
Recent Advances in Geographic Information Science

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Santa Barbara

Outline

- Geographic information science
 - motivation, history, content
- Uncertainty
 - recent ideas
- An integrated portal
 - technical feasibility
 - recent progress

1985

- GIS well established
 - a nascent software industry
 - texts
 - Burrough, *Principles of GIS*
 - MacDougall, *Computer Programming for Spatial Problems*
 - a scattering of courses
 - UWO circa 1976
 - various things could be achieved by computer processing of spatial data
 - measurement and analysis
 - production and editing
 - map-making

...but some big questions

- What to teach?
 - training in software?
 - education in principles?
 - what were those principles?
- What to research?
 - algorithms and data structures to do it "faster, better, cheaper"

The analogy to statistics

- A branch of mathematics dating from well before the advent of computers or calculators
 - theory, numerical analysis predated computation
- Where is the equivalent theoretical framework for GIS?
 - computation predated the development of theory
- GIS is to x as the statistical packages are to statistics
 - what is x ?
- "A spatial analytic perspective on GIS", *IJGIS* 1: 327-334, 1988

The NCGIA research agenda

- Discussions initiated by Ron Abler, 1986-1987
- The 1987 solicitation
 1. Spatial analysis and spatial statistics
 2. Languages of spatial relations
 3. Visualization
 4. Artificial intelligence and expert systems
 5. Social and institutional issues

SDH, Zurich, August 1990

- Goodchild keynote
 - why "spatial data handling"?
 - are we the UPS of GIS?
- "Spatial information science"
 - NCGIA as a multidisciplinary enterprise
 - what disciplines can contribute to a basic science of geographic information?
 - spatial statistics
 - spatial databases
 - computational geometry
 - spatial cognition
 - "Geographic information science", *IJGIS* 6(1): 31-45 (1992)

Consensus-building: UCGIS

- An organization to represent the growing GIScience community
 - building the community
- Opening UCGIS Assembly, Columbus, June 1996
- What is the research agenda of GIScience?
 - white papers, discussion, vote by institutional members

The UCGIS research agenda (1996, revised 1998)

- Cognition
- Extensions to representation
- Acquisition and integration
- Distributed and mobile computing
- Interoperability
- Scale
- Uncertainty
- Spatial analysis
- Future of the spatial information infrastructure
- GIS and society

Other agendas

- Socially focused
 - Rhind 1988
- Computationally focused
 - NSF Digital Government Initiative
 - National Center for Supercomputer Applications, OGC
 - National Research Council Computer Science and Telecommunications Board
 - "IT Roadmap for a Geospatial Future", 2003

Varenius: a top-down perspective

- NCGIA funded by NSF as an 8-year project, 1988-1996
- Varenius: NCGIA's Project to Advance GIScience
 - 1996-1999
- A three-vertex research agenda
 - the cognitive vertex
 - human-centric
 - the computational vertex
 - computer science
 - the societal vertex
 - social science

Societal

Privacy and
confidentiality

Costs and
benefits

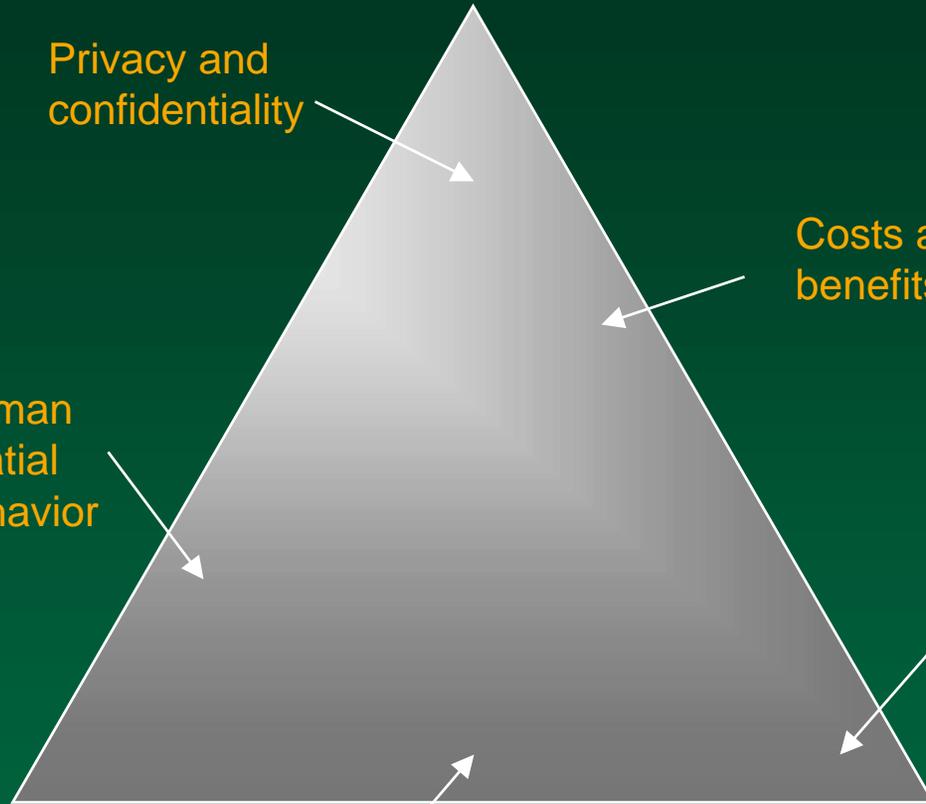
Human
spatial
behavior

Spatial
databases

Cognitive

User interface
design

Computational



Digital representations of geographic reality

- Position as a measurement problem
- The world is infinitely complex
- The binary alphabet
 - hard limits?
 - uncertainty as difference
 - in the mind of the user
- Cartographic sources
 - the power of maps



Tschöfs

Bräunhof

Rainings

Schnüders

Flains Moos

Wiesen

STERZING

Thunus

Deutschhaus

Wölfstöck

Wendelhof

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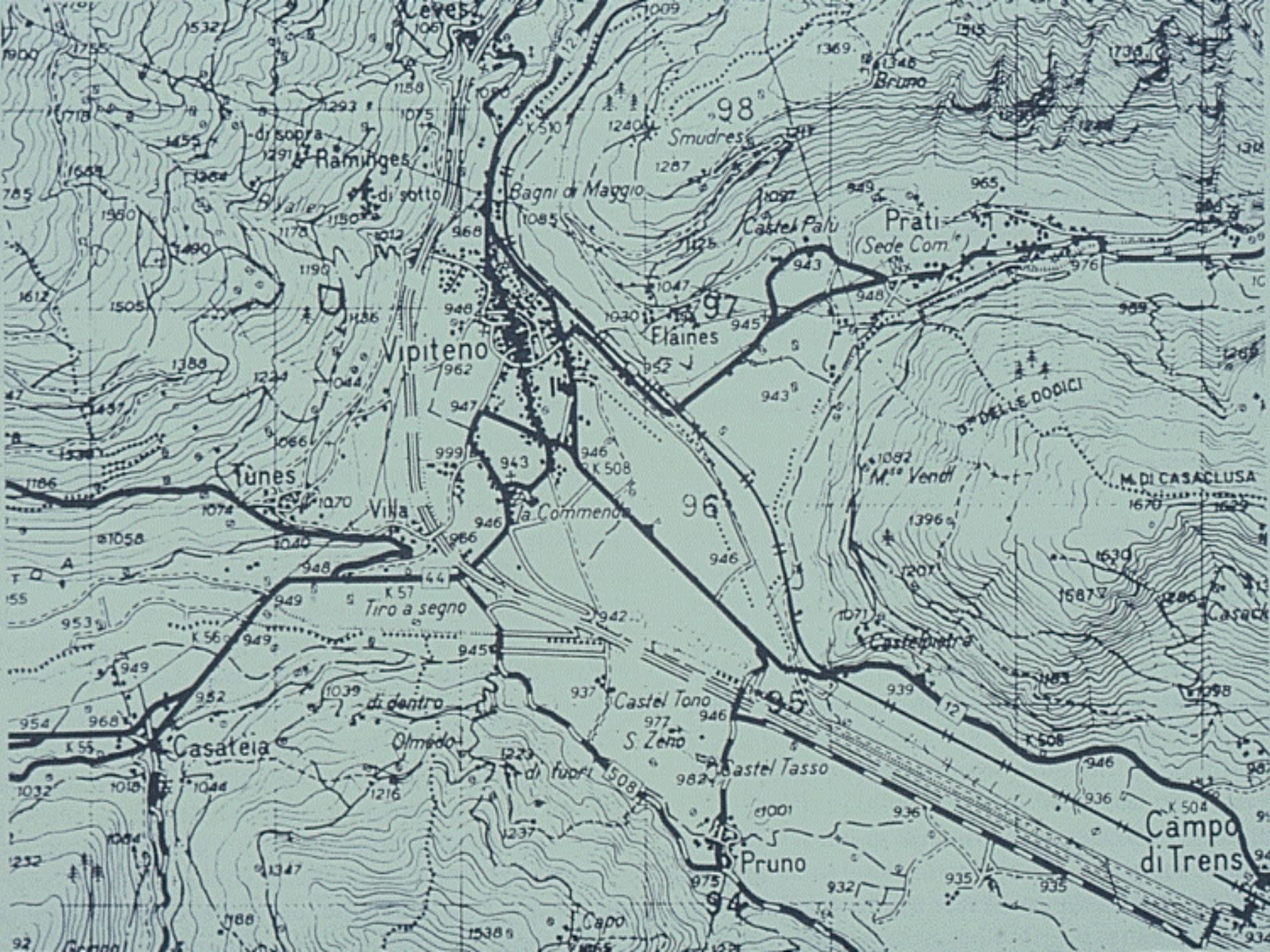
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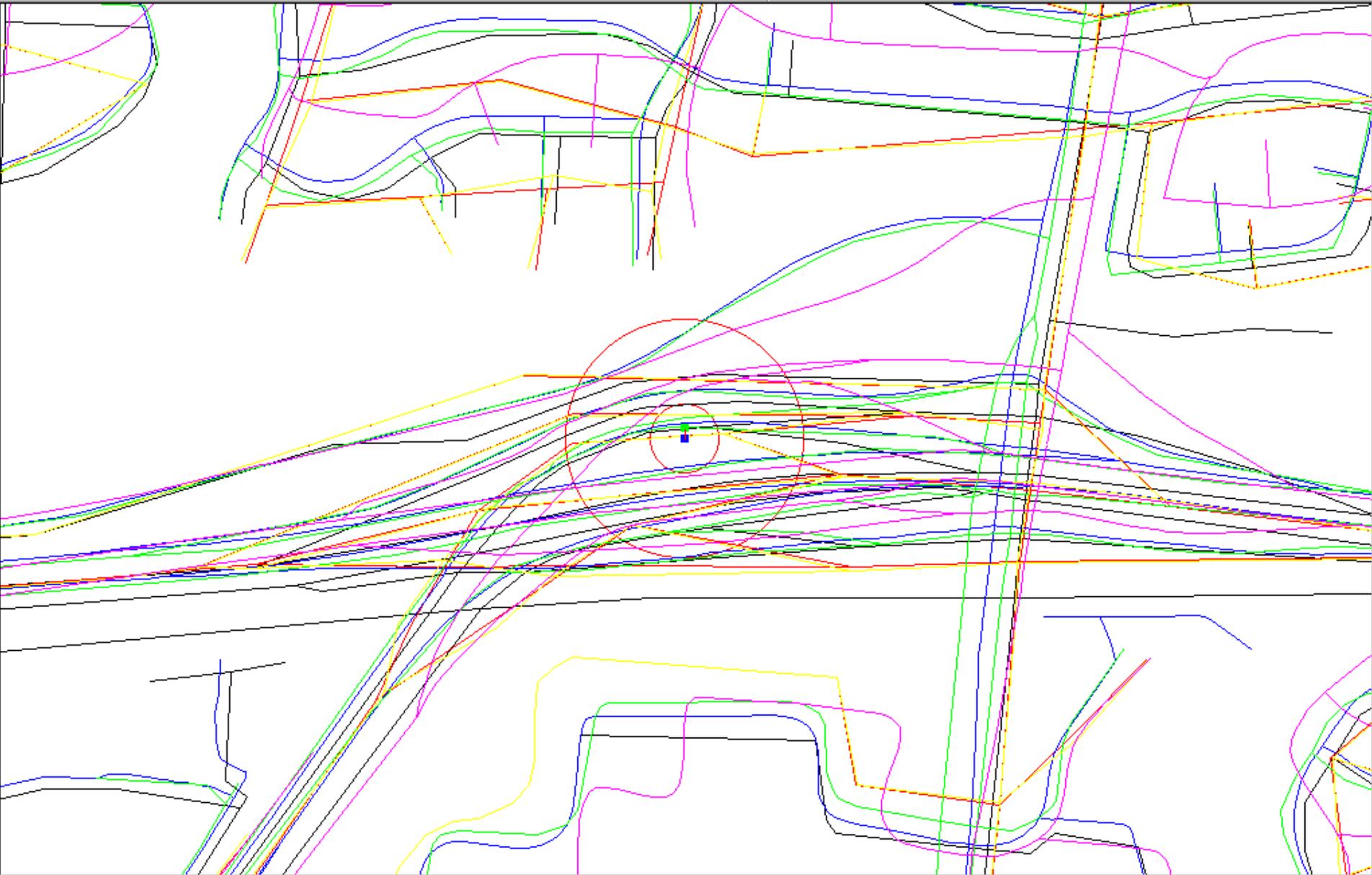
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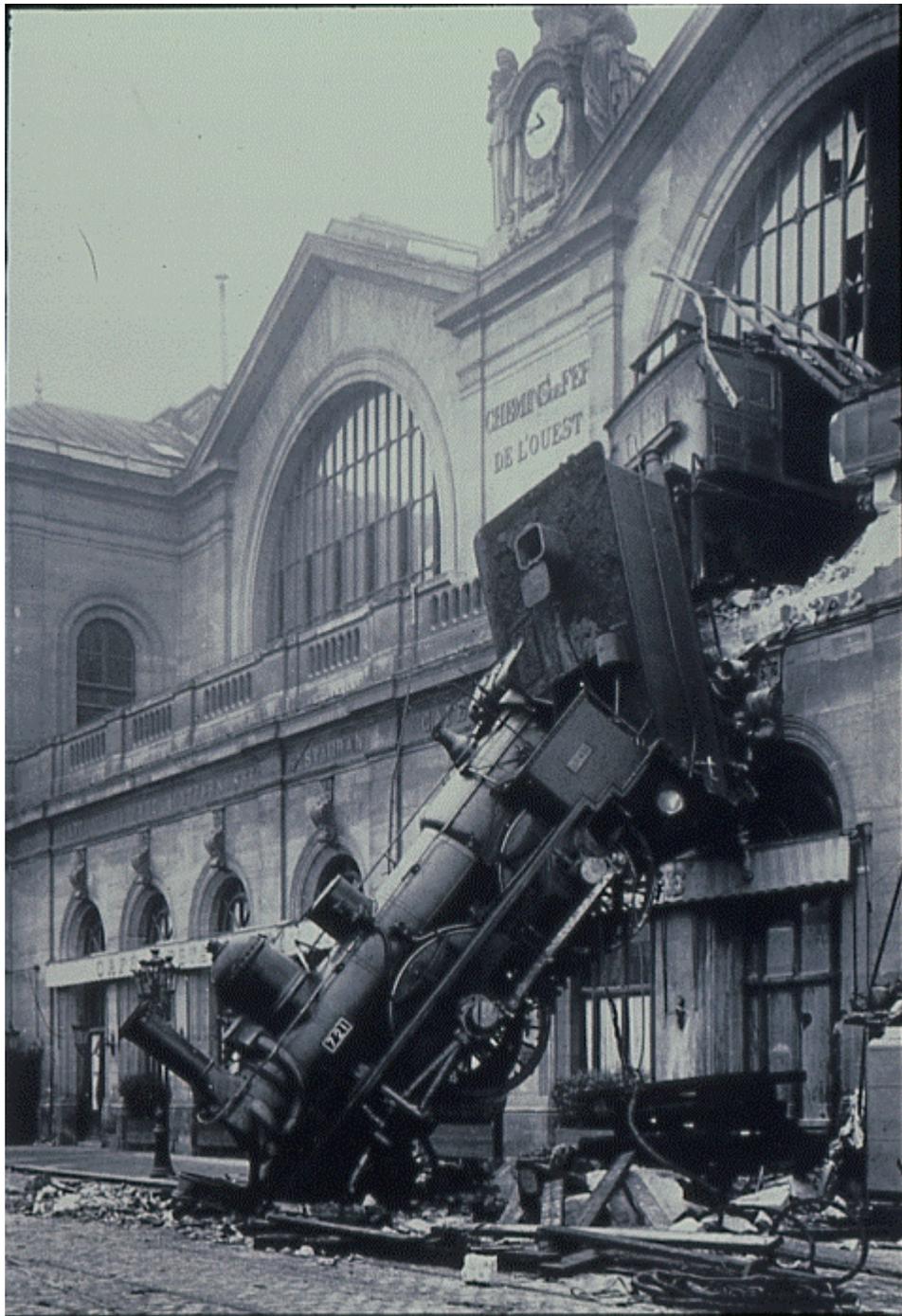






