species</u>	Α	В	<u>C</u>	
shrike	1	1	1	
owl	1	1	0	Optimal solution:
g. sparrow	1	0	1	sites B & C
hawk	1	1	0	
thrasher	1	1	0	Greedy solution:
grouse	1	0	1	sites A, B, & C
s. sparrow	1	1	0	(A first)
pelican	1	1	0	
eagle	0	0	1	
<u>tern</u>	0	1	0	
Total S	8	7	4	

Selection Algorithms: Greedy

Greedy

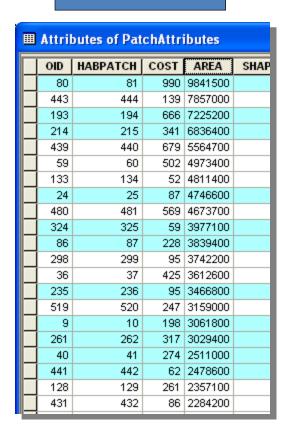


"The top X patches are selected"

Each patch selection is made independent of what is found in other patches.

Selection Algorithms: *Greedy Heuristic*

Greedy Heuristic



Heuristic = self learning

Patch selections are made to complement existing patch selections

Patch #194 complements patch #81 better than patch #444 ...

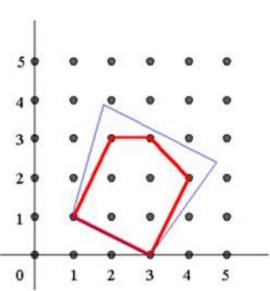
81 abcd xyz

444 a b d x y

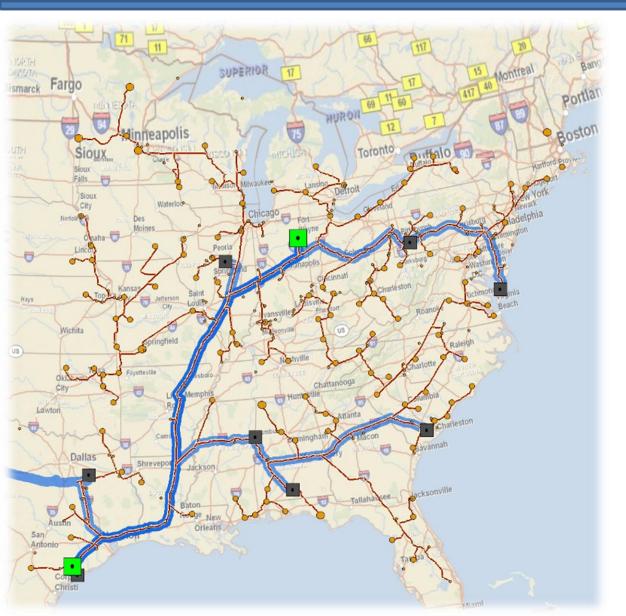
194 pqrs

Greedy heuristics & linear programming

- Integer programming and Integer goal programming: Integer programming are linear programming techniques derived from operations research that iterate through possible combinations of variable until the optimal result (as defined in the decision rules) is achieved.
- Pluses: Offers a comparable, optimal solution
- Minuses: can be very CPU intensive and potentially impractical to employ



Linear programming, an example



Find optimal pipeline configuration to line coal-fired power plants with carbon sequestration sites...

- Where to start routes?
- Order of linking sites to pipeline?
- Redundancy?
- New sites?

Selection Algorithms: Integer programming

Examine all unique combinations of planning units and select the one combination that's the most parsimonious.

The top ranked planning unit may not be a part of that; may lead to "local minimum".

 2^{144} or $> 10^{43}$ unique combinations!!!

Solution: Simulated Annealing - a compromise to finding the optimal combination of patches...

Operations Research

Maximum Covering Location Problems (MCLP):

"Find fewest facilities that cover the most demand"

The MCLP method substitutes the concept of species representation for covered in the algorithm.

This integer program method then <u>converges</u> on a single solution that maximizes representation for the number of site (area) prescribed.

