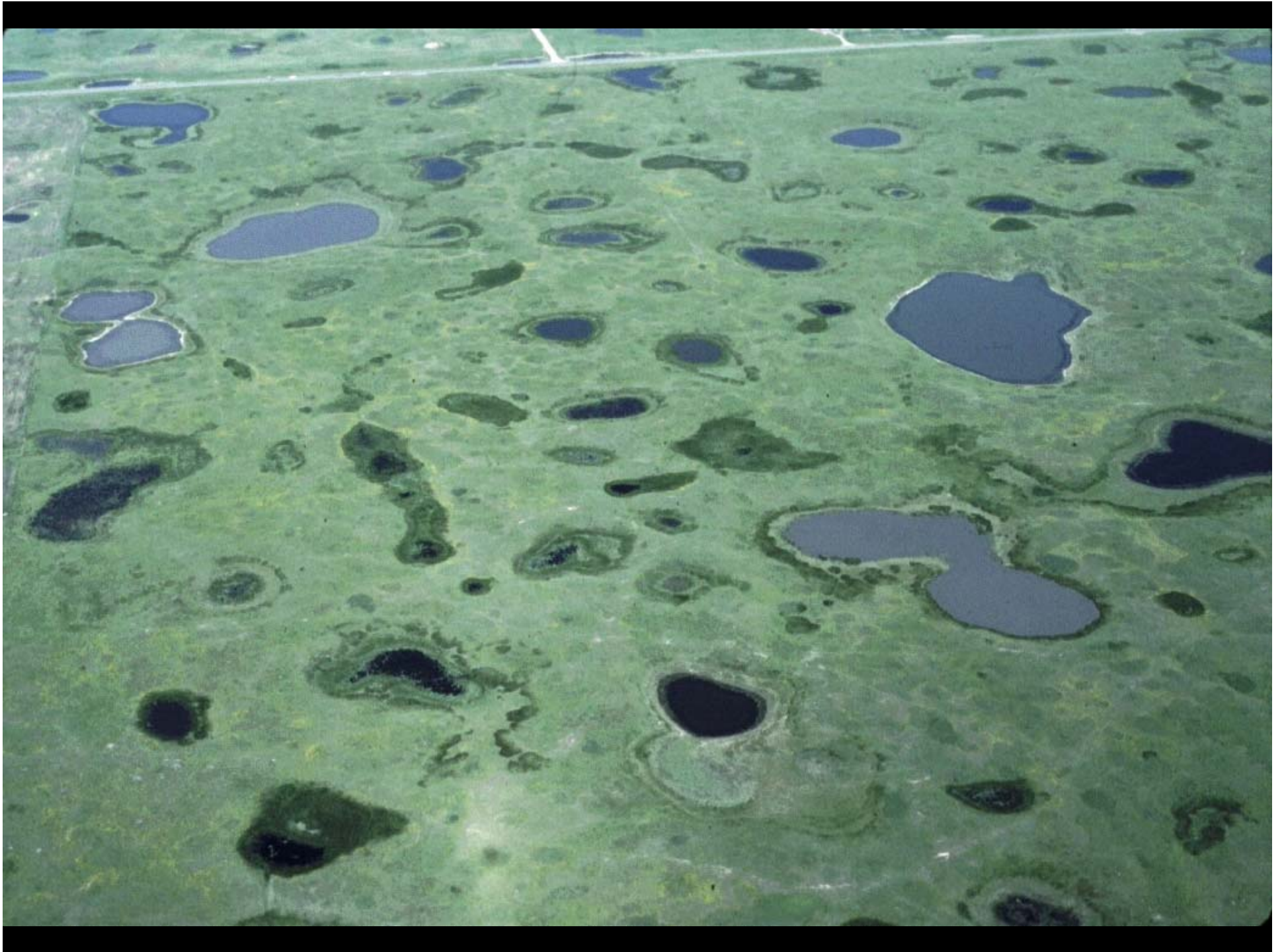
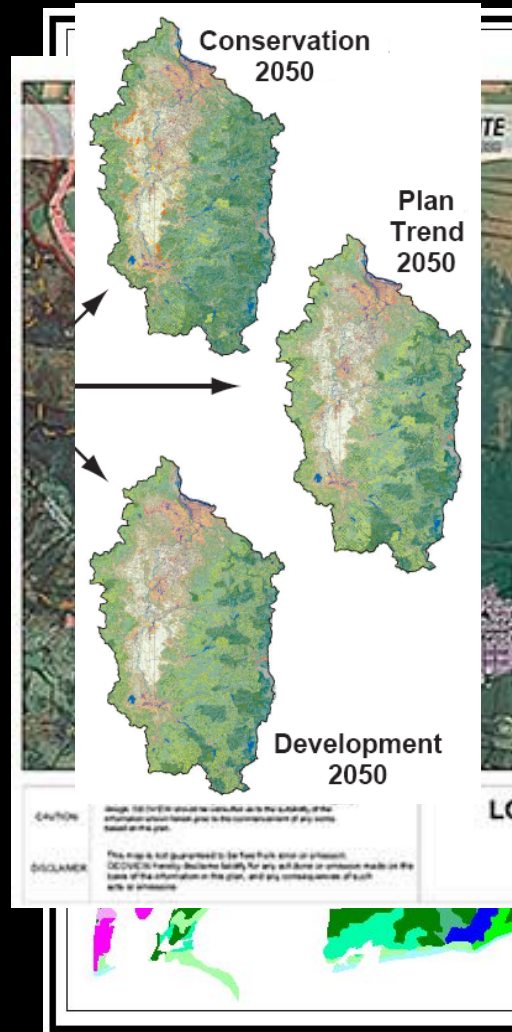


Measuring landscape pattern



# Why would we want to measure landscape patterns?

- Identify change over time
- Compare landscapes
- Compare alternative landscape scenarios
- Explain processes





# Steps in Application of a Metric

## Spatial Data Set

orthophoto, satellite image, digital map

## Scale definition

Extent of analysis, resolution of elements

## Classification

Supervised or automated (unsupervised)

## Application of metric

## Interpretation

# Number of Attribute Classes

- Just how diverse is the landscape in terms of defined patch elements?
- Southwestern U.S.
  - Bottomland hardwoods, bald-cypress swamp, pine savanna, oak thickets, grasslands, agricultural, pine plantations, upland hardwoods, etc. (diverse)
- Tierra del Fuego:
  - Tundra, southern beech forest, pampas, barren (relatively low)
- Antarctica
  - Ice. Rock. More ice. 2 vascular plant spp. somewhere.

# Quantifying Landscape Pattern

## *Landscape Composition:*

*What elements make up the landscape?*

*How much of each element is there?*

## *Landscape Configuration:*

*How are the elements of the landscape arranged?*

*What types of shapes do they take?*

*How do they relate to each other spatially?*



## Composition

Richness  
Evenness  
Diversity

## Configuration

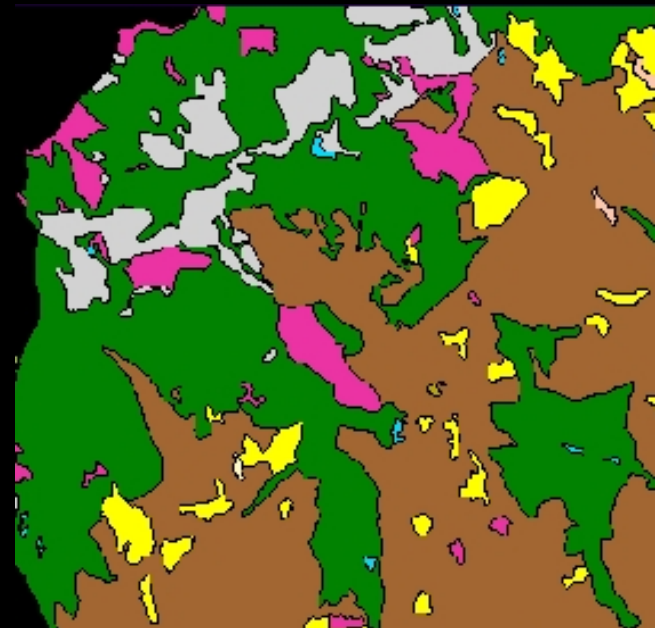
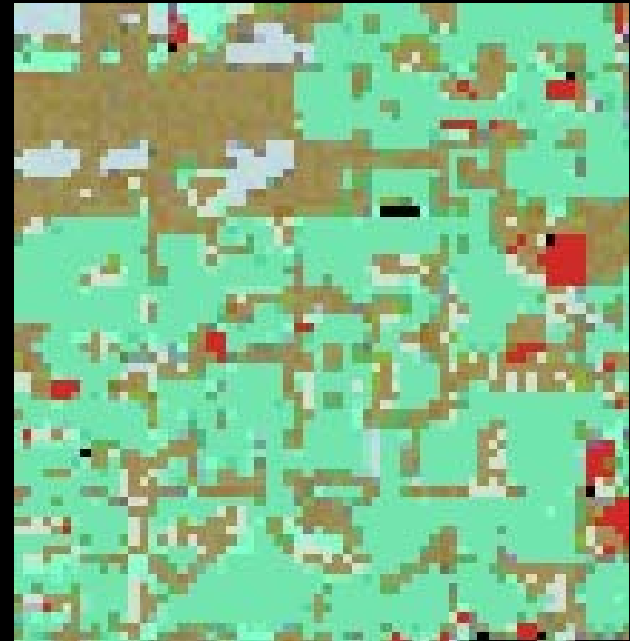
Size  
Shape  
Edge length/density  
Isolation  
Fragmentation  
Contagion  
Connectivity  
Interspersion  
Dispersion



# Raster and vector images

Rasters consist of grid cells with individual values.