The GIS world

- Science
- Public policy
- Litigation
 - regulation by procedure
- Military, intelligence
- General user community

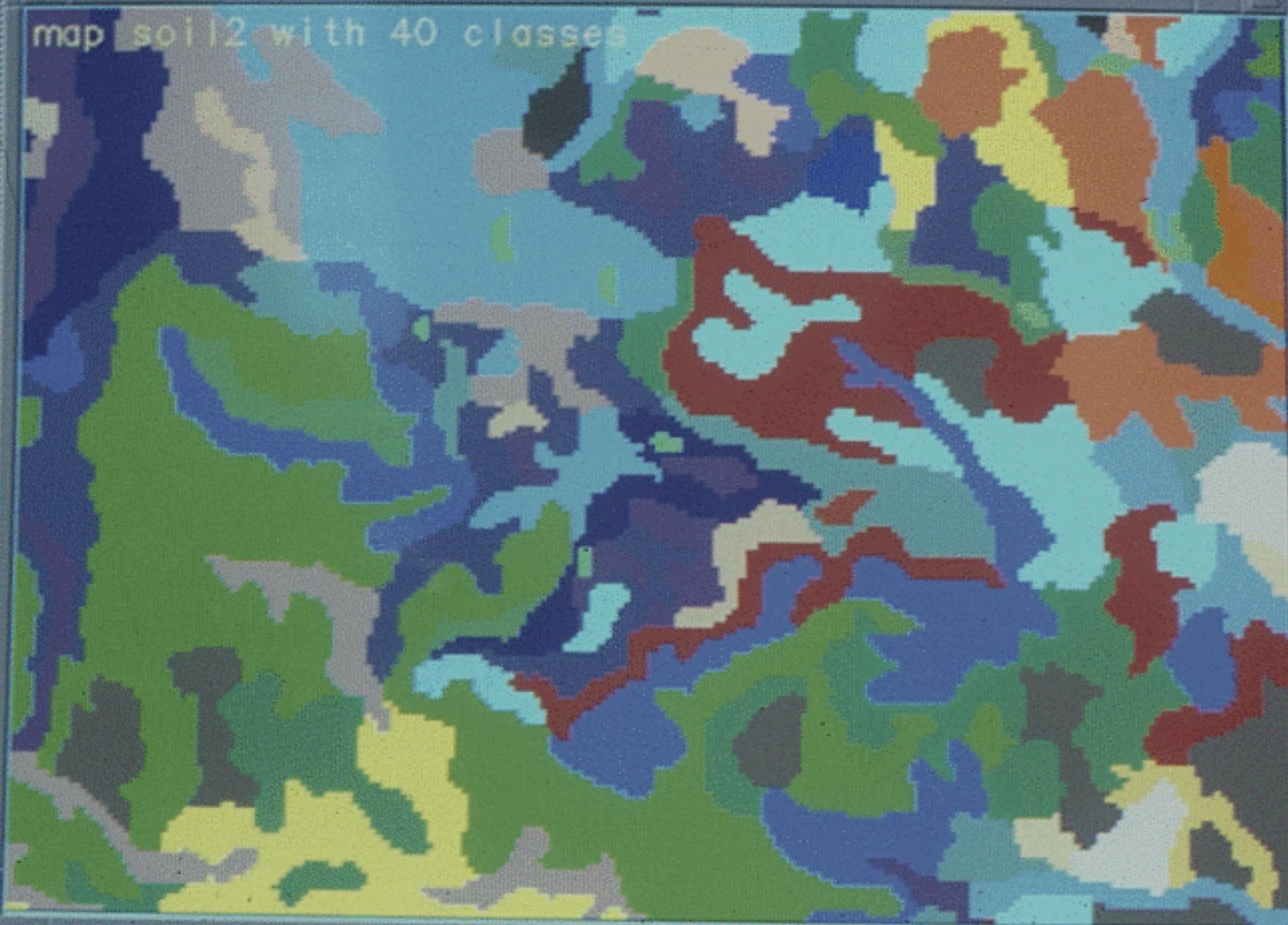


Error modeling in GIS

- $Z = z + \varepsilon$
- Geostatistics
 - conditional simulation
 - co-Kriging
- Nominal fields

GRASS Monitor AIX

map soil2 with 40 classes



The area class map

- Field of nominal values $c(\mathbf{x})$, $n > 1$
 - spatially autocorrelated
 - count of i, i joins greater than expected
- Collection of discrete objects
 - nodes, edges, areas

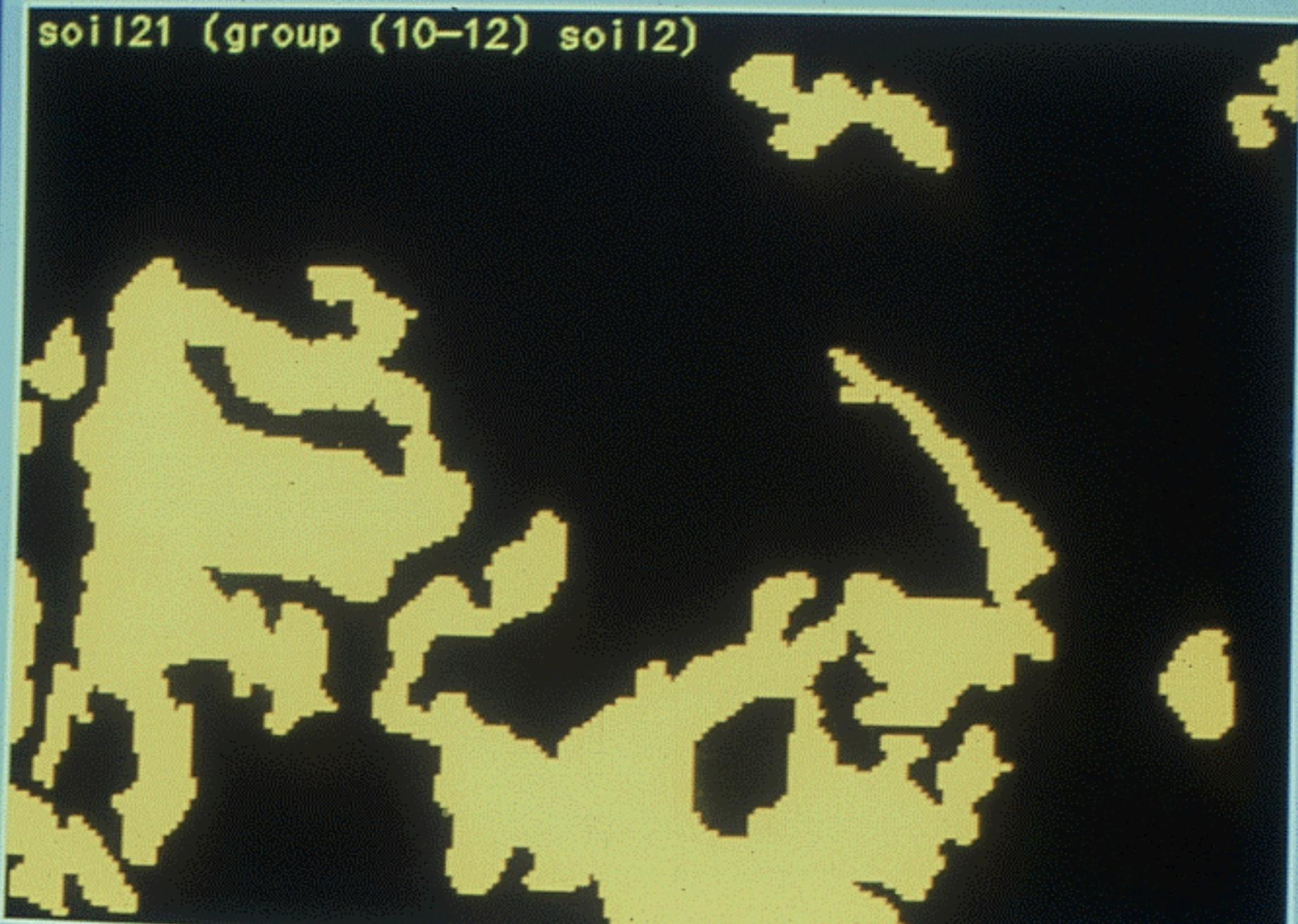
The confusion matrix

- Useful descriptive device
 - quality control
- Comparing classifiers, observers, scales, accuracies
- Use all map (measure or count areas), sample of areas, points, pixels
- No information on joint distributions
 - little value for error modeling, uncertainty analysis