Problem P₁:
$$\min \left\{ \sum_{i=1}^{n} x_{j} \right\}$$
s.t.
$$\sum_{j=1}^{n} \phi(d_{ij}) x_{j} \geqslant T y_{i} \quad i \in \mathbb{N}$$

$$\sum_{i=1}^{n} y_{i} w_{i} \geqslant \alpha W$$

$$x_{j} \in \{0, 1\}; \quad y_{i} \in \{0, 1\} \quad i, j \in \mathbb{N}$$

Marxan: Marine Optimization

MARXAN / SPEXAN / SITES

Optimization programs designed to be used for spatially aggregating habitat patches for optimal coverage.

MARXAN is the marine version of this software, but has become the standard for terrestrial applications too...



http://www.uq.edu.au/marxan/

Marxan & "Simulated Annealing"

Uses "simulated annealing" to find an optimal combination of planning units (patches) that meet a specified objective function.

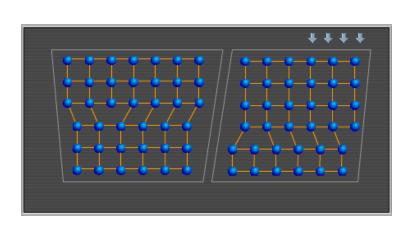
- 1. Begins with seed sites(random or set).
- 2. Randomly selects an additional site
- 3. Computes *gain* of adding that site towards objective function
- 4. Adds the site to solution set *if doing so exceeds a set threshold*.
- 5. The threshold gets higher as more sites are added

"Annealing"??

From metallurgy...

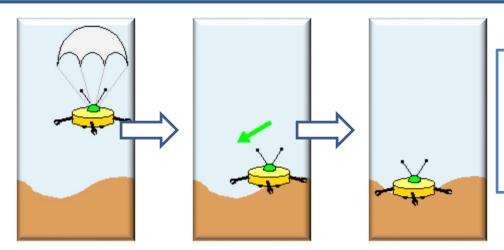




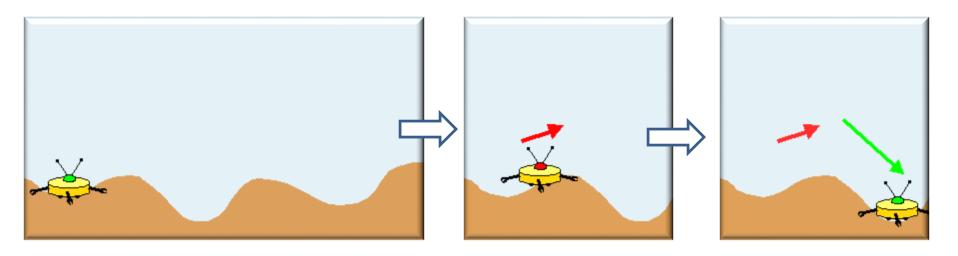




Simulated annealing



- iterative improvement
- random backward movement
- repetition



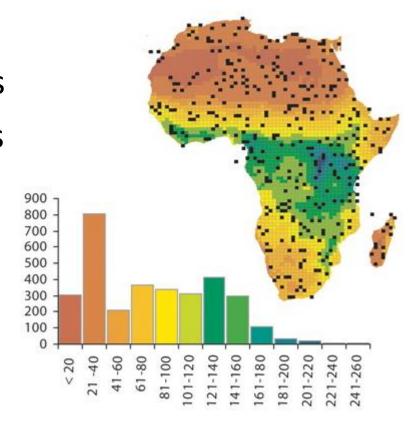
Aliens like low elevations...

Simulated annealing

Advantages:

- finds a good answer
- can assess very large data sets
- can provide multiple solutions (alternative, near-optimal)

- Disadvantages
 - less intuitive, less accessible



http://www.sciencemag.org/content/309/5734/603.full.pdf

Marxan

Purpose:

 To identify suites of planning units (i.e. HUCs) that maximizes conservation goals with the least amount of cost

Required inputs:

- > List of conservation features to be included
- > List of **planning units** (w/cost and other attributes)
- > Cross-list of conservation features within each patch
- > Specified conservation goal & other run time settings

Conservation Features file (spec.txt)