Vector coverages are composed of shapes (polygons) that are defined by connected points





# Defining the landscape

We often use remotely sensed data to measure landscape pattern.

Aerial photos

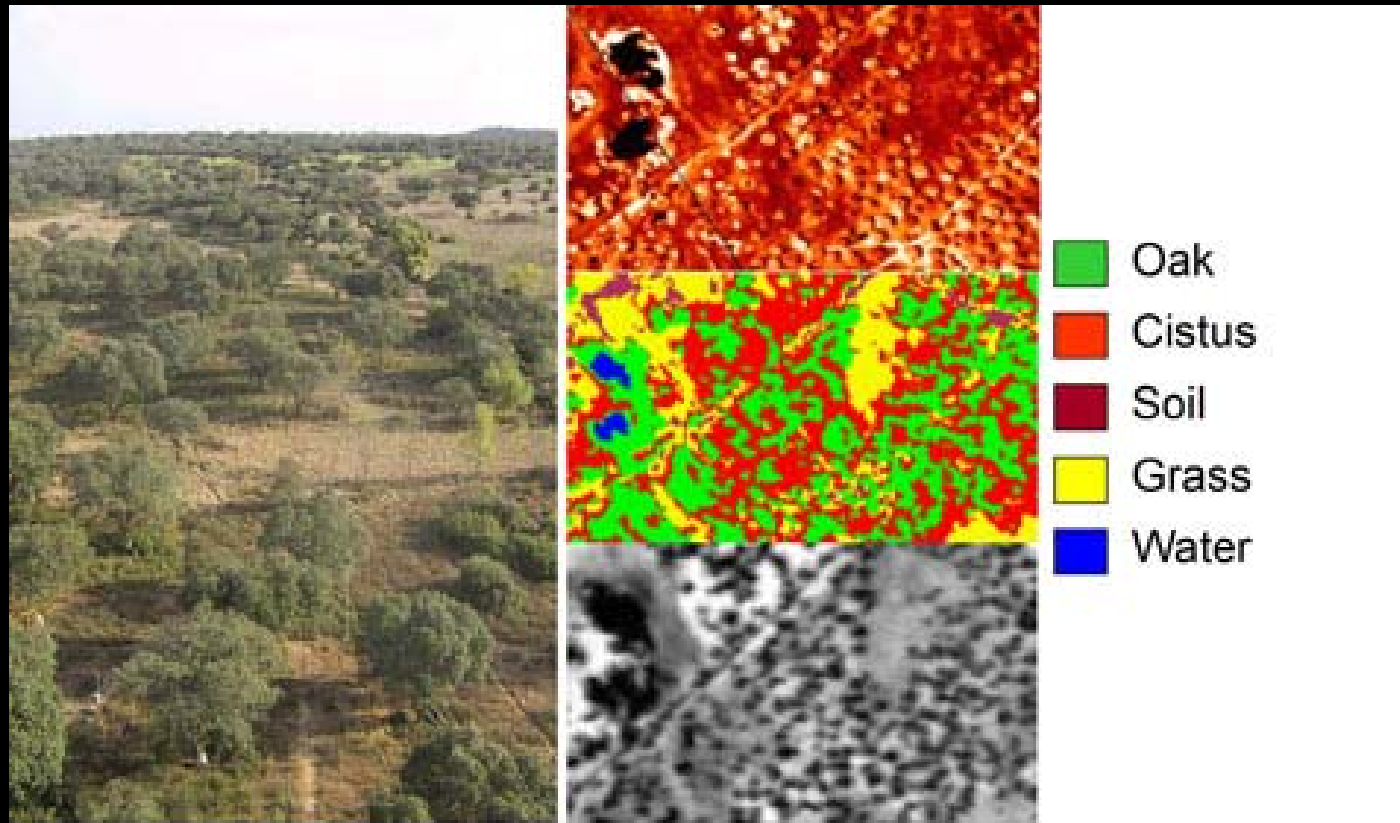
Satellite imagery



# Classifying a landscape

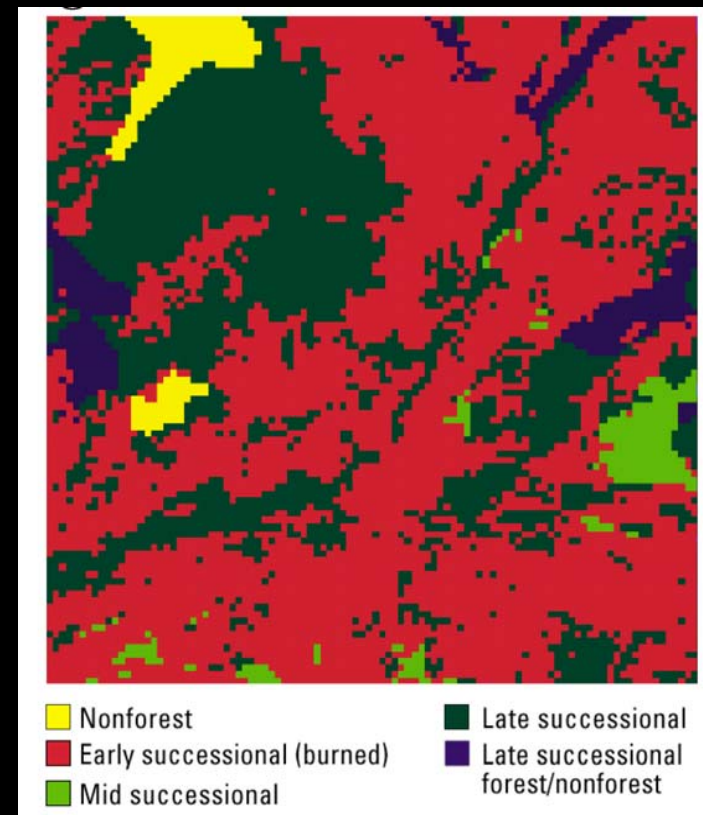
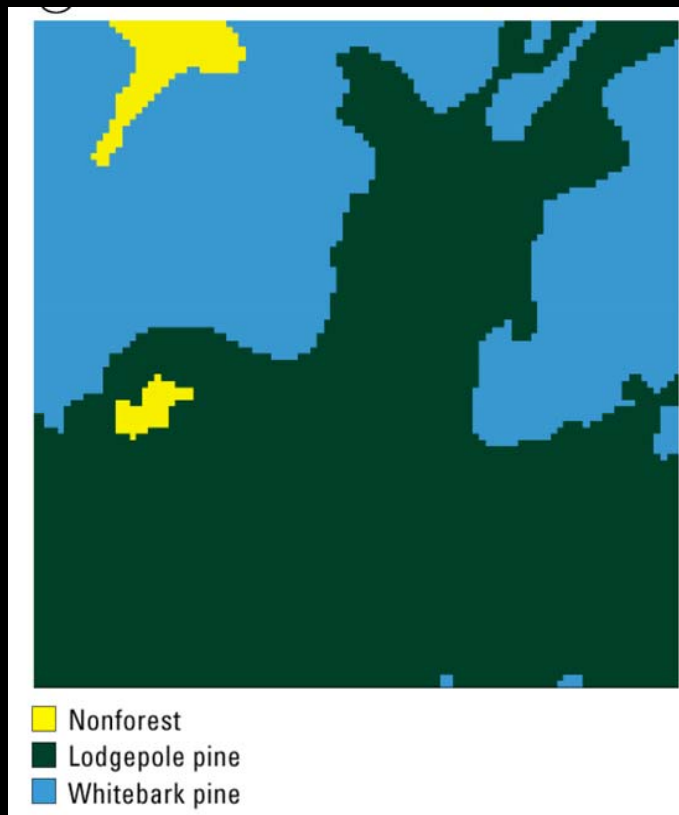
We often define landscapes using discrete categories.

Thus we must “classify” images.