Spatial dependence in outcomes

- Independent outcomes
 - zero spatial dependence between pixels
 - perfect positive spatial dependence within pixels
 - implies pixel size is meaningful
- Induce spatial dependence
 - range \gg pixel size
 - spatial dependence falls smoothly
 - independent of pixel size

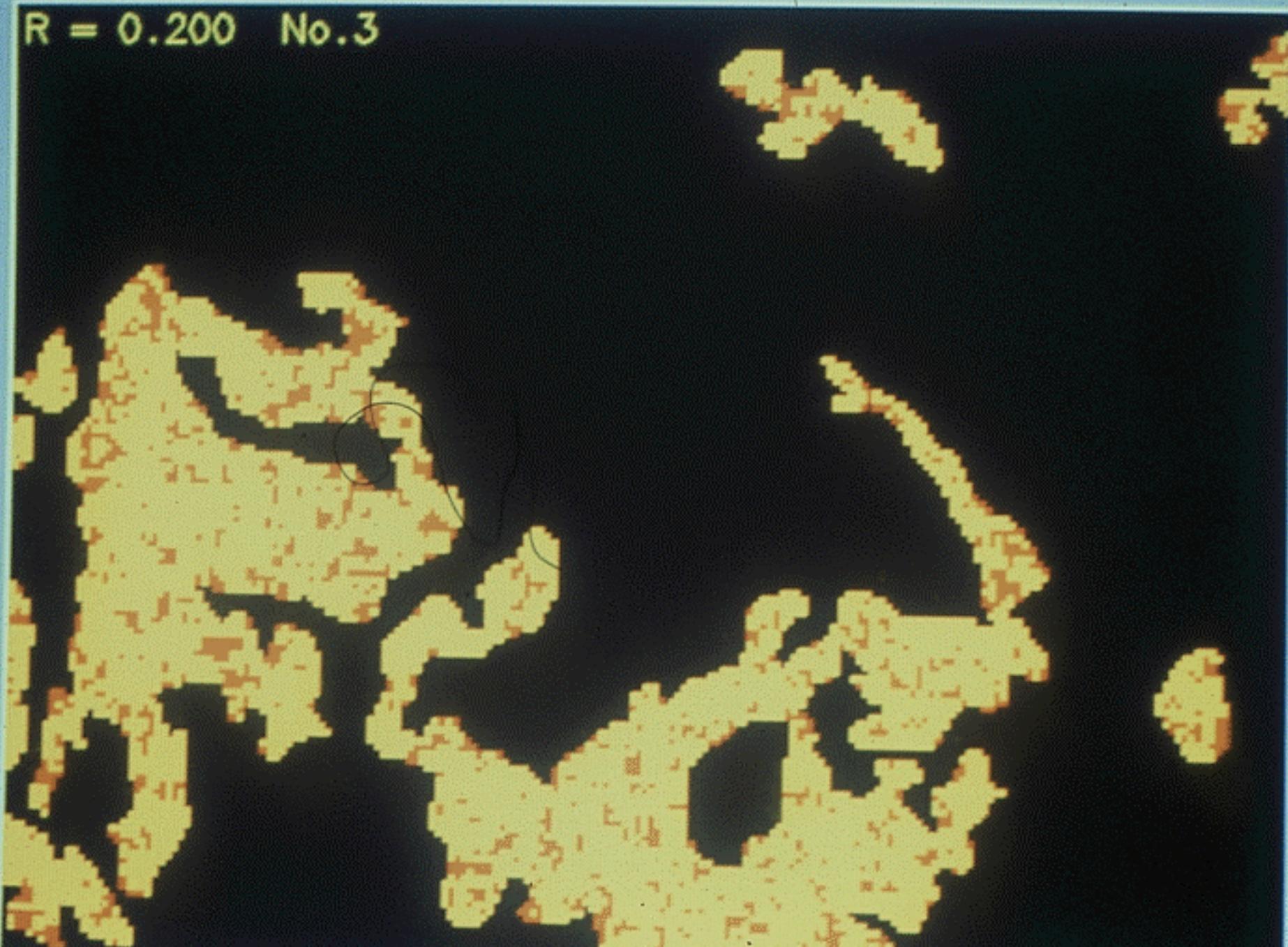
soil21 (group (10-12) soil2)



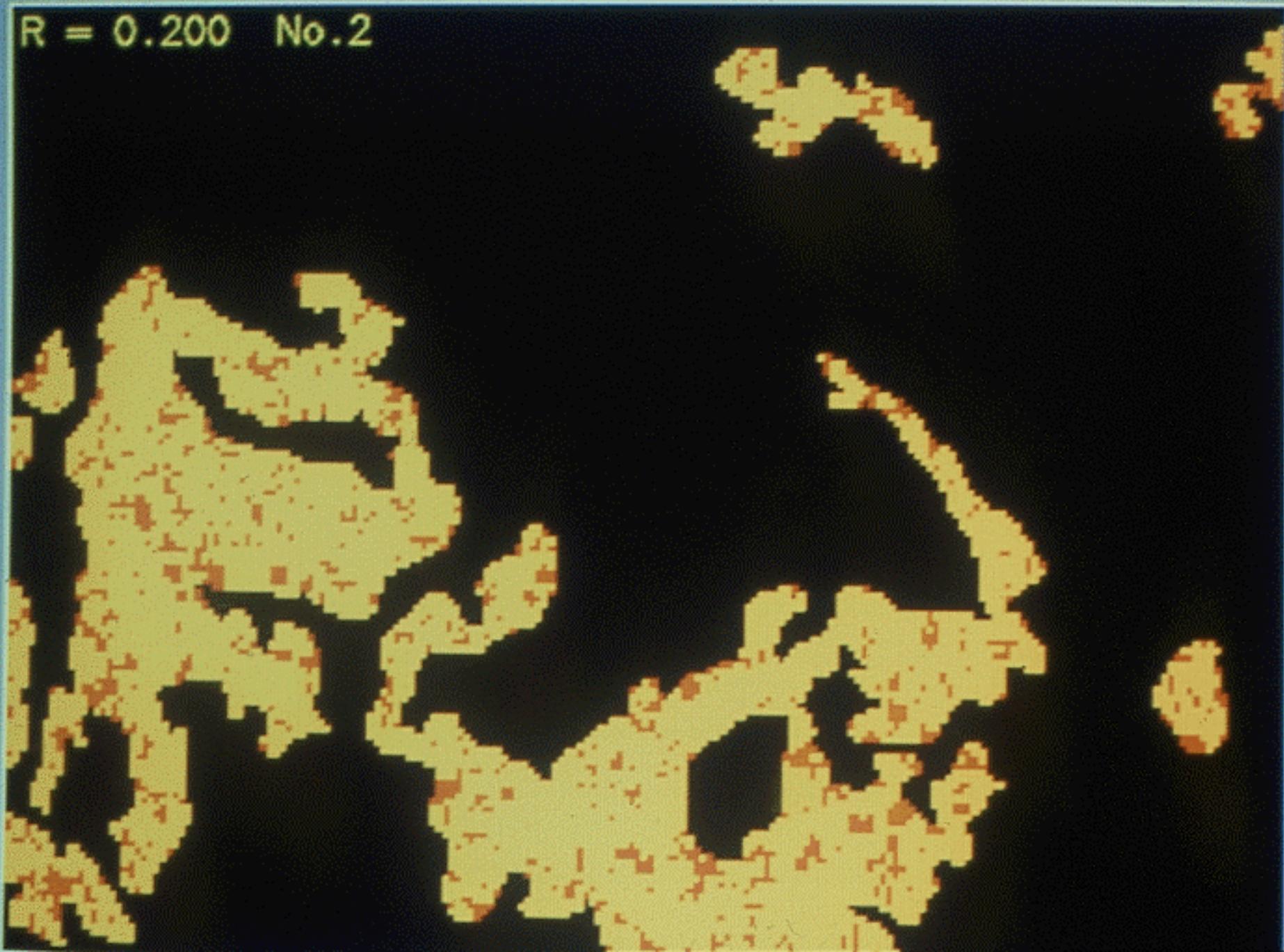
Model

- $\{p_1, p_2, \dots, p_n\}$
- correlation in neighboring cell outcomes
- posterior probabilities equal to priors
- 80% sand, 20% inclusions of clay
- no knowledge of correlations