- Conservation features are features (e.g. species) you want represented in your final portfolio of patches
- The conservation feature file includes the <u>type</u> and the <u>desired</u> <u>amount</u> of each feature, as well as a <u>penalty</u> incurred if its not adequately represented.
- id = feature identification number
- target = representation target (area, # occurrences)
- spf = species penalty factor
- name = feature name

spec.txt

<u>id</u>	target	<u>spf</u>	<u>name</u>	
5	10.2	10	Rocky_Mountain_Cliff_and_Canyon	
9	0.4	10	Colorado_Plateau_Mixed_Bedrock_Canyon_and_Tableland	
11	0.8	10	Inter-Mountain_Basins_Active_and_Stabilized_Dune	
12	93.4	10	Inter-Mountain_Basins_Volcanic_Rock_and_Cinder_Land	
14	123.2	10	Inter-Mountain_Basins_Playa	

Conservation Features file (spec.txt)

- The Conservation Features file can be created manually by listing the feature types and the target representation.
- Or, you can set the target to be a proportion of existing conservation features within the planning area directly from the raster or feature attribute tables...

Creating spec.txt file from GAP Cover types:

- 1. Extract GAP data found within patch areas
- 2. Calculate targets as a proportion of cell count (e.g. 30%)
- 3. Add penalty factors (or use constant values)
- 4. Convert table to text file

NOTE: Be sure to convert spaces and commas to underscores!

Planning Unit file (pu.txt)

- Planning units are the discrete land units making up the conservation portfolio; a unit is either included or not.
 - Can be a patch, parcel, catchment, hexagon, etc.
- The planning unit file is a list of list of each planning unit id, the cost incurred by adding it to the portfolio, and a status value indicating whether the unit/patch should be "locked in" to (or out of) the solution.
 - The cost can be in actual dollars or be anything you want minimized (e.g. opportunity cost)

pu.txt

: -1		-4-4
<u>id</u>	cost	<u>status</u>
1	2	0
2	162	0
3	46	0
4	120	1
5	15	0
6	19	0
7	13	0

Planning Unit file (pu.txt)

- The planning unit file can be created directly from the attribute table of the planning unit features....
 - ID = feature ID
 - Cost = a cost-related attribute
 - Status can be altered manually or all set to '0'.

■ Attributes of PatchAttribut							
	OID	HABPATCH	COST	Al			
	0	1	2	19			
	1	2	162				
	2	3	46				
	3	4	120	115			
	4	5	15	17			
	5	6	19				
	6	7	13	191			
	7	8	158	139			
	8	9	34				
	9	10	198	306			
	10	11	6	17			

id	cost	<u>status</u>
1	2	0
2	162	0
3	46	0
4	120	1
5	15	0
6	19	0
7	13	0
8	158	0
9	34	1
10	198	0

Planning Unit v. Cons. Feature file (puvsp.txt)

- The <u>planning unit vs. conservation feature</u> file is simply a cross listing of what species are found in which planning unit and how much.
- It can be created by spatially combining the planning unit (i.e. patches) with the conservation feature (i.e. GAP cover) datasets

■ Attributes of patchgap					
	Rowid	VALUE *	COUNT	HABPATCH	AZ_LANDCOVER
١	0	1	1	1	34
	1	2	13	1	36
	2	3	10	1	67
	3	4	82	2	36
	4	5	129	2	67
	5	6	33	2	76
	6	7	151	2	34
	7	8	3	2	71
	8	9	124	3	67
	9	10	93	3	36

puvsp.txt

<u>amount</u>	<u>pu</u>	<u>species</u>
1	1	34
13	1	36
10	1	67
82	2	36
129	2	67
33	2	76
151	2	34
3	2	71
124	3	67

Optional: Boundary Length Modifier (blm.txt)