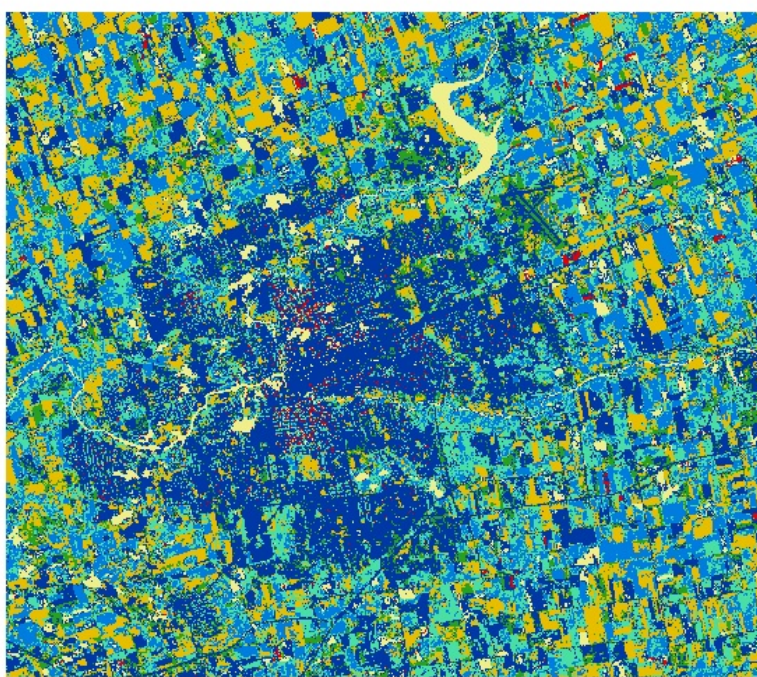
# Classifying a landscape

The choice of the classification scheme depends on the question being asked or the subject being addressed

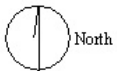




# Landscape Composition



Meter  
4634.51



- wood
- row crops and legume grasses
- small grain or grass
- fallow
- urban
- homestead
- water

Richness-

number of patch types

Proportional coverage-

% of landscape covered by each type

Evenness-

how evenly are the types represented

- Shannon's Evenness Index
- Simpson's Evenness Index

Diversity-

how diverse is the distribution of types

- Shannon's Diversity Index
- Simpson's Evenness Index
- Dominance



# Richness vs. evenness

- Hill (1973): all measures of biodiversity differ only in how much weight (importance) is allocated to common species vs. rare species
- How strongly do we want our index to differentiate between landscapes with species proportions:
  - 20:20:20:20:20 (5 species, evenly distributed)
  - 96:1:1:1:1 (5 species, but 1 super-common!)

## Dominance (O'Neill *et al.* 1988)

- To what extent do one or a few patch types dominate the landscape?
- The higher the  $D$ , ( $D_1$  in paper), the more one or a few types dominate.
- Values range from 0.19 to 1.5 in O'Neill paper (can be normalized to be between 0 and 1).

# Landscape Composition

Conifer = 75%  
Meadow = 10%  
Water = 5%  
Rock = 5%  
Roads = 5%

*Dominance* = 1 – evenness, or

$$\begin{aligned} & \ln(5) + (.75*\ln(.75) + .10*\ln(.10) + .05 \\ & * \ln(.05) + .05*\ln(.05) + .05*\ln(.05)) \\ & = 0.714 \end{aligned}$$

$$D_1 = \ln(M) + \sum[(p_i * \ln(p_i))],$$

where  $M$  = # patch types  
 $p_i$  = fraction of  $M$  that are type  $i$

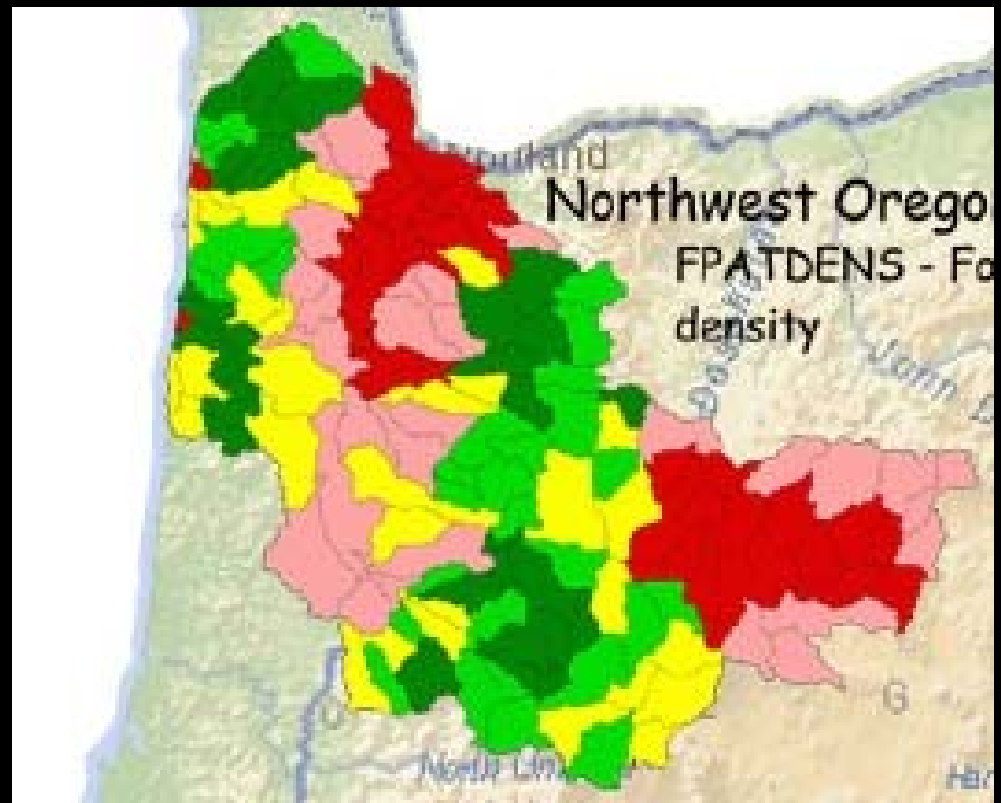
Conifer = 25%  
Meadow = 20%  
Water = 22%  
Rock = 21%  
Roads = 12%

$$\begin{aligned} & \ln(5) + (.25*\ln(.25) + .20*\ln(.20) + .22*\ln(.22) \\ & + .21*\ln(.21) + .12*\ln(.12)) \\ & = 0.026 \end{aligned}$$

# Landscape Configuration

**Patch level metrics** –  
summarize aspects of individual  
patches

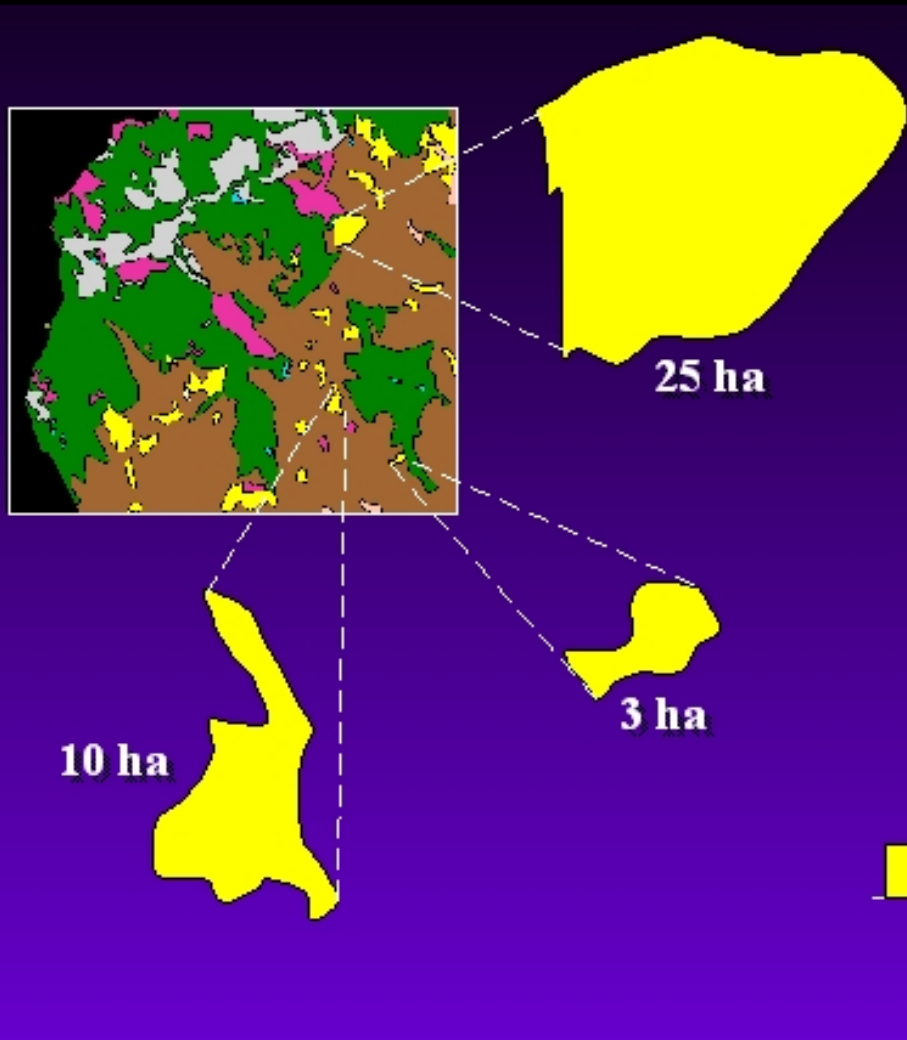
**Landscape level metrics** –  
summarize entire landscapes  
and thus the spatial pattern of  
patches