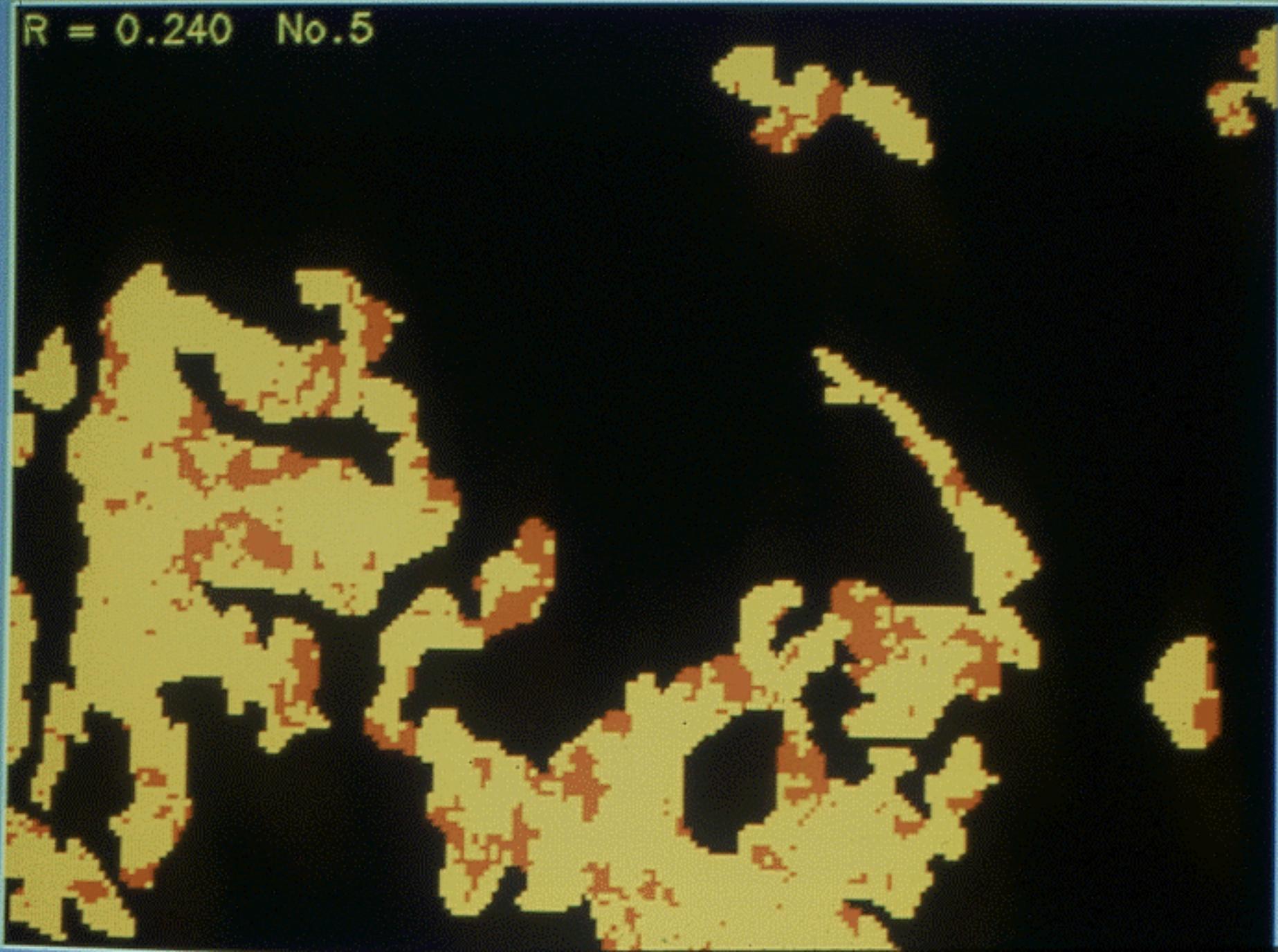
R = 0.200 No.3



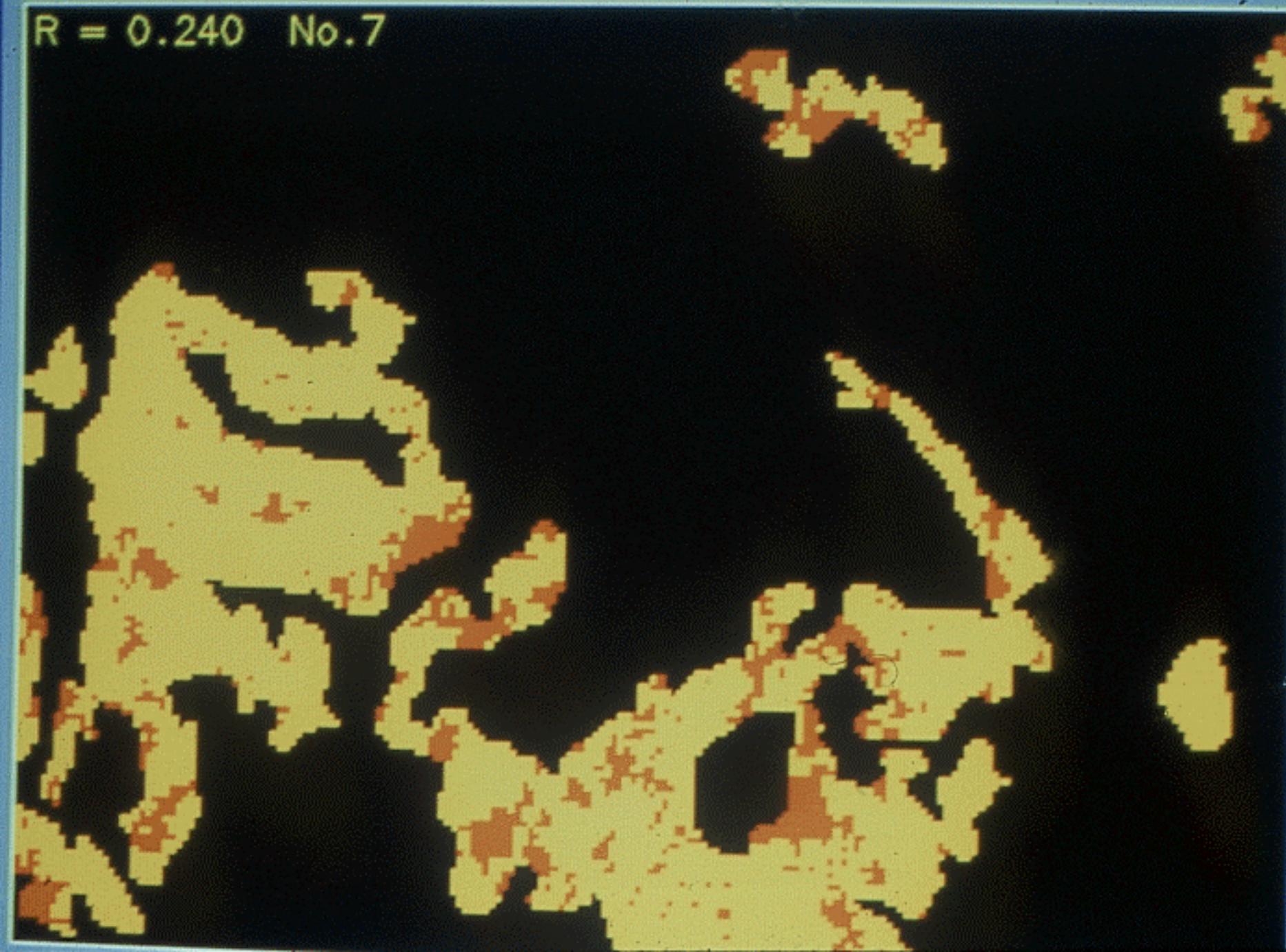
R = 0.200 No.2



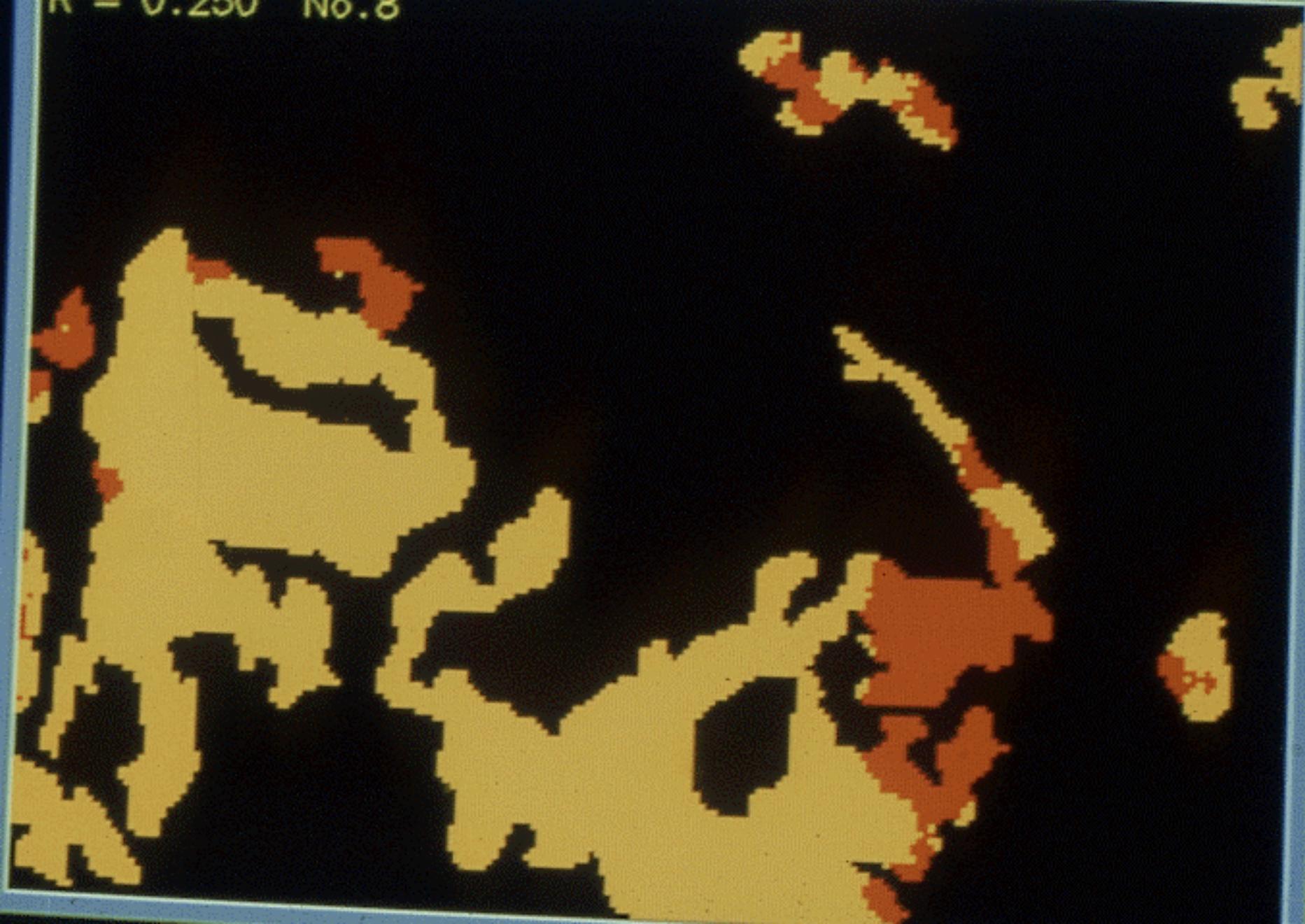
R = 0.240 No.5



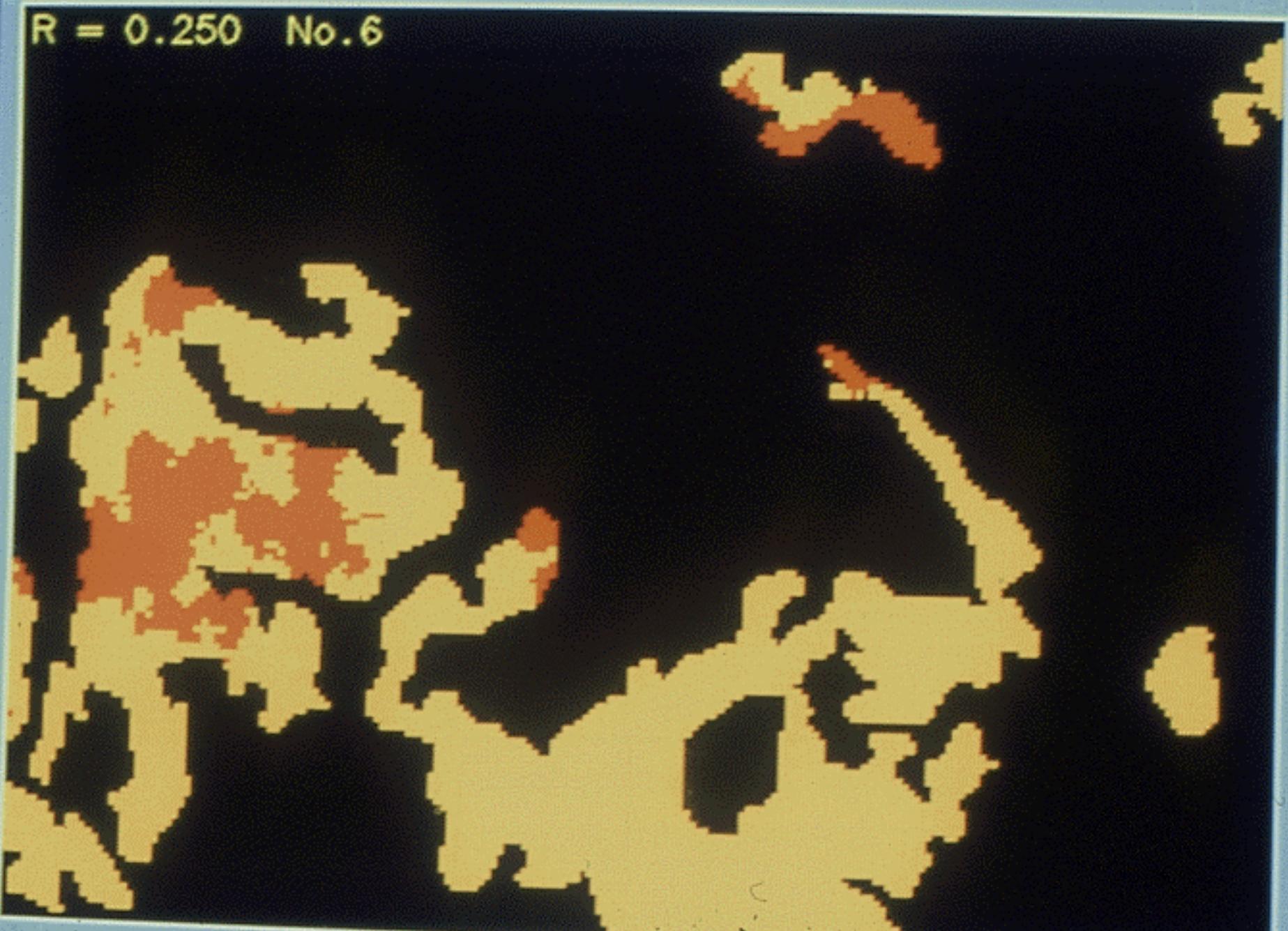
R = 0.240 No.7



R = 0.250 No.8



R = 0.250 No.6



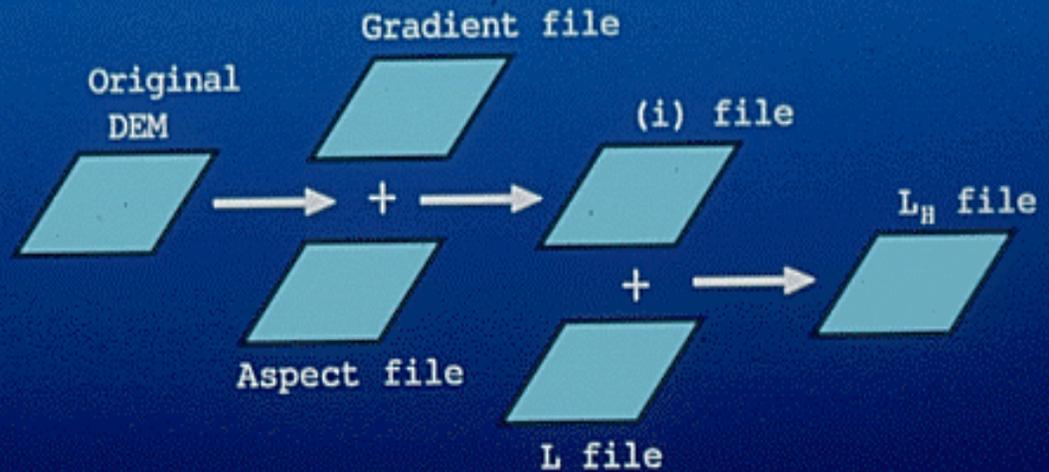
Estimates of Area and Associated Uncertainties for Various Levels of Spatial Dependence

| ρ | Sample Size | Mean Estimate | Standard Error |
|--------|--------------|---------------|----------------|
| 0.000 | (calculated) | 6010 | 35 |
| 0.200 | 10 | 6139 | 156 |
| 0.240 | 10 | 6153 | 210 |
| 0.245 | 10 | 6158 | 268 |
| 0.249 | 10 | 6254 | 395 |
| 0.250 | 10 | 6514 | 753 |
| LIMIT | (calculated) | 6010 | 3005 |

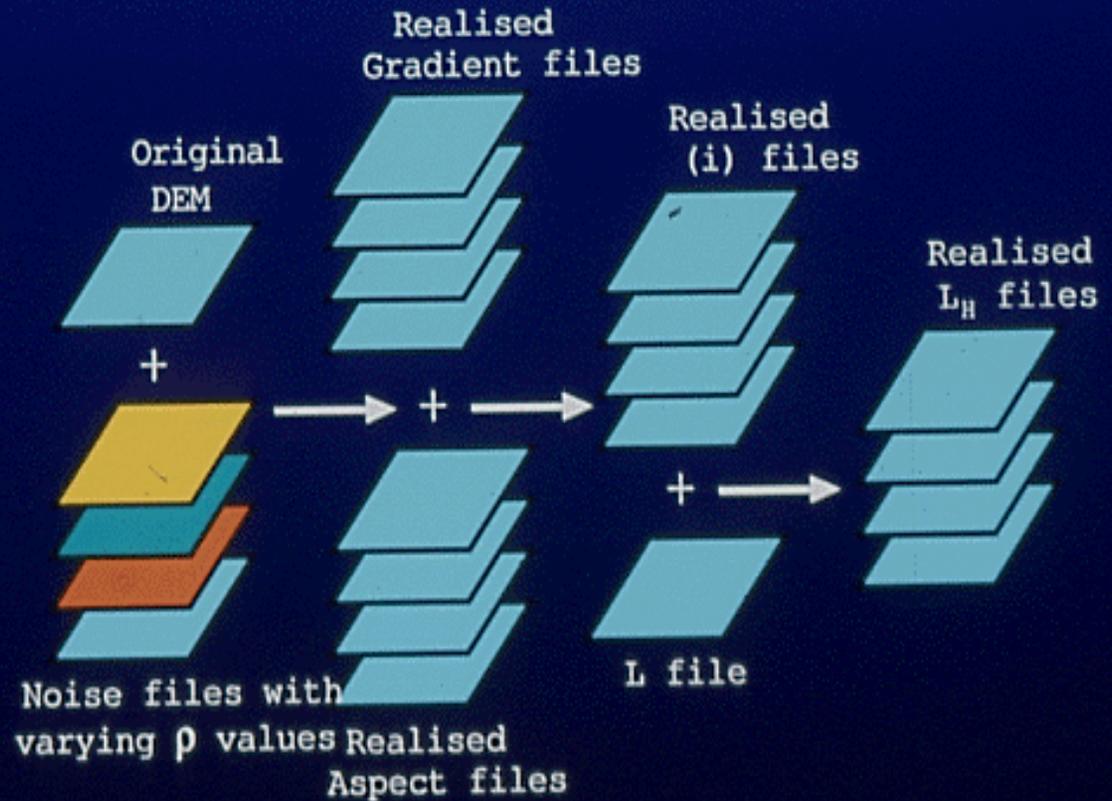
Communication of uncertainty

- Producer to user
 - abilities
- Metadata standards
 - parameters of complex models
- Assertion:
 - all knowledge of uncertainty can be expressed in a suitable simulation model
 - equally likely realizations