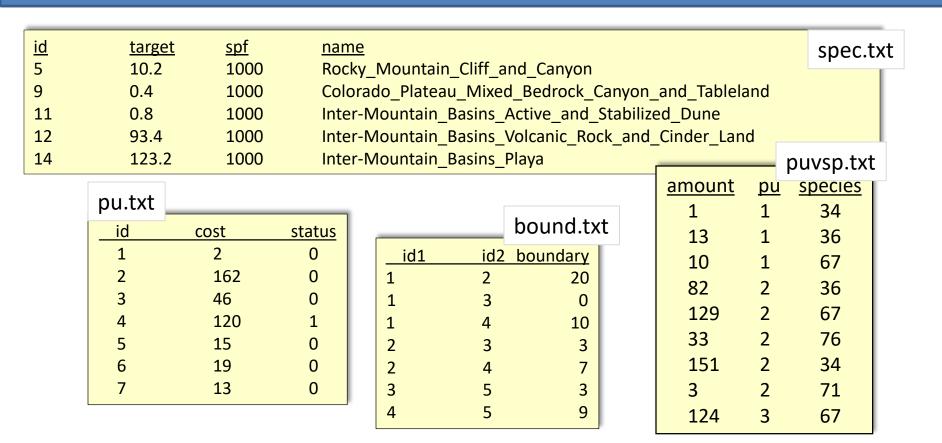
- Used to determine how much emphasis should be placed on minimizing the overall reserve system boundary length (amount of edge)
- Consists of a list of shared edge between planning units.
 Favoring two planning units that share an edge will reduce the overall amount of edge in the final reserve design.

By not including an attached planning unit, the amount of

boundary that would have been included is added as a cost...

id1	id2	boundary
1	2	20
1	3	0
1	4	10
2	3	3
2	4	7
3	5	3
4	5	9

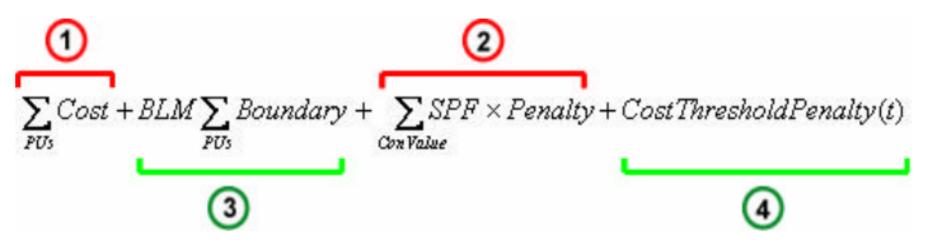
Marxan inputs



How are these "raw materials" used to find "the optimal subset of patches" for a reserve?

MARXAN Objective functions

The objective function is what gives one alternative a "better" score than another.

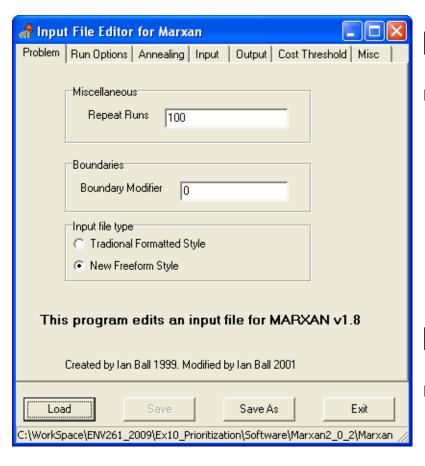


- The total cost of the reserve network (required)
- The penalty for not adequately representing conservation features (required)
- The total reserve boundary length, multiplied by a modifier (optional)
- The penalty for exceeding a preset cost threshold (optional see footnote 3)

MARXAN Run-time parameters: Inedit.exe

- Run-time parameters are held in the <u>input.dat</u> file stored where the MARXAN.exe file is.
- Use Inedit.exe to modify/save settings:
 - Number of repeat runs
 - Annealing options:
 - Number of iterations per run
 - Threshold "cooling"
 - Heuristics
 - Location of inputs/outputs

Marxan run-time options



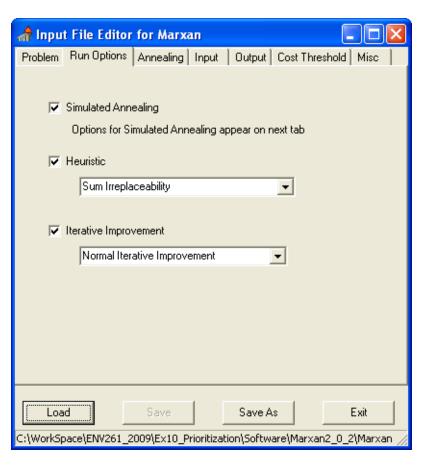
Repeat runs:

Because the optimal solution is not guaranteed, we run several independent runs and compare results.

