

NICHOLAS SCHOOL OF THE ENVIRONMENT AND EARTH SCIENCES

DUKE UNIVERSITY



# **ENVIRON 761:** Connectivity

Instructor: John Fay

### What is connectivity?



It's the linking of two or more areas so that individual critters can successfully move among these areas

It's the opposite of fragmentation

## Connectivity

- We have been talking about connectivity for a few decades
- It remains surprisingly hard to quantify
- Its importance remains as much a working hypothesis as established truth
- Here we will:
  - explore new methods for measuring connectivity
  - discuss ways to verify its importance

### Why look at connectivity?



Noss and Harris 1986

### **Connectivity & metapopulations**

Metapopulation  $\rightarrow$  population of populations



Presumption: closer patches interact more frequently or intensely than distant patches

### **Metapopulations & scale**

 Local scale — individuals interact with each other during normal living





### **Metapopulations & scale**

 Metapopulation — a set of populations linked by dispersal (perhaps "once in a lifetime" experience)

### **Metapopulations & scale**

 Geographic range — perhaps a set of metapopulations; an individual does not experience much of its range



Maintenance of demographic flows (rescue effect)

distributing a population among patches buffers it from local catastrophes while permitting recolonization from afar Den Boer 1968



- Maintenance of demographic flows (rescue effect)
- Maintenance of genetic flows
  - avoid inbreeding depression
  - Iong term maintenance of genetic adaptability
  - diversification of evolutionary lineages via dispersal



Young & Clarke 2000

- Maintenance of demographic flows (rescue effect)
- Maintenance of genetic flows
- Resilience of populations...
  - to conversion by agriculture, forestry, development,...
  - to climate change



- Maintenance of demographic flows (rescue effect)
- Maintenance of genetic flows
- Resilience of populations...
- Maintenance of ecological processes
  - nutrient/hydraulic flows in freshwater systems
  - patch dynamics of disturbance or resources

### **Connectivity - risks**

Connectivity can allow threats to propagate just as it allows species to propagate...



 Optimal balance in connectivity: not enough to propagate bad things (disturbance, pathogens, pests), but enough to allow recolonization (rescue) after a local extinction

### **Connectivity – Climate Resilience**



## Knowledge check

- In what ways might connectivity minimize the impact of fragmentation?
- What would a "connected" landscape look like compared to a "disconnected" landscape?

### • What is the question to be addressed?



conservationcorridor.org

"Where along this 15-mile stretch of highway should crossing structures lynx be located?" "Which areas between Yellowstone NP and the Yukon are least impacted by human activities & how are they connected?



https://y2y.net

What is the simplest approach to provide the needed information?



• Errors multiply as datasets are combined...



"Make everything as simple as possible, but not simpler."



• What is the scale of the question?





#### http://www.savingspecies.org



http://www.wildlandsnetwork.org/sites/default/files/Wild%20LifeLines%20White%20Paper.pdf

Is the model testable?

Circuit theory outperforms standard models of genetic differentiation among wolverine populations. Range maps illustrate how pairwise isolation is measured under the competing models between two example wolverine populations (Idaho and Manitoba). Models compared are two-dimensional IBD (A), the better justified IBD model (see IBD Predictions under Methods), LCP (B), and IBR (C). Open circles indicate pairwise comparisons including Idaho. Linear regression lines include all populations.



Brad H. McRae, and Paul Beier PNAS 2007;104:19885-19890

## **Knowledge Check**

What are some of the advantages and disadvantages of connectivity being a relatively new topic in landscape analysis?

What are some common pitfalls of connectivity analyses?