1. TRADITIONAL METHOD



2. PROPOSED METHOD



DEM Metadata Viewer

File Edit View Help



Name: BUENA VISTA LAKE BED, CA

Bounding Coordinates

NW: 283912.687500,3903155.000000

NE: 295287.718750,3902890.000000

SW: 283587.281250,3889289.000000

SE: 294973.781250,3889024.250000

Coordinate System

Planimetric Reference: UTM, zone 11

Horizontal Datum: NAD 27

Vertical Datum: NGVD 29

Resolution

X: 30 meters

Y: 30 meters

Z: 1 meter

Uncertainty

of Simulations: 100

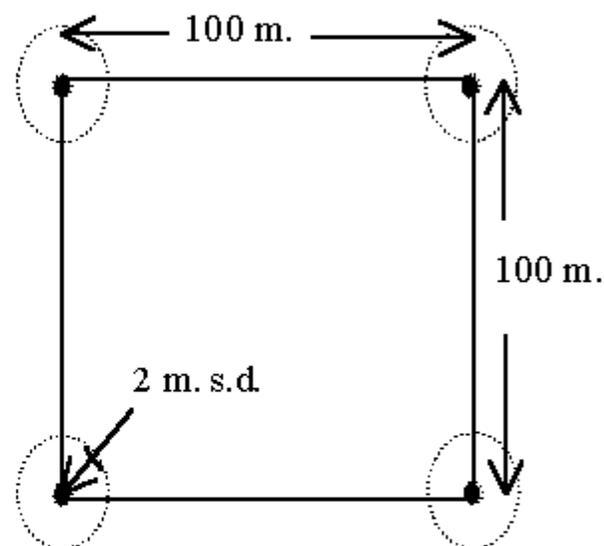
Simulate

Ready

Online Java [demonstration](http://www.ncgia.ucsb.edu/~ashton/demos/propagate.html)

<http://www.ncgia.ucsb.edu/~ashton/demos/propagate.html>

Quadrilateral parcel defined by four surveyed points. The data consist of 4 (x,y) locations, and indicate they form a square 100m on a side, with an area of 10,000 square meters.

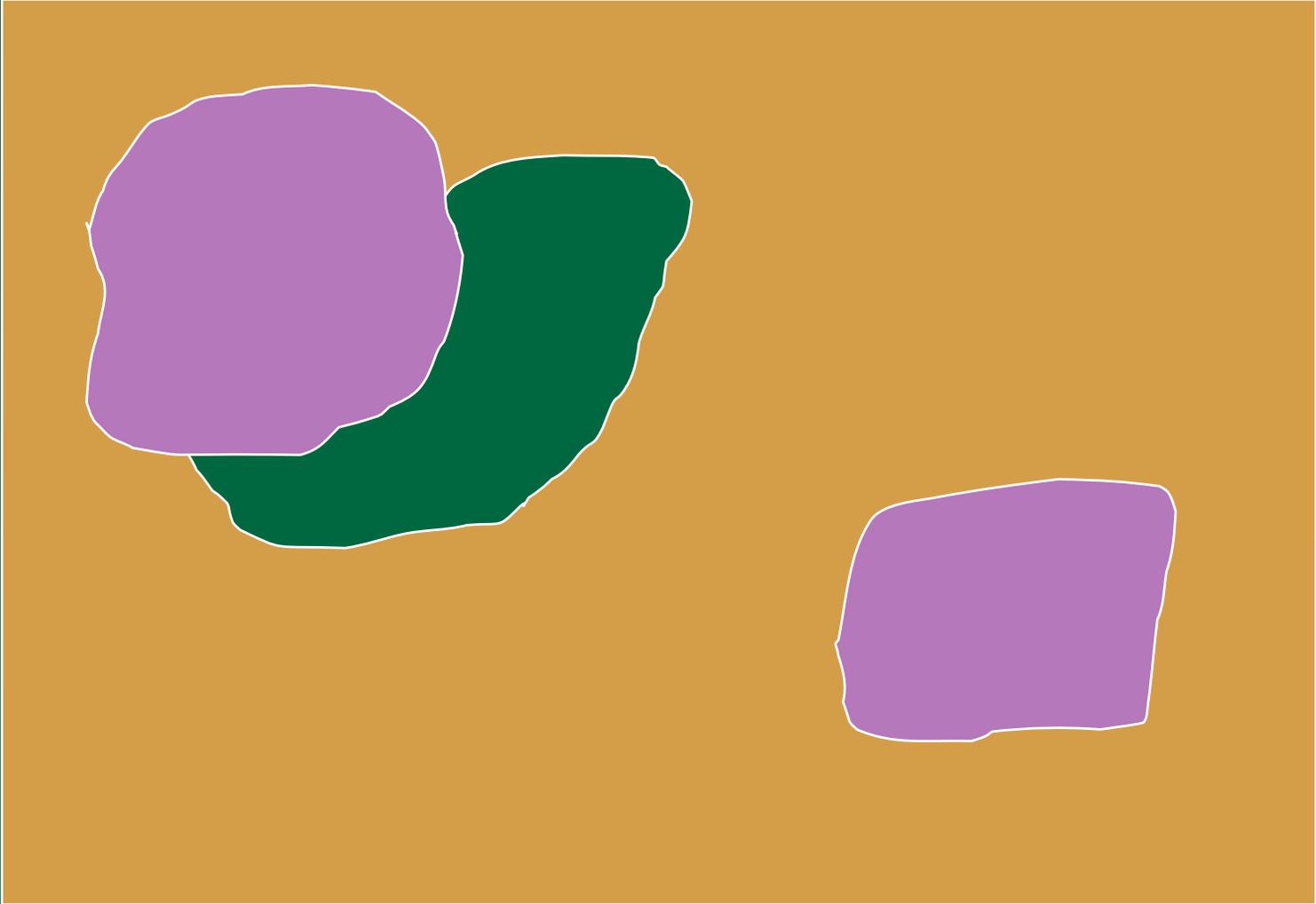


Uncertainty in point location is characterized by a Gaussian distribution, mean of zero and s.d. of 2 meters.