Boundary modifier:

- Adjusts boundary costs to match patch cost units
 - High value favors compactness

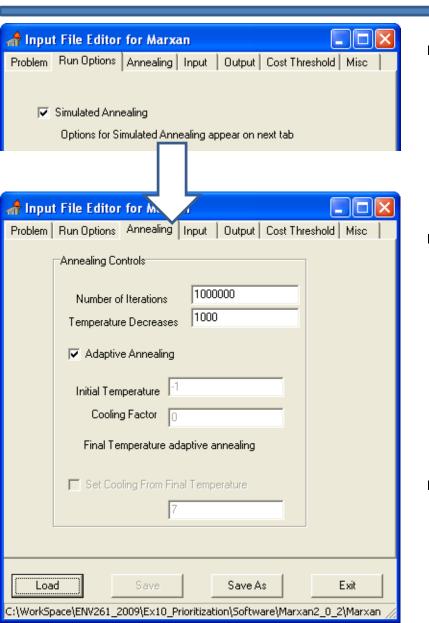
Marxan run-time options



Run Options

- Enable simulated annealing
- Heuristic method to use
- Iterative improvement method

Simulated annealing options



- Iterations at each iteration, a planning unit is switched on (or off, if already chosen) and the change is evaluated via the objective function.
- Temperature decreases the number of temperature decreases to occur across a set of iterations
 - Higher value T° declines faster. Marxan seeks optimization more quickly, but may get "stuck" in a local minima.
- Adaptive Annealing initial temperature and cooling rate are set by sampling the input data

Marxan: # runs vs. # iterations?

- Increasing # runs will
 - execute more searches "from scratch"
 - explore more complete paths to an optimal solution

- Increasing # iterations will mean
 - longer runs,
 - a deeper search for the "optimal" solution

Number of Iterations 1000000
Temperature Decreases 1000

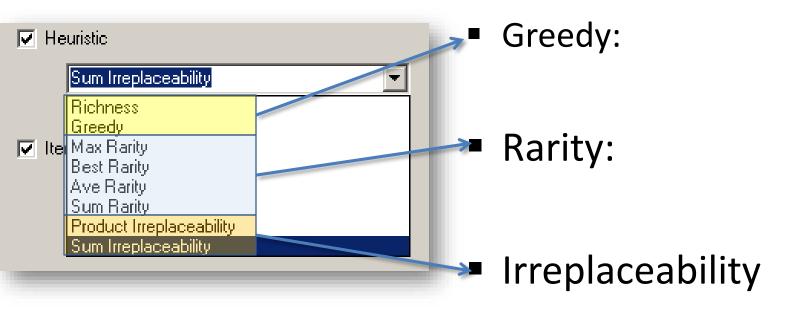
Miscellaneous Repeat Runs

Run: new game



Iteration: moves ahead to think

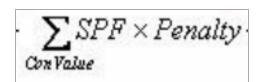
Heuristics options





Heuristics options: Greedy

<u>Greedy</u>: add planning units that improve the objective function...



- Greedy Richness:
 - Conservation value = the sum of penalties incurred by underrepresenting a conservation feature; features already represented do not contribute
- Pure Greedy:
 - Same as Richness when BLM is set to zero; otherwise, boundary length is factored into the objective function, and not all species may be included because of cost restrictions

Heuristics options: Rarity

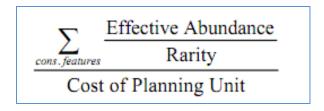
<u>Greedy</u> algorithms will favor common species; <u>Rarity</u> algorithms implement an added cost for not including rare conservation features

 $\frac{\text{Effective Abundance}}{\big(\,\text{Rarity x Planning Unit Cost}\big)}$

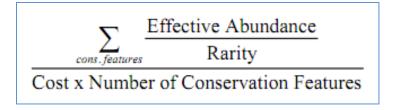
- Effective abundance = amount of feature found within a planning unit
- Rarity = fraction of planning unit in which feature is found
- Maximum rarity = planning unit assumes score of most rare feature
- Best rarity = planning unit assumes score of highest ratio for the patch (not necessarily the most rare feature)

Heuristics options: Rarity (continued)

 Summed rarity = sum of all feature rarity scores w/in the planning unit . Includes elements of both richness and rarity...