## **Modeling connectivity**



Information Provided

## Landscape metrics (e.g., Fragstats)

#### CONNECTIVITY METRICS

Patch Cohesion Index (COHESION)

Connectance Index (CONNECT)

Traversability Index (TRAVERSE)

#### ISOLATION/PROXIMITY METRICS

Proximity Index (PROX)

Similarity Index (SIMI)

Euclidean Nearest Neighbor Distance (ENN)

Functional Nearest Neighbor Distance (FNN)

#### CONTAGION/INTERSPERSION METRICS

Percentage of Like Adjacencies (PLADJ)

Contagion (CONTAG)

Aggregation Index (AI)

Interspersion & Juxtaposition Index (IJI)

Landscape Division Index (DIVISION)

Splitting Index (SPLIT)

Effective Mesh Size (MESH)

### All of these measure structural connectivity...

## Landscape metrics (e.g., Fragstats)

Effective mesh size ...

- The probability that two random points are connected...
- Inversely related to # of barriers

$$m_{\rm eff} = \frac{1}{A_{\rm total}} \Big( A_1^2 + A_2^2 + \ldots + A_i^2 + \ldots + A_n^2 \Big)$$

A<sub>1</sub>

 $A_{total} = 4 \text{ km}^2$ 

$$\left(\frac{A_1}{A_{\text{total}}}\right)^2 = 0.5 \cdot 0.5 = 0.25.$$

$$A_2$$

$$A_3$$

$$25^2 = 0.0625 \text{ for}$$

The corresponding probability is  $0.25^2 = 0.0625$  for both patches 2 and 3. The probability that the two points will be in patch 1 or 2 or 3 is the sum of the three probabilities which results in 0.375.

Multiplying this probability by the total area of the region finally gives the value of the effective mesh size:

 $0.375 \cdot 4 \text{ km}^2 = 1.5 \text{ km}^2$ .

# Landscape metrics



**Figure 1.** Technological advances have facilitated the generation of dozens of measures of landscape structure, but the amount of information produced has often outpaced our understanding of how such measures relate to ecological processes.

# **Ecological & Theoretical background**

 Structural connectivity: The spatial arrangement of different types of habitat or other elements in the landscape.



# **Ecological & Theoretical background**

• Functional Connectivity:

The behavioral response of individuals, species, or ecological processes to the physical structure of the landscape.

- Potential Connectivity (simulation)
- Actual Connectivity





• Closer is better: *Euclidean distance* 



But - is the all the area between patches equal? In other words: *Does the matrix matter??* 

### The Matrix Matters: Effective Isolation in Fragmented Landscapes

Ricketts 2001

**Figure 1:** Map of 14 study sites with surrounding matrix vegetation. Connecting arrows indicate movement routes considered in the analyses. Map is not drawn precisely to scale and covers only the valley floor; steep valley walls are not shown. For simplicity, all features (e.g., forest gaps) smaller than approximately 1,000 m<sup>2</sup> are not shown.



The matrix matters: Cost distance\*



### \* But – how do we determine the cost?

### **Resistance/Cost**:

Impedance from crossing a particular environment



**Physiological cost** 



Mortality risk

**Permeability/Conductivity:** (Inverse of resistance...) Facility of moving through an environment

An Indian man whose wife died when medical attention could not reach her, carved a 360ft long path through a mountain to cut the time it took for medical assistance to arrive at his village. It took him 22 years and shorted the journey from the nearest town to 1Km, from 75Km.



Landscape Ecol (2012) 27:777–797 DOI 10.1007/s10980-012-9737-0

LANDSCAPE ECOLOGY IN REVIEW

Estimating landscape resistance to movement: a review

Katherine A. Zeller · Kevin McGarigal · Andrew R. Whiteley

### 5 Types of biological input data

- Expert opinion
- Detection data (element occurrence data)
- Relocation data (mark recapture)
- Pathway data (tracking)
- Genetic data (movement of genes)



Estimating landscape resistance to movement: a review

Katherine A. Zeller • Kevin McGarigal • Andrew R. Whiteley





STAGE

ONE

### Typical environmental layers...

- Land cover
- Roads
- Elevation
- Hydrology
- Slope



Estimating landscape resistance to movement: a review

Katherine A. Zeller • Kevin McGarigal • Andrew R. Whiteley

- > Which to use?
- > Are these proxies?
- Are they accurate?