Question: What is the uncertainty associated with the area of the land parcel, given the positional uncertainty information?

$n > 2$ classes

- Sequential assignment
 - class 1, not 1
 - class 2, not 2
 - ...class $n-1$, n



Process-based interpretation

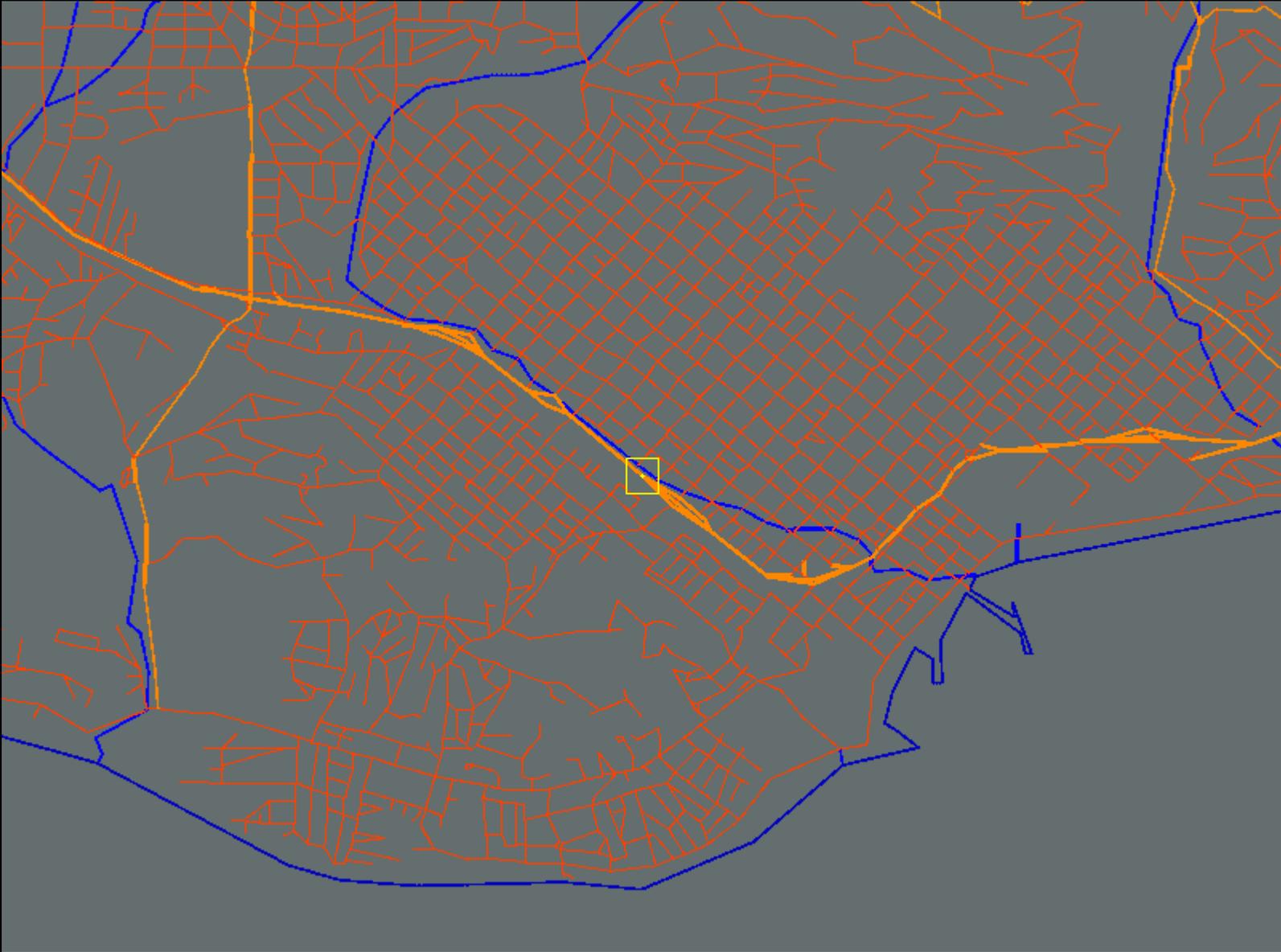
- Class i antecedent to class $i-1$
 - e.g. agriculture invaded by urban
 - e.g. grassland invaded by forest
 - shape of boundary between class i and class $i-1$ determined by class i
 - some applications have inherently ordered classes
 - but in this model all classes are ordered

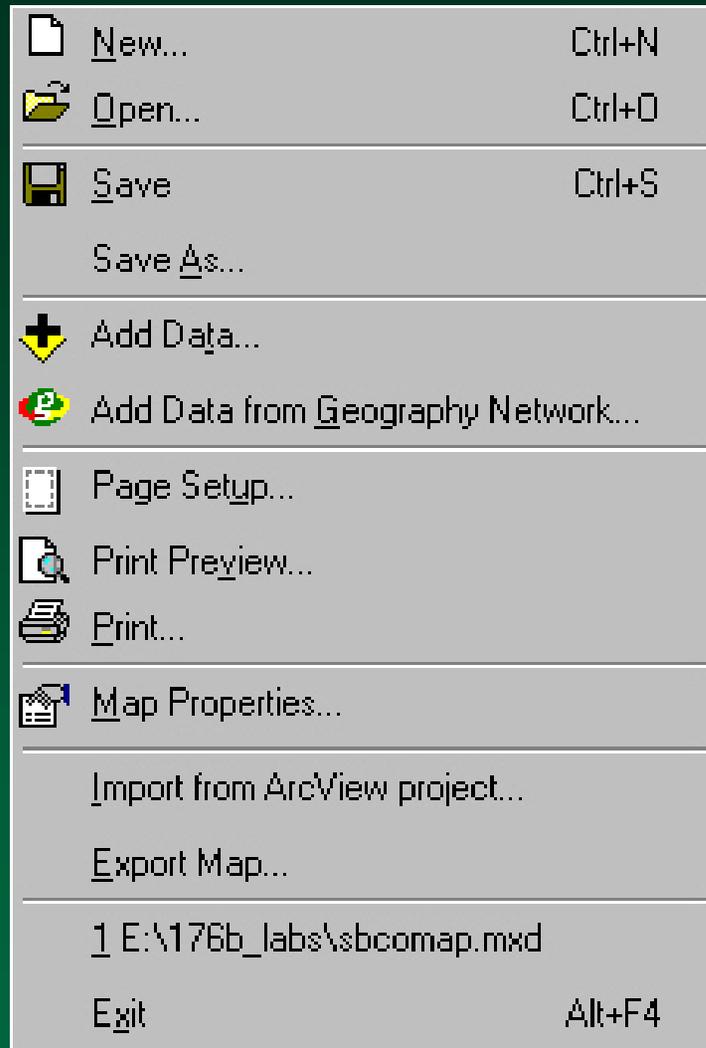
A grand challenge of GIS

- To create useful, comprehensive digital representations of the enormous complexity of the Earth's surface in the limited space of a digital store, using a binary alphabet
- An integrated, coherent organization of geographic information











geography network

ACCESS A WORLD OF INFORMATION

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[Free Resources](#)

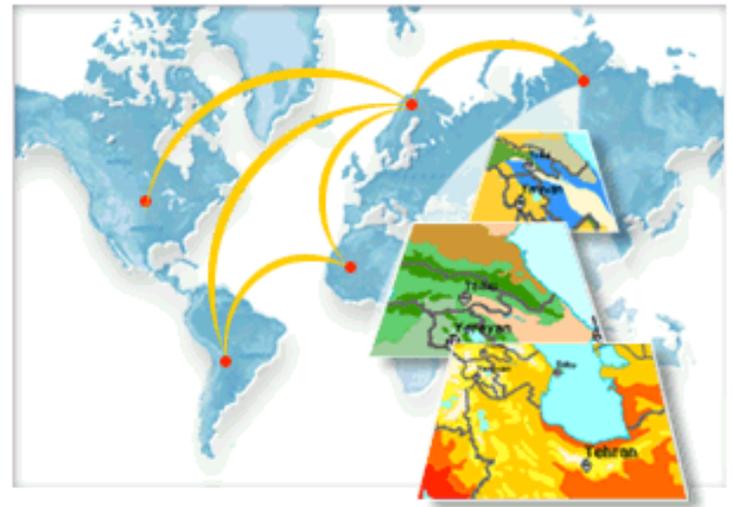
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SEARCH & VIEW

use the **Geography Network Explorer** to search and view maps and other geographic content over the Internet

The **Geography Network** is a global community of data providers who are committed to making geographic content available. This content is published from many sites around the world, providing you immediate access to the latest maps, data, and related services. This portal to the Geography Network enables you to discover this content and share your own.



Featured Content
U.S. Census TIGER 2000

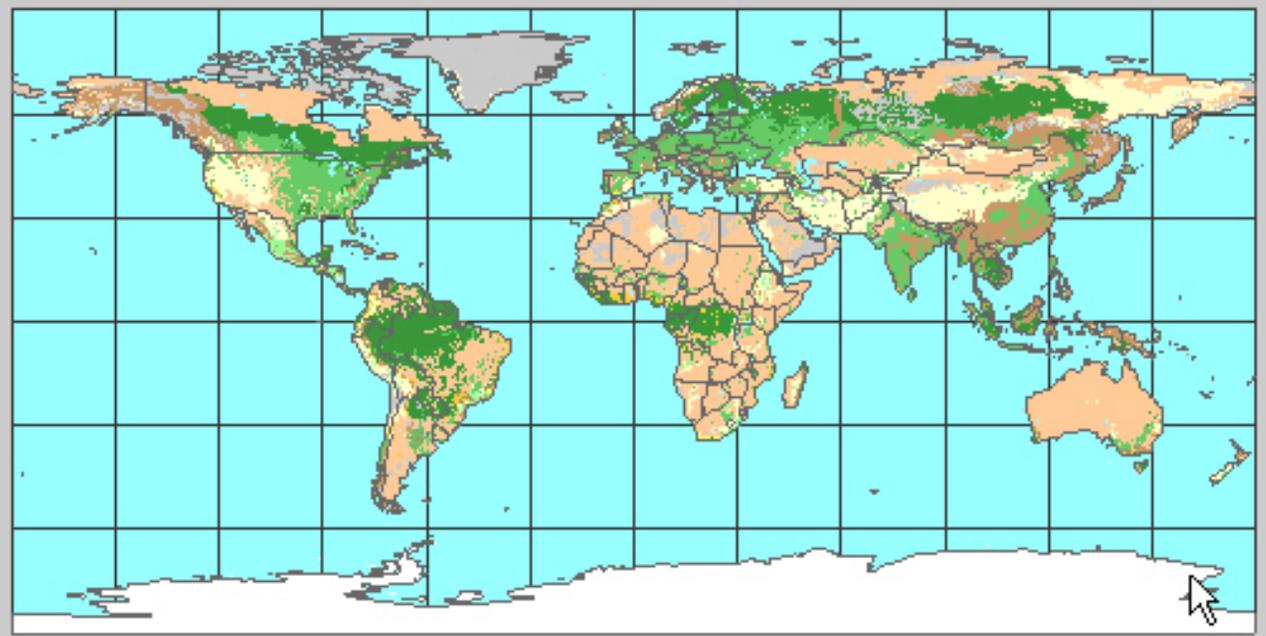
- **View Live Maps**
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- **Find Useful Tools**
- **Share Your Ideas**

Standard toolbar with icons for file operations, editing, and navigation. A scale dropdown menu is set to 1:305,926,920.

Navigation toolbar with icons for pan, zoom, and other map navigation functions. The zoom level is set to 35%.