 Avg. rarity = average of all feature rarity scores w/in the planning unit; gives more weight to rarer conservation features...

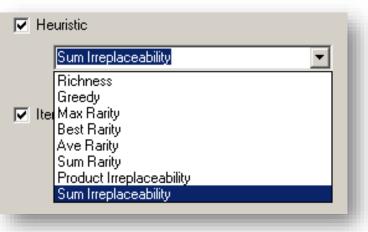


Heuristics options: Irreplaceability

Irreplaceability looks at how necessary a patch is to achieving a given features' target

- A planning unit is irreplaceable if it contains a high proportion of the target that's not found in other planning unit.
- Calculated as how much "excess" (or buffer) is captured within the planning unit; A planning unit that contains a mostly "buffer" or "excess" is more "replaceable"; Scores range from 0 to 1.
- <u>Product irreplaceability</u>: Sensitive to outliers; will favor planning unit with hard-to-represent features.
- Summed irreplaceability: Quantity of features is important; less sensitive to outliers.

Heuristics options





Greedy:

- Richness: Greedy strives to maximize richness at low cost
- Pure Greedy: Cost (incl. boundary)play a larger role

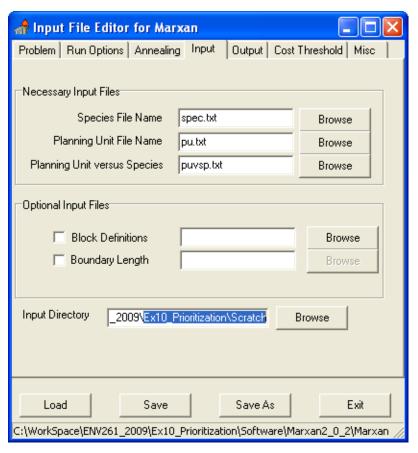
Rarity:

- Outcome favors rare features; finds them first, and then adds common
- Assigns values

Irreplaceability

 Examines how necessary a patch is to achieve a target for a given feature

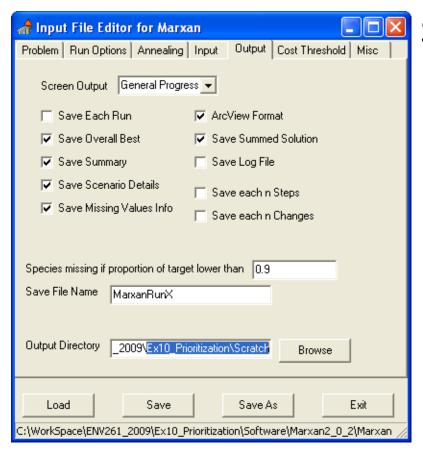
Marxan run-time options: Inputs



Specify input file names and location

• Block definitions can be used to set common properties to groups of conservation features (e.g. vertebrates, listed species, etc.)

Marxan run-time options: Outputs



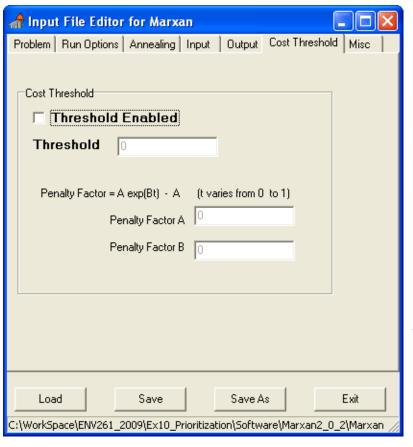
Specify output options & location

 See p. 66 of Marxan manual for what these are

Proportion Threshold...

Run name..