<http://www.umass.edu/landeco/research/fragstats/documents/Conceptual%20Background/Landscape%20Metrics/Landscape%20Metrics.htm>

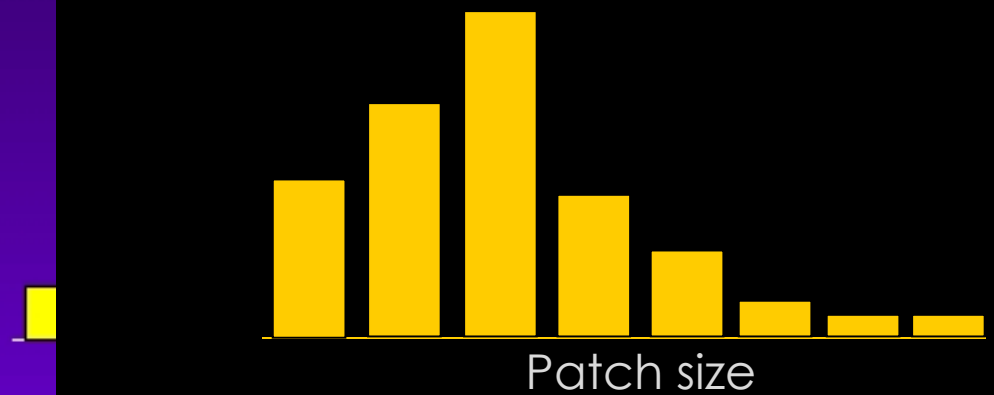


# Patch metrics



## Patch size distribution and density

- Mean patch size
- Area of the largest patch
- Variation in patch size
- Patch density



# Patch metrics

## Edge

Edge length

Edge to area ratio

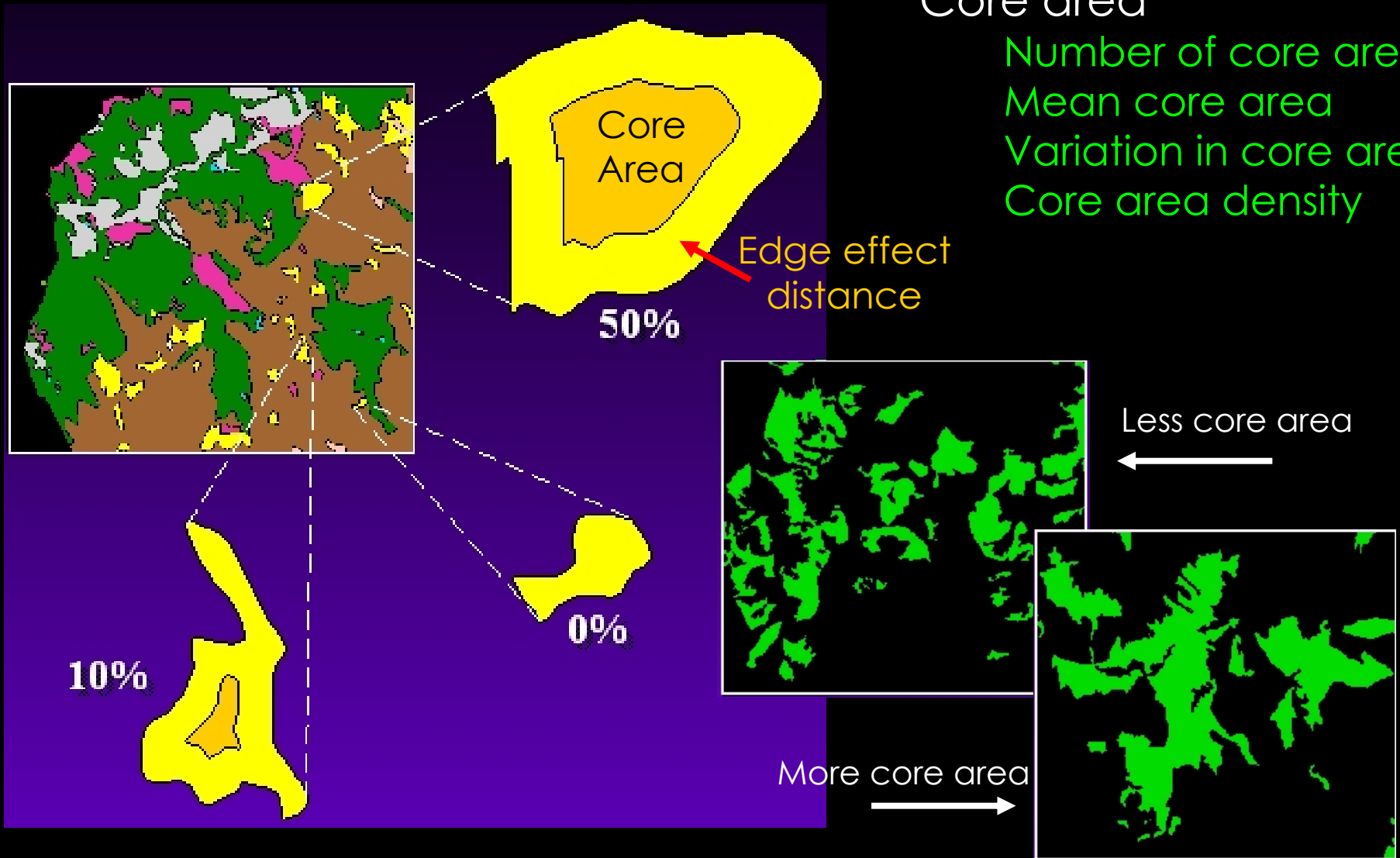
Edge contrast



# Patch metrics

## Core area

- Number of core areas
- Mean core area
- Variation in core area
- Core area density



# Patch metrics

## Isolation/proximity

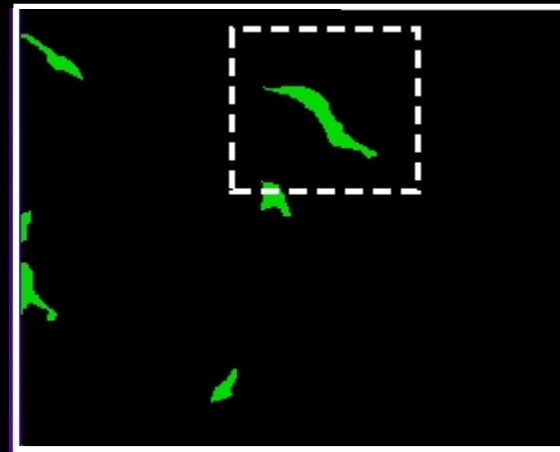
Mean nearest neighbor distance

Proximity index

Low isolation/high proximity

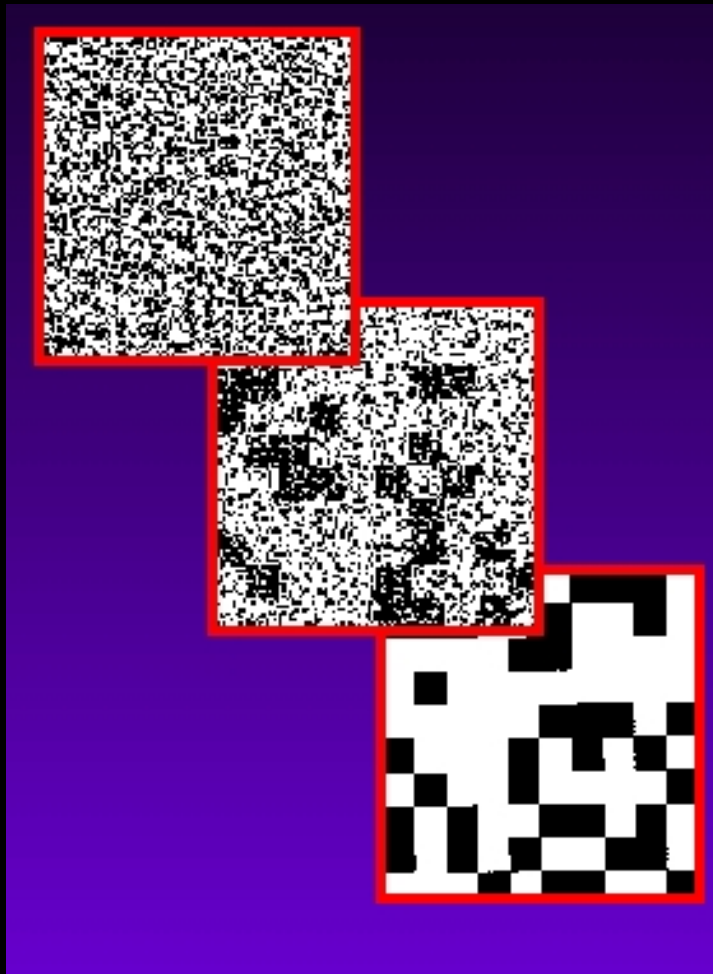


High isolation/low proximity





# Landscape-level metrics



## Dispersion

Nearest Neighbor Relative Variance Index

Nearest Neighbor Index of Dispersion  
(Clark & Evans Statistic)