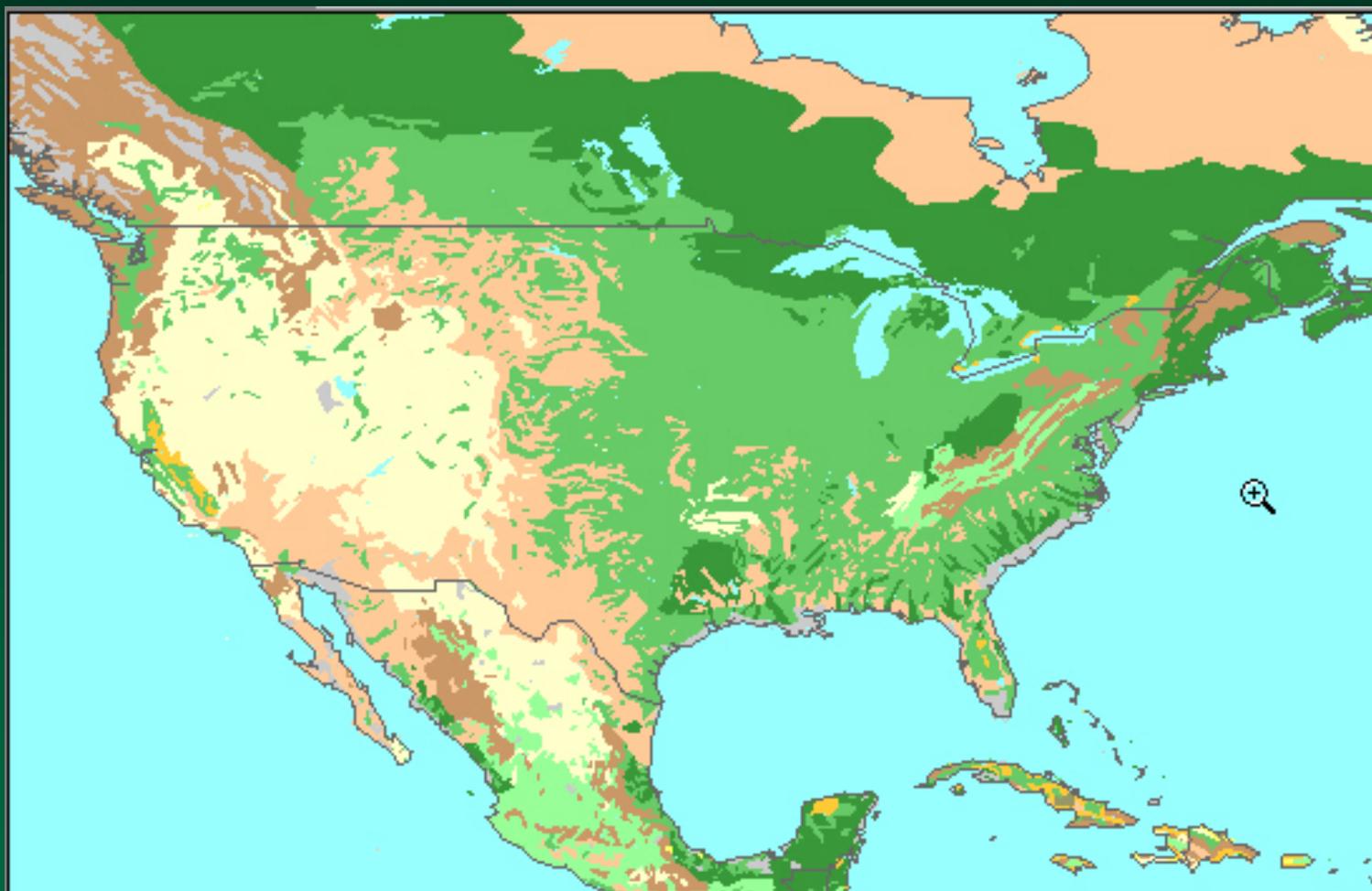
Layers

- ESRI_Landuse
 - Capital Cities
 - ESRI_aa_city.l
 - Large Capital C
 - Major Cities
 - ESRI_aa_city.l
 - 1-2 Million
 - 2-3 Million
 - 3-10 Million
 - Boundary Lines
 - ESRI_aa_cour
 - International
 - Coastline
 - Country Boundaries
 - Rivers
 - Water Bodies



Display Source

Drawing toolbar with icons for selection, text, and other drawing tools. The text font is set to Arial, size 10.





- Layers**
- ESRI_Landuse
 - Capital Cities
 - ESRI.aa
 - Large Ca
 - Major Cities
 - ESRI.aa
 - 1-2 Millio
 - 2-3 Millio
 - 3-10 Milli
 - Boundary Lin
 - ESRI.aa
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 - Rivers
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 - Water Bodie

Data Frame Properties

- Grids
 - Labels
 - Annotation
 - Extent Rectangles
 - Size and Position
- General
 - Data Frame**
 - Frame
 - Coordinate System
 - Illumination

Current coordinate system:

North_America_Lambert_Conformal_Conic
 Lambert_Conformal_Conic
 False_Easting: 0.000000
 False_Northing: 0.000000
 Central_Meridian: -96.000000
 Standard_Parallel_1: 20.000000
 Standard_Parallel_2: 60.000000
 Latitude_Of_Origin: 40.000000

Clear

Transformations...

Select a coordinate system:

- North America Lambert Conform
- USA Contiguous Albers Equal A
- USA Contiguous Equidistant Co
- USA Contiguous Lambert Conf
- South America
 - Gauss Kruger
 - National Grids
 - Polar
 - State Plane

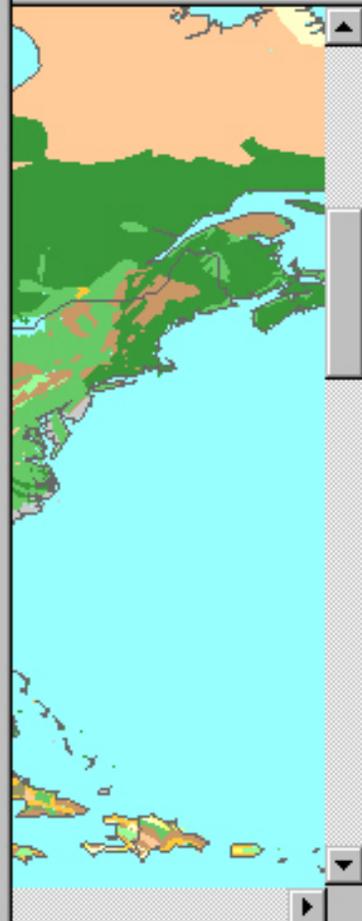
Modify...

Import...

New

Add To Favorites

Remove From Favorites



Display Source

Drawing

OK Cancel Apply





A virtual Earth

- A representation of form
 - distributed, seamless, vertically integrated
- Representations of process
 - dynamic simulation models
 - integrated with the data
- Integrated with visualization, analysis clients

“Imagine, for example, a young child going to a Digital Earth exhibit at a local museum. After donning a head-mounted display, she sees Earth as it appears from space. Using a data glove, she zooms in, using higher and higher levels of resolution, to see continents, then regions, countries, cities, and finally individual houses, trees, and other natural and man-made objects. Having found an area of the planet she is interested in exploring, she takes the equivalent of a ‘magic carpet ride’ through a 3-D visualization of the terrain.”

Is Digital Earth feasible?

- 500,000,000 sq km
 - 5 million at 10km resolution
 - 500,000,000,000,000 at 1m resolution

500,000,000,000,000 sq km

The LS ratio

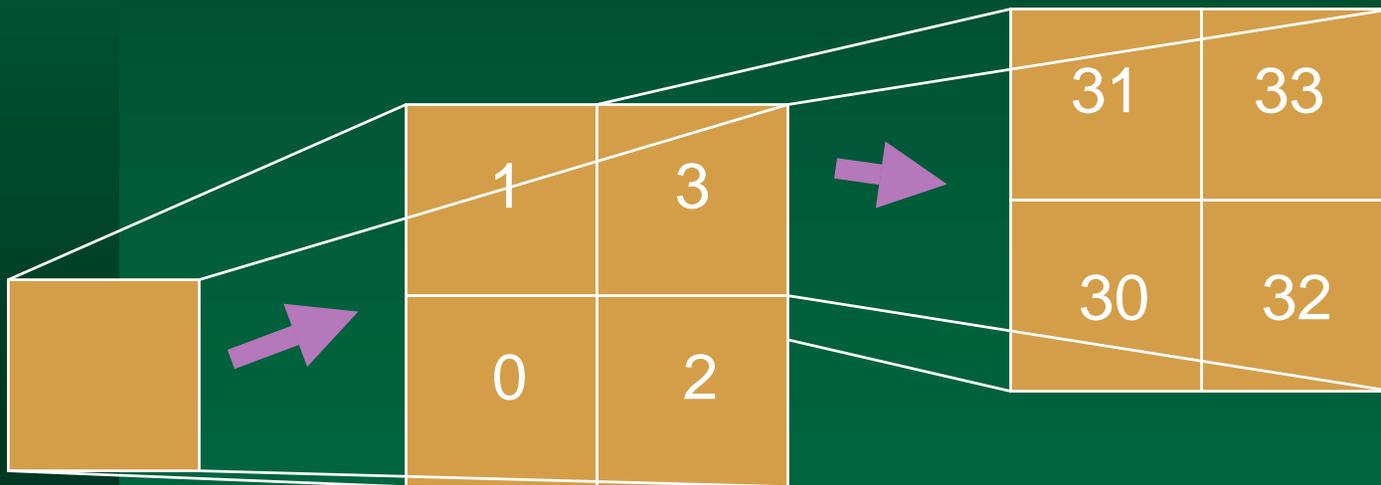
- Computer screen - 1000
- Digital camera - 1500
- Remotely sensed scene - 3000
- Paper map - 5000
- Dimensionless
- $\log_{10}L/S$ in range 3-4
- Human eye - 10,000

A data structure for DE

- To support smooth zooming over 4 orders of magnitude resolution
 - from 10km to 1m
 - maintaining LS ratio
- Vertically integrated
 - multiple layers