Step one: Select environmental variables







*Zeller, et al (2012)* 

Table 2       Environmental variables, spatial grain, thematic scale and study area extent used in 96 studies aimed at producing a resistance surface	No. of papers <sup>a</sup>
Environmental variable	
Land cover/land use	80
Roads and other linear features	37
DEM; hydrology	22
Slope	18
Human development (e.g. buildings, culverts/weirs)	11
Percent canopy cover	6
Settlements; aspect	5
Human population density	4
Compound topographic index; traffic data; land management/zoning	3
Temperature; NDVI; topographic exposure; topographic ruggedness index; precipitation	2
Already developed habitat/non-habitat map; anisotropic surface; bathymetry; climactic suitability; current velocity; depth to bedrock; distance from presence point; flow rate; percent rock; persistent spring snow cover; predation risk; relief; seral stage based on DBH; soil density; solar exposure; substrate type; topographic position; topographic smoothness; vapor density; vegetation height; water depth	1



Figure 2 U.S. natural permeability of natural landscapes. This map of connected landscapes shows the natural landscape connectivity as a surface (or gradient) representing each cell's value as a percentile distribution normalized to the United States. Colors represent the amount of connected, natural lands (green = high; yellow = medium; purple/white = low).
## **Knowledge Check**

- How are "functional connectivity" and "structural connectivity" different?
- What does "the matrix matters" imply in terms of determining whether two patches are "connected"?
- How might we measure resistance in developing a resistance surface?
- How might inaccuracies in our resistance surface affect our results?

#### **Connectivity cost surfaces**



(Vegetation Overstory)

### Least cost paths (LCPs)



Cost back link output

Input source locations

2

#### Least cost paths



Although LCPs are easy to calculate, are they really a wise choice for modeling connectivity?

- How "optimal" is it vs. sub-optimal paths?
- Paths are a single pixel wide...
- How likely are animals to find and use LCPs?
  - Will they find the optimal exit point from a patch?
  - Are they able to discern costs along path?



#### **Alternatives to least cost paths...**

**Table 2.** Software packages that have been used for landscape graph analysis. A number of other software packages and tools (e.g. social network analysis packages, R libraries) have been developed to quantify aspects of graph properties but are not included here because they lack the ability to directly analyze landscape graphs. All websites were current as of 28 November 2011.

Software	Description	Download available	Citation
Conefor Sensinode	Calculates node-, link- and graph-based metrics, including: number of links, number of components, Harary Index, class and landscape coincidence probability, integral index of connectivity, flux and area- weighted flux, probability of connectivity	http:// www.conefor.org	Saura and Torné (2009)
JMatrixNet	Identifies a network of habitat patches within a landscape that can then be analyzed using network software (e.g. Pajek) to calculate a limited number of patch and network measures	http://www.ecology. su.se/jmatrixnet	Bodin and Norberg (2007)
FunConn	A modeling toolbox for ArcGIS v9.3 that calculates minimum spanning trees and shortest paths, and provides a range of link, node, and network-based operations	http://warnercnr. colostate.edu/ ~davet	Theobald et al. (2011)
SELES	A structured language for modeling landscape dynamics that includes methods for calculating minimum planar graphs and spanning trees	http://seles.info	Fall and Fall (2001); Fall et al. (2007)
LQGraph	Optimizes the connectivity of sites administered to protect biodiversity; it calculates minimum spanning trees and performs a limited number of node and link operations	http://uts.cc.utexas.edu/ ~consbio/ Cons/Labframeset.html	Fuller and Sarkar (2006)
Circuitscape	Calculates and maps measures of resistance, conductance, current flows, and voltage	http://www.circuit scape.org	McRae and Shah (2009)

*Kupfer 2012* 

#### Alternatives to least cost paths...

- Corridors
- Graph theory
  - Centrality analysis
- Circuit theory
- Agent-based analysis
- Barrier mapping



#### Least cost path alternative: Corridors



# **Corridor design**

http://corridordesign.org/

#### 🔁 Corridor<mark>Desig</mark>n

HOME LEARN D

#### DOWNLOADS LINKAGE DESIGNS

ABOUT

BLOG

#### GIS tools and information for designing wildlife corridors

Our goal is to transfer everything we've learned about designing wildlife corridors to the general public to facilitate better conservation, science, and dialogue.