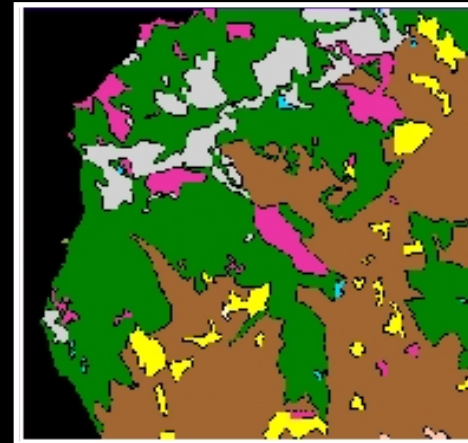
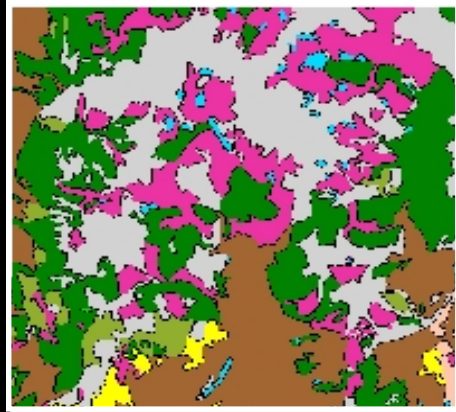
# Contagion (Texture) Index

- Nothing to do with **disease** (unless forest pathogens involved)
- Just how “mixed up” or “clumped” is the landscape?
- Straightforward interpretation: the greater the index, the more *aggregated* the landscape elements
- unitless

# Landscape-level metrics

## Contagion

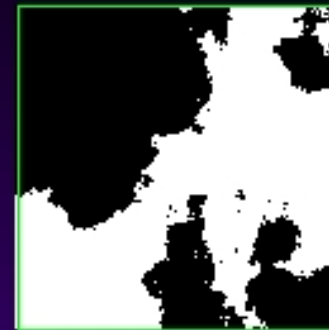
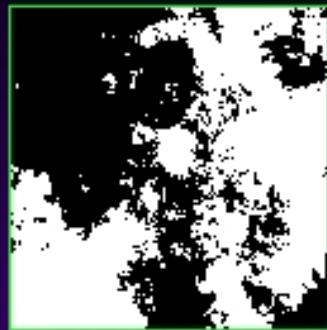
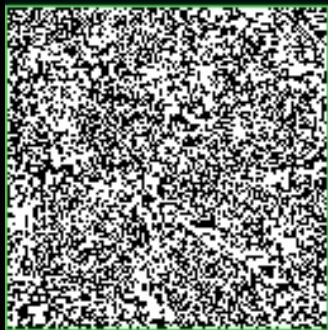
Contagion index



Low contagion



High contagion



# Calculating the Contagion Index

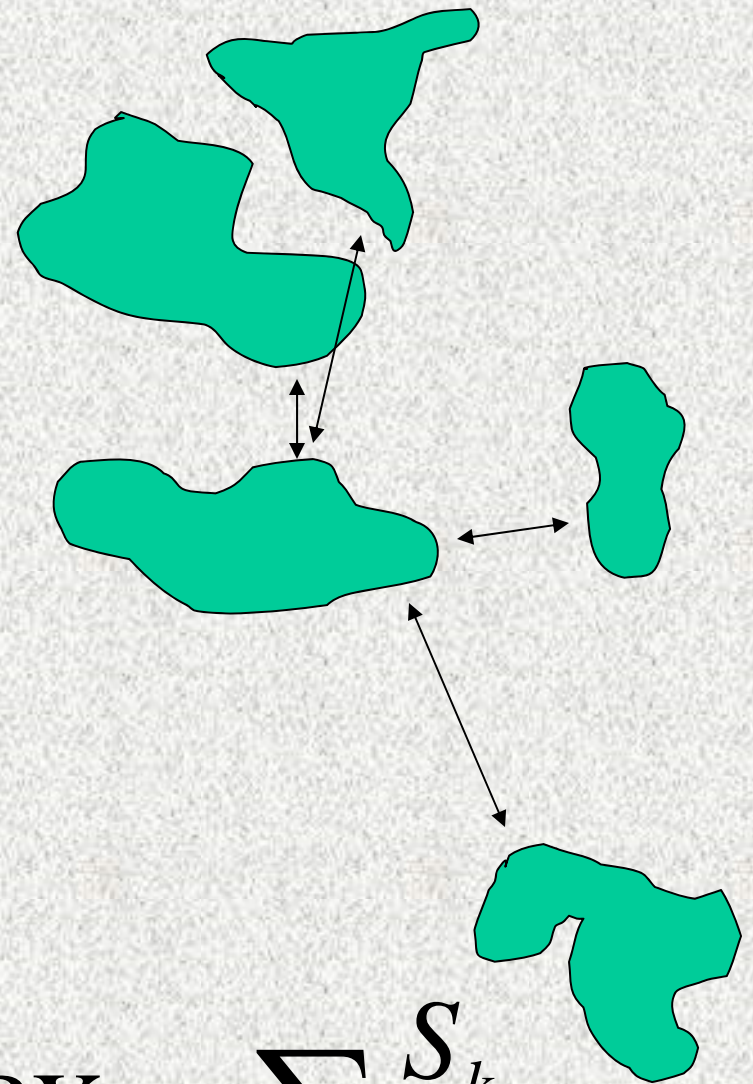
$$C = 2n \ln n + \sum_{i=1}^n \sum_{j=1}^n P_{ij} \ln P_{ij}$$

Where:  $n$  = number of grid cells,  $P_{ij}$  is probability of having a neighbor of type  $j$  for every cell of type  $i$ .

In analysis of 94 quadrangles by O'Neill *et al.* 1988,  $C$  (called  $D_2$  in paper) ranged from 9.5 (low “clumping”) to 22.8 (high “clumping”).

# Proximity Index

- Calculated for an individual patch
- Used to show relative isolation of patch from others of its kind
- Low values = isolated, high = close
- Calculated as:
  - Where  $S_k$  = area of  $k^{\text{th}}$  patch
  - $n_k$  = nearest-neighbor distance between focal patch and nearest cell of patch of same type
  - “search radius” is arbitrary, and depends on objectives!