Marxan run-time options: Cost Threshold

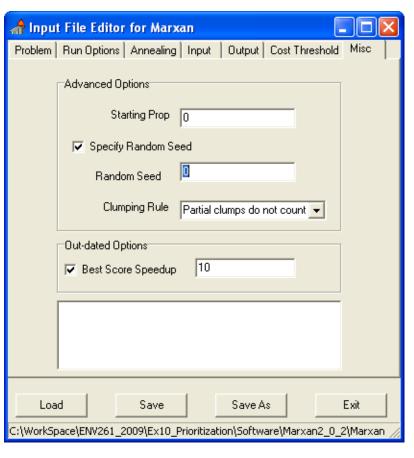


Used if you want to find a solution below a threshold cost

Otherwise, Marxan will strive to find the cheapest solution meeting all the targets.

see p. 33 of Marxan Manual

Marxan run-time options: Misc.



- Starting Prop: Proportion of planning units included in initial reserve.
- Random seed: If > 0, uses the same initial patches to start.
- Allows minimum feature size;
 features < minimum size are ignored.
- Marxan does not report "best" scores until a min. level is reached, thus saving time..

Running Marxan

Double Click Marxan.exe file

```
🗪 C:\Documents and Settings\jpfay\Desktop\Teaching\ENV261 2009\Ex10a Marxan\Software... 🗕 🗖
 Iterative Improvement: Value 27417720.7 Cost 6465.0 PUs 90 Boundary 0.0 Missing
 6 Shortfall 14158.80 Penalty 27411255.7
Time passed so far is 1 secs
       Using Calculated Tinit = 324610.6210 Tcool = 0.98511887
Run 2
  Creating the initial reserve
  Init: Value 35763568.6 Cost 0.0 PUs 0 Boundary 0.0 Missing 26 Shortfall 19896.0
0 Penalty 35763568.6
  Annealing: Value 27417737.7 Cost 6482.0 PUs 89 Boundary 0.0 Missing 6 Shortfall
 14158.80 Penalty 27411255.7
  Best: Value 27417737.7 Cost 6482.0 PUs 89 Boundary 0.0 Missing 6 Shortfall 1415
8.80 Penalty 27411255.7
  Heuristic: Value 27417737.7 Cost 6482.0 PUs 89 Boundary 0.0 Missing 6 Shortfall
 14158.80 Penalty 27411255.7
 Iterative Improvement: Value 27417737.7 Cost 6482.0 PUs 89 Boundary 0.0 Missing
 6 Shortfall 14158.80 Penalty 27411255.7
Time passed so far is 2 secs
       Using Calculated Tinit = 324610.6210 Tcool = 0.98511887
Run 3
  Creating the initial reserve
  Init: Value 35763568.6 Cost 0.0 PUs 0 Boundary 0.0 Missing 26 Shortfall 19896.0
 Penalty 35763568.6
```

MARXAN Outputs

run1 sen.dat

Metadata file listing scenario run time parameters

run1 best.dat

list of planning units included in the optimal solution from all repeat runs

run1 mvbest.txt

a list of the conservation shortfalls contained in the optimal solution

run1 ssoln.txt

a list of each planning unit and the number of times it occurred in the optimal solution for a single repeat run

run1 sum.txt

a list breaking down the conservatin value, costs, and overall score of each repeat run

Viewing MARXAN's "best" solution

- Convert patch raster to polygon features
- Rename "planning unit" to "pu" in txt file
- Join txt file to patch attribute table
- Display patches where "solution" = 1

```
MarxanRunX_best.txt - Notepad2

File Edit View Settings ?

1 "planning unit", "solution"
2 660,1
3 624,1
4 534,1
5 441,1
6 429,1
7 428,1
8 365,1
9 283,1
10 280,1
11 210,1
12 191,1
13 147,1
14 128,1
15 116,1
```

Viewing MARXAN's "summed solutions"

- Rename "planning unit" to "pu" in txt file
- Join txt file to patch attribute table
- Assign graduated symbology based on "number" attribute.

```
MarxanRunX_ssoln.txt - Notepad2

File Edit View Settings ?

1 | "planning unit", "number"
2 671,0
3 670,7
4 669,3
5 668,5
6 667,4
7 666,0
8 665,1
9 664,0
10 663,0
11 662,0
12 661,0
13 660,6
```

MARXAN: Parting thoughts

- Many additional options
 - Read MARXAN manual!
- Hexagons, parcels, watersheds, etc. instead of patches as planning units.
- Boundary length modifier
- Different cost measures, thresholds...
- Different conservation features...