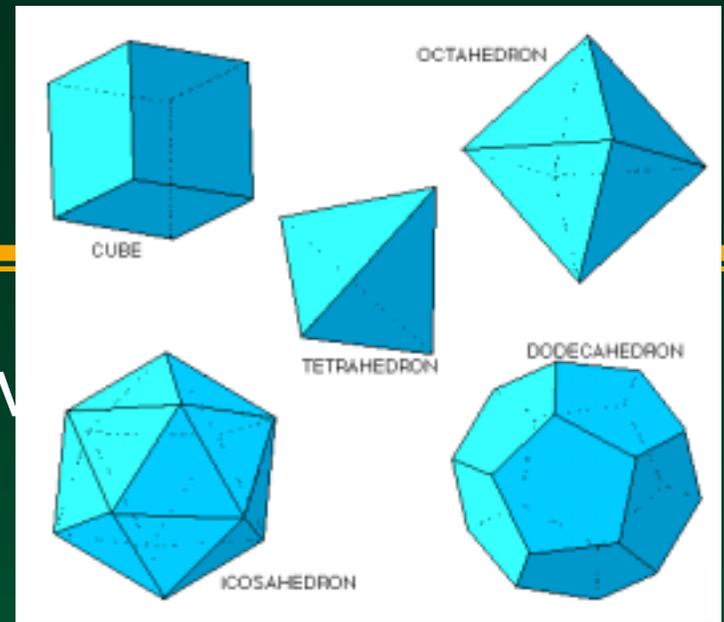
The quadtree

- Recursive subdivision
 - variable depth depending on local detail

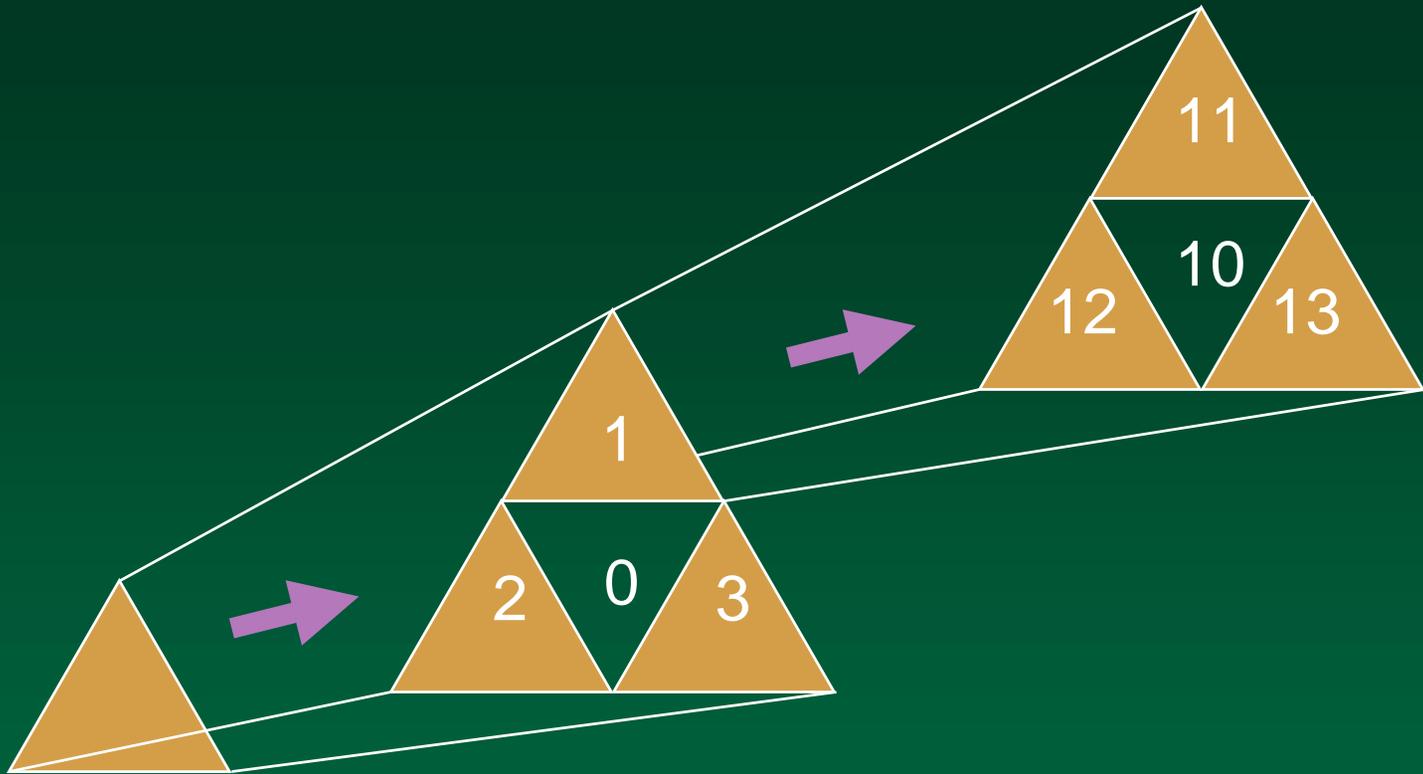


Grids on the globe

- Impossible to tile a curved surface with squares
- Five Platonic solids
 - tetrahedron: 4 triangles
 - cube: 6 squares
 - octahedron: 8 triangles
 - dodecahedron: 12 pentagons
 - icosahedron: 20 triangles







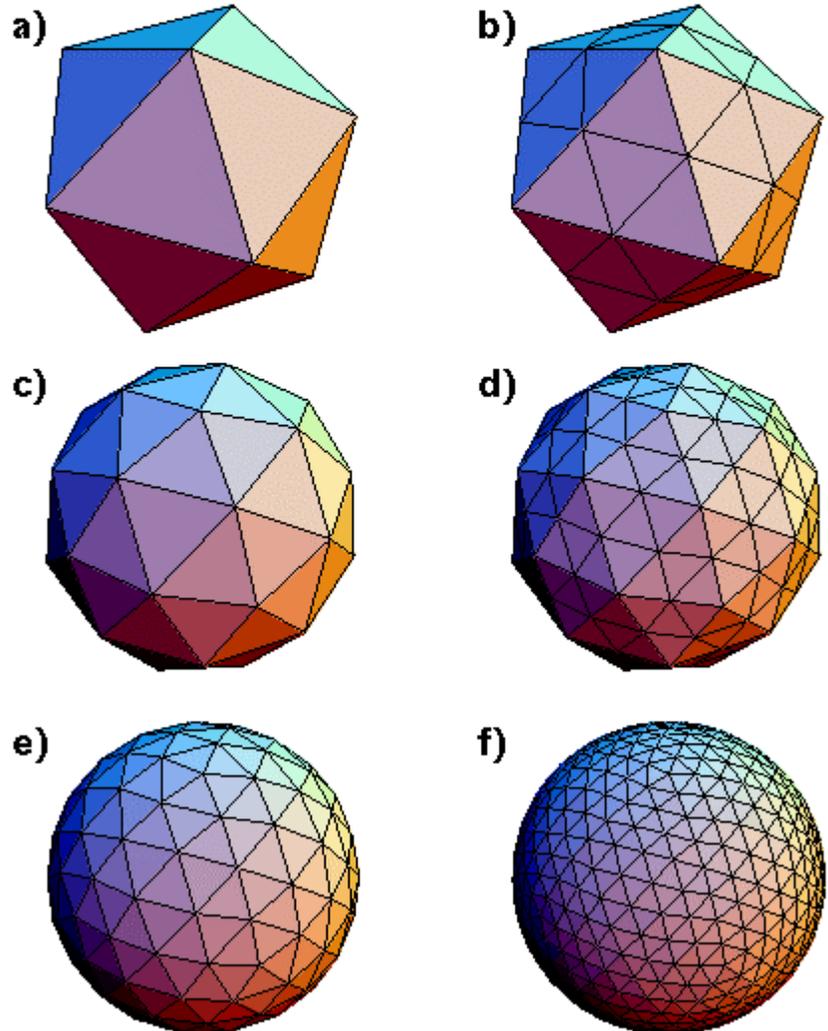
Octahedron: 1 base 8 digit plus unlimited base 4 digits

Discrete global grid
based on the
Icosahedron (20
triangles, 1:4
recursive
subdivision)

Ross Heikes and
David Randall,
Colorado State
University

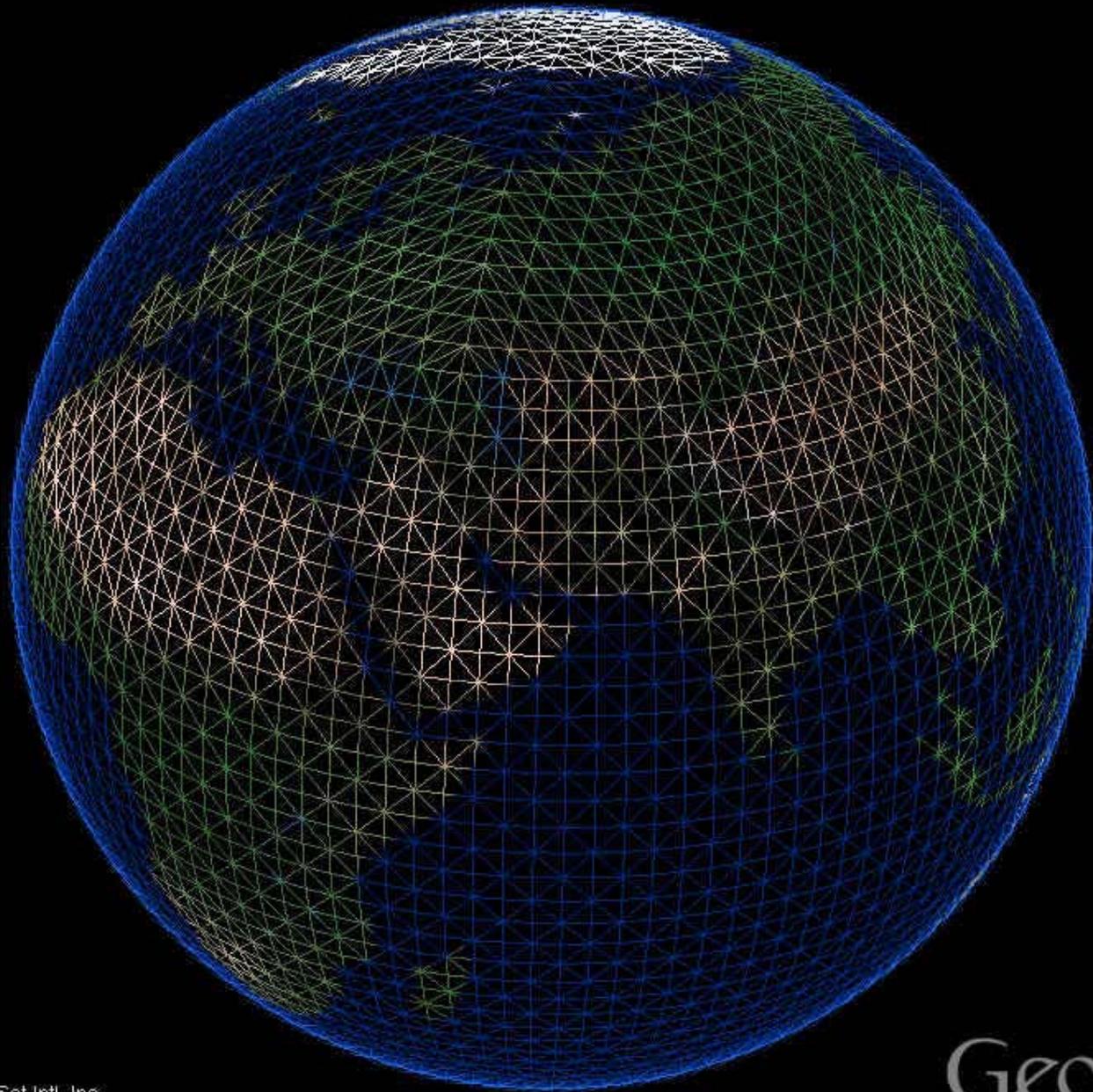
Construction of a simple Icosahedral grid

- Suppose we have an icosahedron inscribed inside of a unit sphere.
- Bisecting each edge forms 30 new vertices, and partitions each equilateral face into four pieces.
- Project the new vertices onto the unit sphere.
- Bisect and partition again.
- Project again.
- And so on.... The result is a sequence of polyhedrons that increasingly approximate the sphere.



Comparison of Criteria for the Assessment of Global Grids

| <i>Criteria in Goodchild (1994)</i> | <i>Criteria in Kimerling et al. (1999) (Goodchild's Numbers given in parentheses)</i> |
|--|--|
| 1. Each area contains one point | Areal cells constitute a complete tiling of the globe, exhaustively covering the globe without overlapping. (3,7) |
| 2. Areas are equal in size | Areal cells have equal areas. This minimizes the confounding effects of area variation in analysis, and provides equal probabilities for sampling designs. (2) |
| 3. Areas exhaustively cover the domain | Areal cells have the same topology (same number of edges and vertices). (9, 14) |
| 4. Areas are equal in shape | Areal cells have the same shape. ideally a regular spherical polygon with edges that are great circles. (4) |
| 5. Points form a hierarchy preserving some property for $m < n$ points | Areal cells are compact. (10) |
| 6. Areas form a hierarchy preserving some property for $m < n$ areas | Edges of cells are straight in a projection. (8) |
| 7. The domain is the globe (sphere, spheroid) | The midpoint of an arc connecting two adjacent cells coincides with the midpoint of the edge between the two cells. |
| 8. Edges of areas are straight on some projection | The points and areal cells of the various resolution grids which constitute the grid system form a hierarchy which displays a high degree of regularity. (5,6) |
| 9. Areas have the same number of edges | A single areal cell contains only one grid reference point.(1) |
| 10. Areas are compact | Grid reference points are maximally central within areal cells. (11) |
| 11. Points are maximally central within areas | Grid reference points are equidistant from their neighbors. (12) |
| 12. Points are equidistant | Grid reference points and areal cells display regularities and other properties which allow them to be addressed in an efficient manner. |
| 13. Edges are areas of equal length | The grid system has a simple relationship to latitude and longitude. |
| 14. Addresses of points and areas are regular and reflect other properties | The grid system contains grids of any arbitrary defined spatial resolution. (5,6) |



Imagery courtesy of WorldSat Intl. Inc.

GeoFusion



Imagery courtesy of WorldSat Intl. Inc.

GeoFusion

Concluding messages

- GIS raises fundamental questions in several disciplines
 - geography, computer science, cognitive science
- Uncertainty is endemic, must be addressed explicitly
- Integrated digital representations of Earth are now feasible