$$PX_i = \sum \frac{S_k}{n_k}$$



# Landscape-level metrics

## Contrast

Total Edge

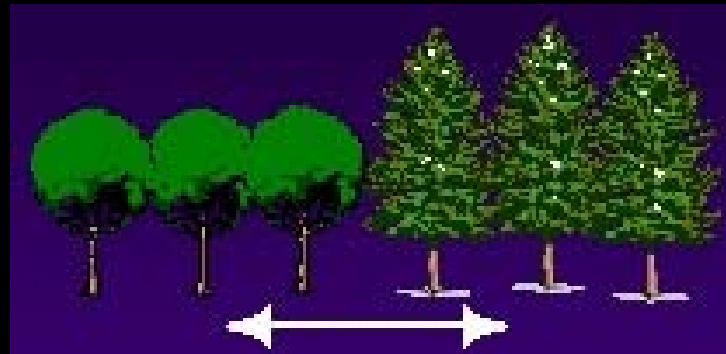
Edge density

Edge contrast index

Contrast-weighted edge density

Neighborhood contrast index

Floristic or type  
contrast



Structural  
contrast



$$CWED = \frac{\sum_{i=1}^m \sum_{k=i+1}^m (e_{ik} \cdot d_{ik})}{A} (10,000)$$

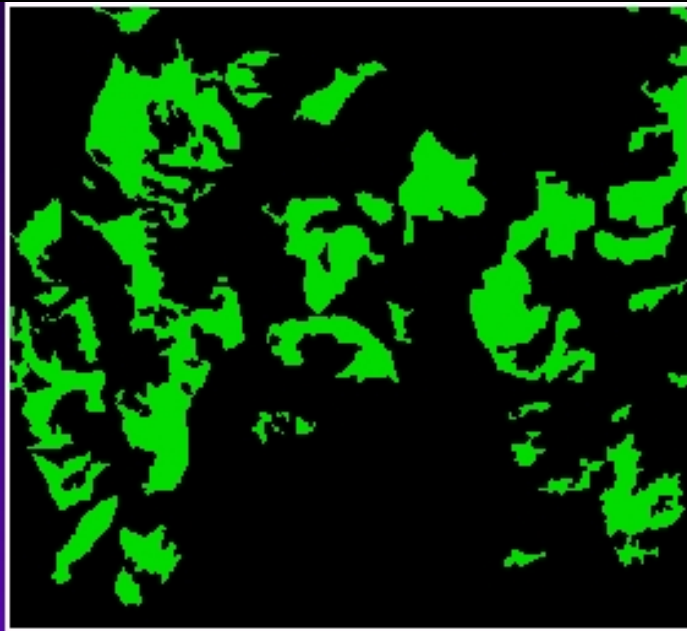


# Landscape-level metrics

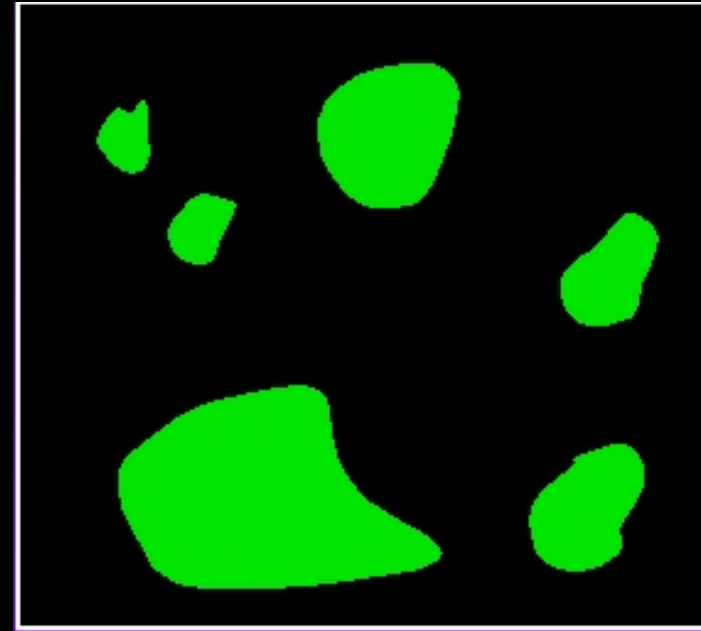
Shape complexity

Edge density

Shape index

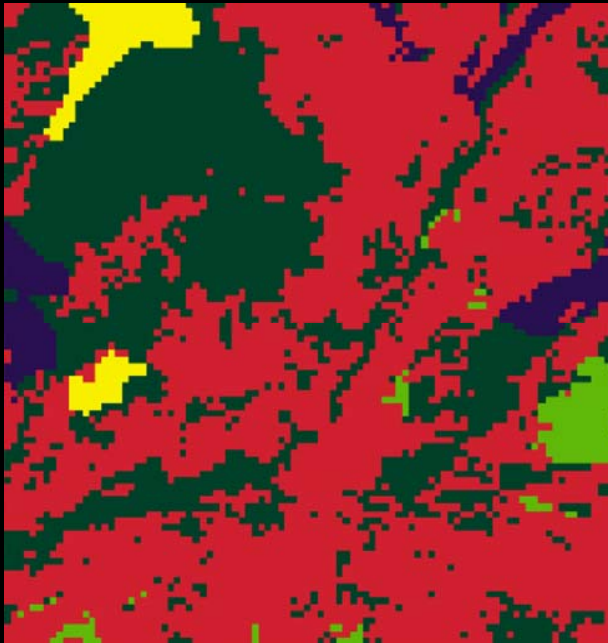


Complex geometry



Simple geometry

# Landscape-level metrics



## Connectivity

Connectance

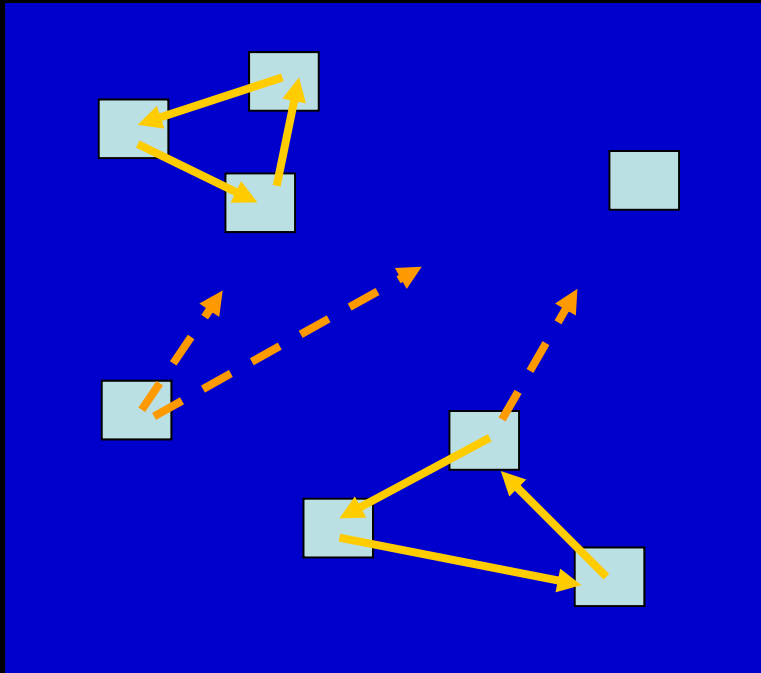
Patch cohesion index

- Resistance
- Percolation theory

Like contrast, connectivity depends on the object of investigation

“connected with respect to... “

# Connectivity

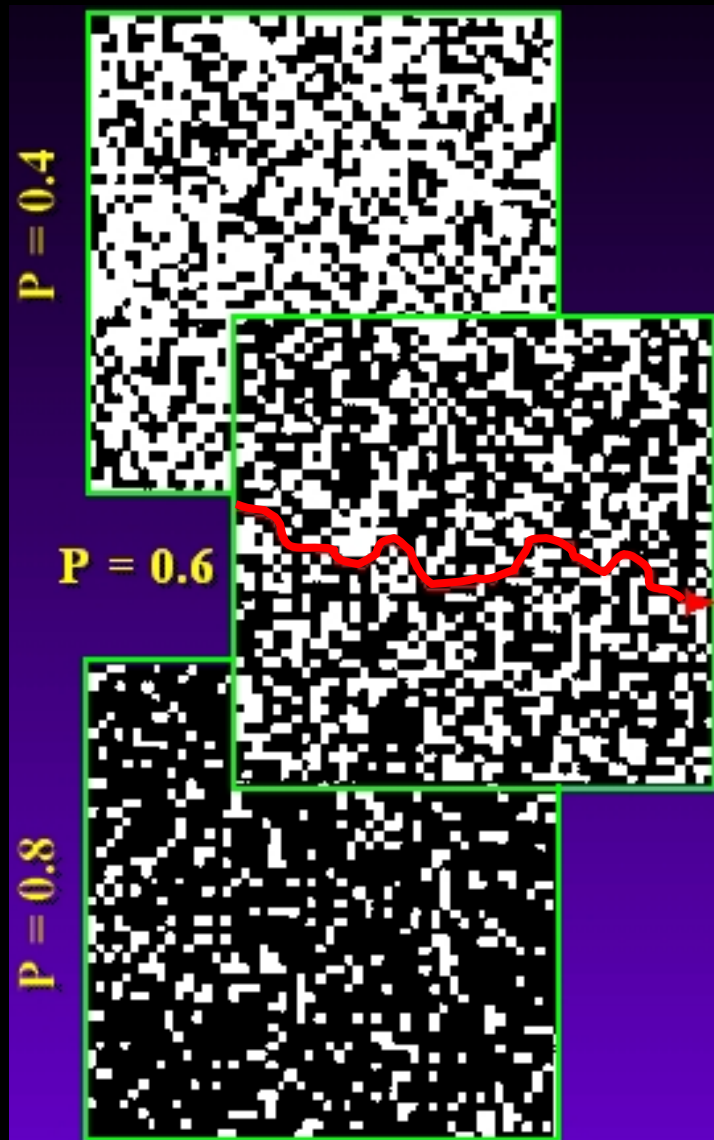


# Connectance

- Defined as the number of functional joinings
- Each pair of patches is either connected or not (0/1) based on a user-specified distance
- Distance can be Euclidean or resistance-weighted
- Expressed as a percent of all possible joinings between patches of the same type.