#### Learn about corridors



Learn the important conceptual & technical steps for designing wildlife corridors





Download CorridorDesigner, a suite of ArcGIS tools for designing and evaluating corridors

#### Linkage Designs



Download reports and GIS data for linkage designs created throughout Arizona



#### **Designing Linkages**

#### PRE MODELING

Overview The big picture Identifying linkages Prioritizing linkages Defining analysis area Selecting focal species

#### HABITAT MODELING

Overview Choosing GIS factors Estimating suitability Combining factors Modeling habitat patches Modifying habitat maps

#### CORRIDOR MODELING

Overview

- Corridor end points
- Cost distance
- Evaluating corridors

#### LINKAGE DESIGNS

Overview Mitigating barriers

#### RESOURCES

Glossary Other GIS tools

- Why do you need to maintain connectivity in your analysis area?
- What are you trying to connect?
- What are the land ownership/stewardship patterns in the area?
- What are the threats?
- What does the land cover look like?
- What types of species occur in your analysis area?
- Who are the major stakeholders who you should work with in your study?



- 1. Use the inverse of the habitat suitability map as a resistance map
- 2. Select terminals within each *wildland block* as start and end points for modeling the corridor
- 3. Calculate cost-distance for each pixel, and select an appropriate slice of the cost-distance map as the modeled corridor



#### DON'T USE THE LEAST COST PATH

We see no excuse for using least cost paths instead of corridor swaths to define wildlife corridors. A least-cost path is only one pixel wide. Because it is easy to identify in GIS software, it is popular. But a pixel-wide path surrounded by otherwise inappropriate habitat is unlikely to be used, and would be biologically irrelevant. Furthermore, the location of a least cost path is highly sensitive to pixel size and errors in classifying single pixels. Finally, you would never recommend conservation of a pixel-wide path.





Summary:

- Provides a good overview of conservation planning process with an emphasis on corridor design
- Tips and advice derived from numerous design workshops
- CorridorDesign tool does not do much that's different from what we do in our lab...

### **Graph** analysis



### **Graph analysis**

A graph is a set of nodes...

Nodes are habitat patches

After Dykstra 1969

## **Graph analysis**

A graph is a set of nodes and edges



- Nodes are habitat patches
- Edges are drawn if the two patches are connected by dispersal

After Dykstra 1969

### Graph (a.k.a. network) properties

- Nodes and edges
- Node degree and degree distribution
- Characteristic path length
  - shortest path
  - Iongest shortest path (diameter)
- Community structure



# **Graphs: familiar examples**

#### Roads



## Graph analysis example: Forest birds

#### Emily Minor, Duke PhD.





Lang Elliott (Naturesound)



## Graph analysis example: Forest birds

#### Graph construction



<u>Nodes</u>: forest types classified from imagery, aggregated into patches, culled to (arbitrary) size threshold

<u>Edges</u>: least-cost paths weighted by land cover resistance to dispersal



# Graph analysis example: Forest birds

- Creating a network topology
- LCPs area converted into graph edges.
- Edges can be weighted by dispersal probability (flux)
- Large, highly connected patches (i.e. those with high node degree) appear as hubs



### **Metapopulations as graphs**

Once we have created a topological graph, we can describe its properties

- Node list and attributes
  - (X,Y), area, quality ...
- Edge matrices:
  - adjacency (Boolean)
  - distance or functional distance
  - dispersal probability (undirected edges)
  - area-weighted dispersal flux (directed arcs)

#### **Metapopulations: Sources & Sinks**

#### Source

a patch with high total outflux to nearby patches

 $W_{ij} = A_i \exp(-kD_{ij})$ 

A = area (proxy for pop'n) D = distance k = distance decay factor



#### **Metapopulations: Sources & Sinks**

#### Sink

a patch with high total influx but low outflux



#### **Metapopulations: Connectivity**

Goals:

 Make the network optimally connected to reduce risk while ensuring recovery from disturbance ("spreading of risk" model)

Find the well-connected "backbone" of a network

### Subgraphs: edge thresholding



#### Largest component defines graph diameter

## **Edge-thinning: trends**



No edges in graph; everything disconnected

Only edges < 1000 m kept in graph;

#### **Betweenness centrality**

Number of shortest paths that include that node



Node "d" is in paths ae, be, cf, ... it is *central* to the graph because it is *between* a lot of nodes

## Metapopulations as graphs

- Graph models can represent source/sink models as well as spreading-of-risk models (and apparently any other model)
- Graph algorithms provide optimal solutions to many network tasks concerned with routing or network flow (reserve system design?)
- There's a *lot* more available ...
  - social network theory
  - network optimization

#### Are you a node?



## Graph analysis: Summary

- Network (graph) theory provides a ready body of data structures and algorithms for applications concerned with connectivity
- These seem readily amenable to source/sink and spreading-of-risk metapopulation models
- Initial applications have been promising
- Software is increasingly available (and mostly free but not necessarily user-friendly)

## **Connectivity: Summary**

 Context of a patch among neighboring patches (i.e. connectivity) allows us to evaluate landscapes beyond just habitat quantity and quality; it enables us to incorporate metapopulation dynamics into the analysis.

- Spatial analysis (Euclidean & cost distance) provides useful information regarding connectivity
- However, additional techniques (circuit theory and graph theory) are used to overcome computational and technical limitations



	Input habitat data Raster habitat map and data type
Source/ground modeling mode	./verify/5/cellmap10x10.asc
Pairwise: iterate across all pairs in source/target file	+ Habitat data specify per-cell RESISTANCES
	✓ Optional: load a raster short-circuit region map
Pairwise mode options Focal node location file and data type	./verify/5/regions_grid.asc
(Browse for file with locations of focal points or areas) Browse	Cell connection scheme and calculation
Focal POINTS: each focal node contains only one cell	Cell connection scheme: Connect EIGHT neighbors
	Cell connection calculation: Average CONDUCTANCE
Advanced mode options	
Current source file	Output options
./verify/5/sources10x10.asc Brows	Base output file name
Ground point file and data type	./verify/output/mgVerify3.out
./verify/5/grounds10x10.asc Brows	What output maps do you want to produce?
Ground values specify CONDUCTANCES	Create current maps ✓ Create voltage maps

Browse

Browse

Browse

RUN

http://www.circuitscape.org/

# **Circuit theory**

#### multiple pathways in electrical networks increase connectivity...



McRae et al, 2008

# **Circuit theory**



FIG. 4. A simple landscape represented as both a grid and a circuit. The landscape contains two contiguous patches of 0-resistance cells (open), dispersal habitat of finite resistance (gray), and one "barrier" cell with infinite resistance (black). Cells with finite resistance are replaced with nodes (small dots), and adjacent nodes are connected by resistors. Patches of cells with 0 resistance are each consolidated into a single node (large dots). Connections between diagonal neighbors and nonadjacent cells can also be incorporated, the latter representing "hops" over intervening cells. Current sources, voltage sources, and ground connections can be added as in Figs. 2 and 3.





How large of a landscape can I analyze with Circuitscape?

- The size of grids that can be analyzed depends on how much RAM Circuitscape can address. We have solved grids with 100 million cells on Linux systems. However, 32-bit Windows and Mac operating systems limit the amount of RAM that Python can address, meaning that only landscapes in the neighborhood of 1-6 million cells can be solved on these systems, even when they have lots of RAM.
- Users can generally coarsen their grids and get results that closely approximate those run at fine-scale resolution (see McRae et al. 2008). To solve the largest grids, we recommend that users find a 64-bit Windows or Linux system with lots of RAM, and follow the instructions for installing on <u>64-bit Windows</u> or <u>Linux</u>.
- We are working to push these limits, through the use of more efficient algorithms and parallel computing. Please see the user guide for hints on getting the most out of the memory you have.
## **Circuit theory**