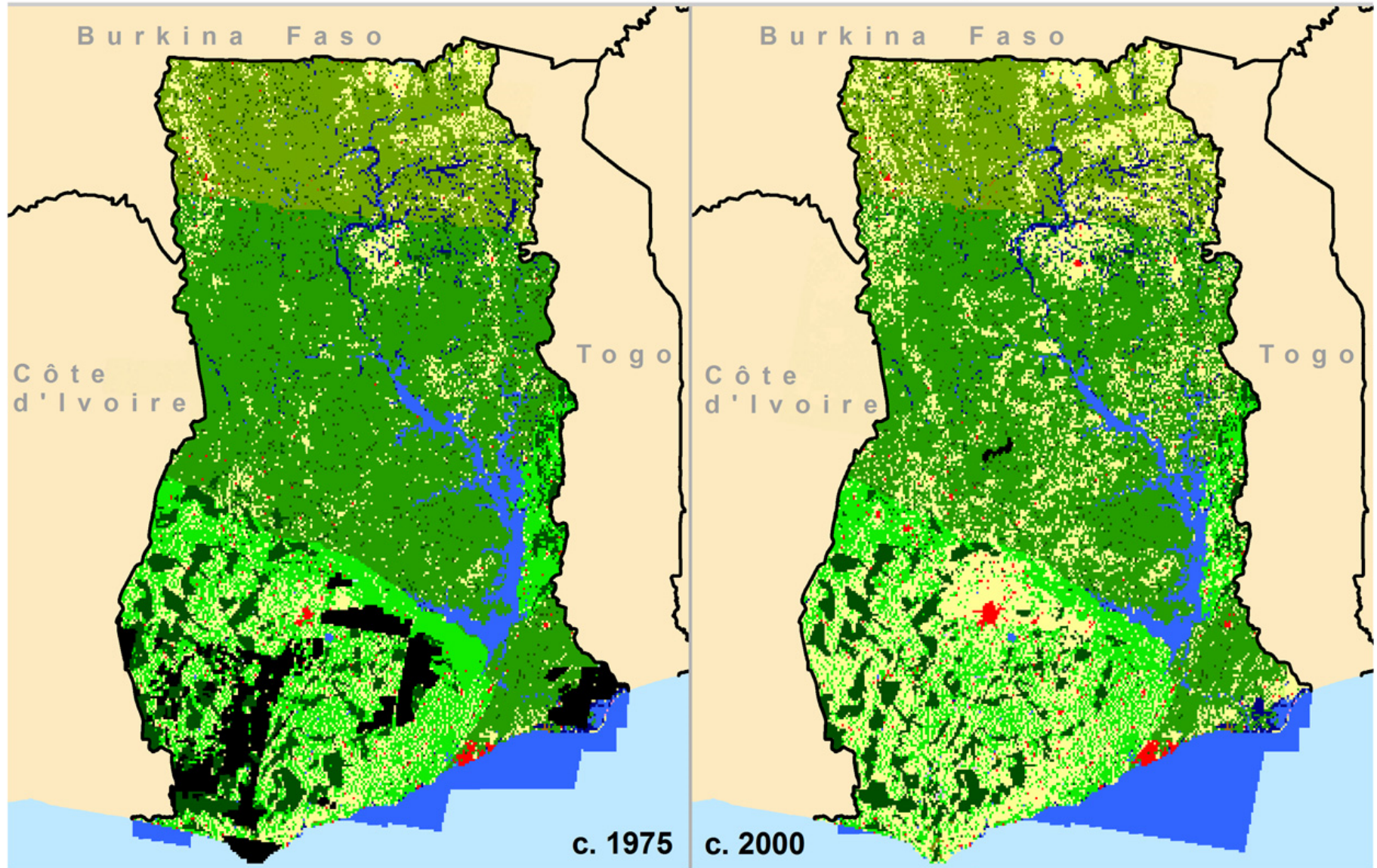
# Connectivity



## Percolation theory

- Connectivity can be inferred from patch density.
- Connectivity increases in a nonlinear fashion as the proportion map occupied by a given patch type ( $p$ ) increases.
- Once  $p = 0.5928$  (0.41 for the 8-neighbor rule), the largest connected cluster will span the map edge-to-edge

# Ghana Land Use / Land Cover Change



## Land Use/Land Cover Classes



0 50 100 200 Kilometers





# Issues with measuring landscape patterns

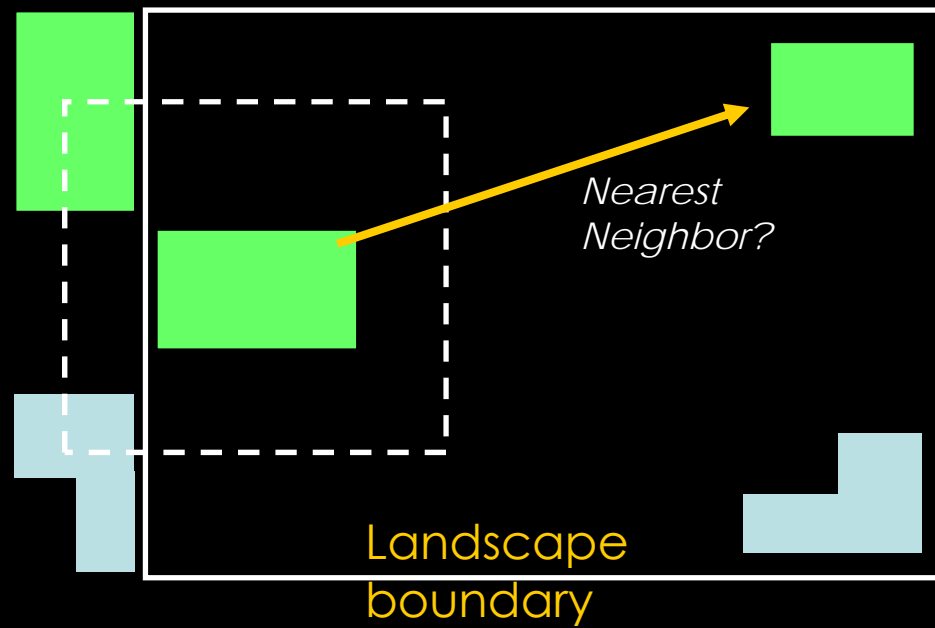
Boundary effects

Scale effects

Redundancy

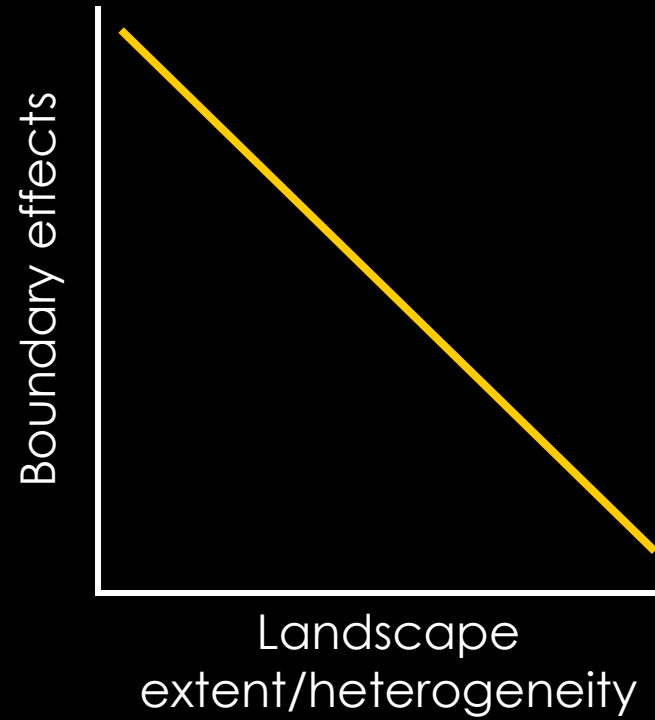
Rules / Approaches

# Boundary Effects



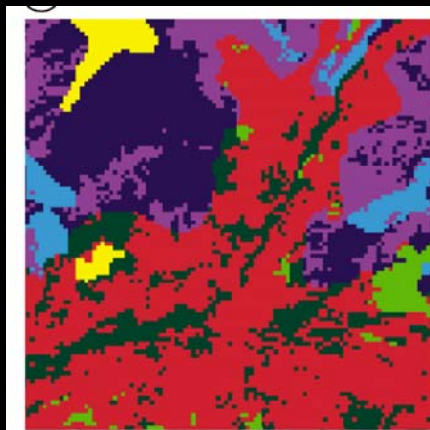
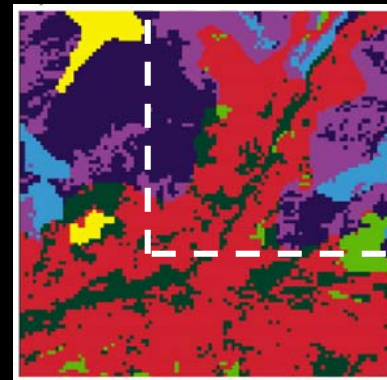
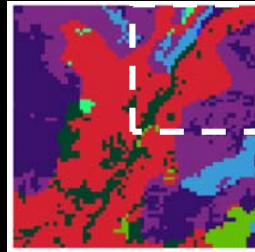
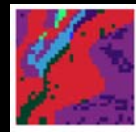


# Boundary Effects



# Scale effects

Both grain and extent affect how landscape metrics are interpreted, and must be consistent across landscapes to be compared.



50 x 50 resolution



100 x 100 resolution



200 x 200 resolution

# Effects of scale on pattern measurement

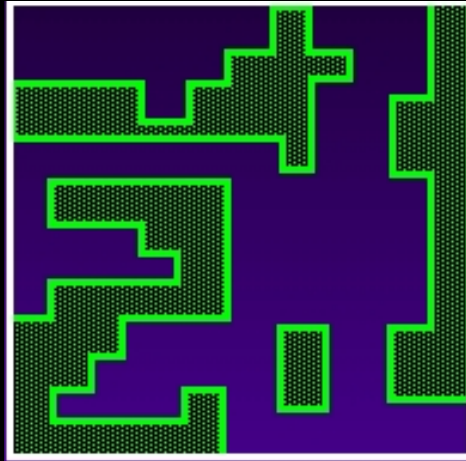
## *Relationship between extent and three landscape metrics*

Table 8. Regression of three landscape indices with extent (log area). Values are the slopes and ( $r^2$ ).

Scene	Landscape parameter		
	Diversity ( $H$ )	Dominance ( $D$ )	Contagion ( $C$ )
Goodland, KS	0.008 (0.19)	0.197 (0.88)	3.253 (0.78)
Natchez, MS	0.127 (0.78)	-0.015 (0.02)	1.535 (0.72)
Knoxville, TN	-0.058 (0.38)	0.111 (0.87)	0.938 (0.47)
Greenville, SC	0.023 (0.10)	0.067 (0.70)	0.067 (0.67)
Waycross, GA	0.044 (0.84)	0.081 (0.50)	1.519 (0.57)
Macon, GA	-0.006 (0.06)	0.077 (0.93)	1.373 (0.66)
Athens, GA	0.041 (0.42)	0.081 (0.57)	1.569 (0.83)

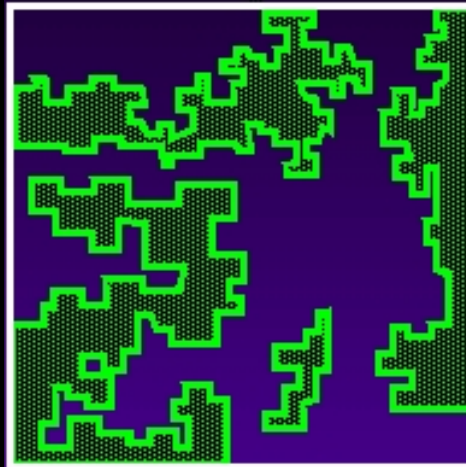
# Scale effects

Coarse-grained



Edge = 1000

Fine-grained



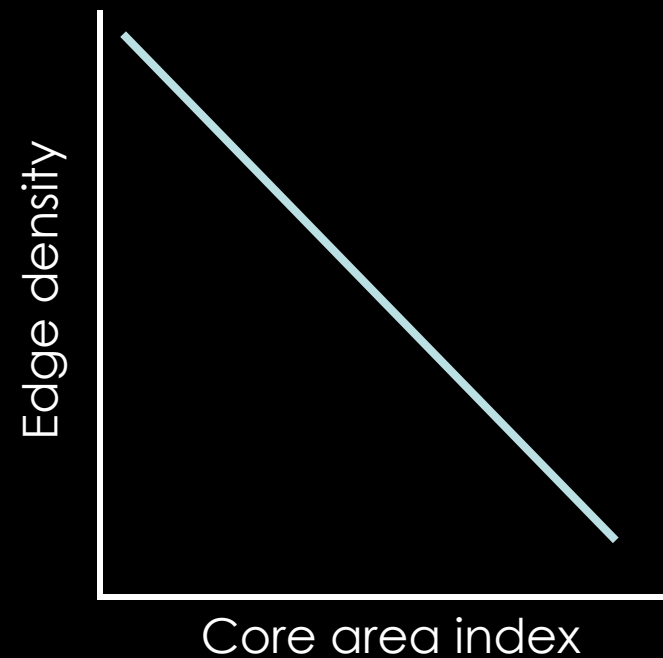
Edge = 1500

# Redundancy

Many measures are highly correlated

$$\text{Mean Patch Size} = \frac{\text{Total area}}{\text{Number of patches}}$$

$$\text{Patch Density} = \frac{\text{Number of patches}}{\text{Total area}}$$





# Redundancy

Riitters et al. (1995) found that only five metrics were needed to explain most of the variability in their landscapes:

- Number of patch types
- Mean edge/area ratio
- Contagion
- Average patch shape
- Fractal measurements

# Riitters *et al.* 1995

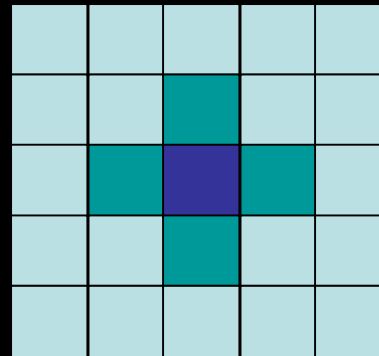
- How did they do it?
  - Calculated 55 metrics for 85 landscapes  
( $55 \times 85 = 4675$ )
  - Created a table of correlation coefficients  
(0=no correlation, 1= perfect correlation)  
between the metrics (*factor analysis*)
  - Used high correlation coefficients to  
distinguish “families” of indices
  - Indices that explained most variation in  
data set were selected as “representative  
indices”

# Rules / approaches

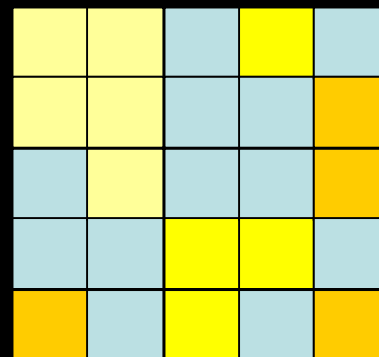
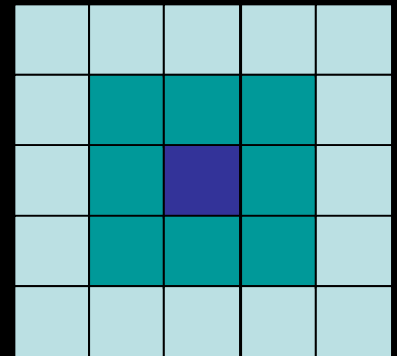
Neighbor rules are critical in defining landscape metrics.

Contrast weights will affect weighted edge indices.

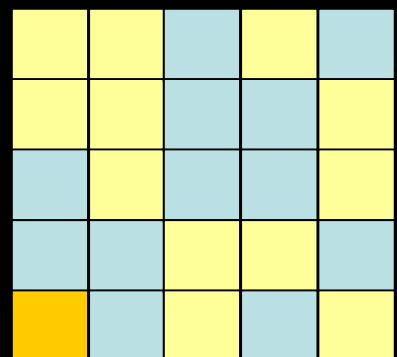
4-neighbor rule



8-neighbor rule



6 patches



2 patches

# Characteristics of Patch Elements

- Patch analysis is incomplete without examining the intrinsic nature of patches
- GET INTO THE PATCH! Without these metrics, a patch is just a pretty polygon on a map or GIS.
- Patch characteristics determine:
  - Utility by organisms
  - Edge effects
  - Susceptibility to disturbance

# Function

- Net Primary Productivity:  
= GPP (photosynthesis) – Respiration = NPP
- Production of wildlife numbers (head of elk, young spotted owls, tailed frogs, etc.)
- Watershed regulation (Andrews LTER example)
- Silt and sediment regulation (TSS- total suspended solids)
  - Compare regions w/ harvest vs. unharvested (control)
- CWD production



# Composition

- Landscape elements cannot be considered without considering composition
- Several ways to measure this
- $\alpha$  and  $\beta$ -richness: mere number of species in a spatial context
  - Whittaker (1977): *inventory diversity*: point (100-500 m<sup>2</sup>),  $\alpha$  (<1-625 ha),  $\gamma$  (gamma) (625-2500),  $\epsilon$  (epsilon) (>2500 ha)
  - comparison of functional groups: trees, shrubs, etc.
- **Evenness**
- **Biodiversity Indices**: a composite of richness and evenness
  - Simpson
  - Shannon-Wiener



1.



2.