### Advantages

- Provides intuitive analytic analogues for resistance, conductance, and flow over networks depicted as 'wiring diagrams'
- Allows multiple pathways to be modeled between node pairs
- Each path can be quantified in terms of relative flow rates
- Relative flow rates integrated over all possible paths

### Disadvantages

- Extremely computationally intensive
- Circuit links cannot be directional

## Agent-based analysis (simulation)



Figure 10.5b. HexSim can quantify simulated movement rates through a landscape by recording the number of times an animal passes through each hexagon during dispersal movements (the dispersal flux). WHCWG (2010).

## **Agent-based analysis (simulation)**



http://resources.arcgis.com/en/help/agent-analyst/

### Functional Connectivity: FunConn



Exploring the functional connectivity of landscapes using landscape networks DAVID M. THEOBALD

#### Functional Connectivity Model (FunConn):

The FunConn ArcGIS toolbox consists of two primary toolsets: Habitat Modeling and Landscape Networks. The Habitat Modeling toolset is optimal for those who want to generate a terrestrial habitat quality raster, functional patches, and a landscape network geodatabase from the ground up. Besides land cover, no existing sampling data is required. The Landscape Network toolset is designed for those interested in generating a landscape network geodatabase based on existing data. It contains three sub-toolsets: Processing, Analysis, and Export. The Processing toolset generates the landscape network based on points, polygons, or polylines. The Analysis toolset allows for network-type analyses to be executed on landscape networks. These tools include calculating minimum spanning trees based on a user-defined weight values, calculating node and edge interactions based on used-defined fields and equation strings, and finding the shortest paths from each node to every other node in the network. The Export to spatial weights matrix toolset exports the Landscape Network to an NxN matrix based on user-defined weight values.



### http://www.nrel.colostate.edu/projects/starmap/funconn\_index.htm

### FunConn: Euclidean patch distances

A center to center patch distance = 46.5 km

B edge-to-edge = 8.7 km

C edge-to-edge = 11.7 km

Pathway B is the minimum least-cost pathway, while pathway C is an additional pathway. The gray tones radiating from the patches are straight-line distance buffers out to 13 km away from the edge of patches.



Theobald 2006

### FunConn: Cost patch distances

#### with a permeability surface

- <u>lighter</u> shades = higherpermeability landcover (e.g. coniferous forest, shrubland, and wetlands) easier to pass through
- <u>darker</u> shades = lower permeability landcover (e.g. agricultural cropland, urban areas, and highways) harder to pass through

Route B is physically shorter, but passes through harder to navigate (more costly) land covers



Theobald 2006

## FunConn: Least cost paths

The least-cost distances (as a pseudo-elevation surface generated from cost distances)

peaks and ridges are higher cost-weights

least-cost distance:

<mark>B</mark> = 12 km

C = 18 km (although C could have been less than B, given different cover types in the intervening matrix).

**Red line** = Allocation Boundary





### **FunConn:** Finding multiple LCPs

### Costs along allocation boundary



# **FunConn:** Finding corridors

Corridors between patches can be determined by generating a corridor surface calculated by adding the leastcost distance surface generated from one patch to the least-cost distance surface generated from an adjacent patch.

Smaller values on this corridor surface depict locations that are near the optimal pathway, while larger values are less optimal.

The corridor for the 10<sup>th</sup> percentile distance is shown as dark gray (under pathway B), while the 25th percentile corridor is shown by light gray surrounding pathway B and under pathway C (bounded by the white area).

Theobald 2006

### FunConn: Lynx example



### FunConn: Lynx example



### FunConn: Lynx example



### FunConn

Summary:

- Analysis of the costs along the allocation boundary provides a quantitative evaluation of the connectivity among patch pairs
- FunConn allows multiple least cost paths and least cost corridors to be calculated for adjacent patch pairs

BUT:

- FunConn is limited to nearby patches; ignores patches beyond ones immediately adjacent to studied one
- Any changes in the landscape requires analysis to be re-done