

# Exploring Spatial Public Health Data with GeoDa

## Spatial Analysis Lab

University of Illinois at Urbana-Champaign, USA



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## Purpose and Structure

- Overview of how GeoDa can add value to GIS and other analyses using public health examples
- One-on-one technical assistance with your own data available throughout *GeoHealth* conference



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# What is GeoDa?

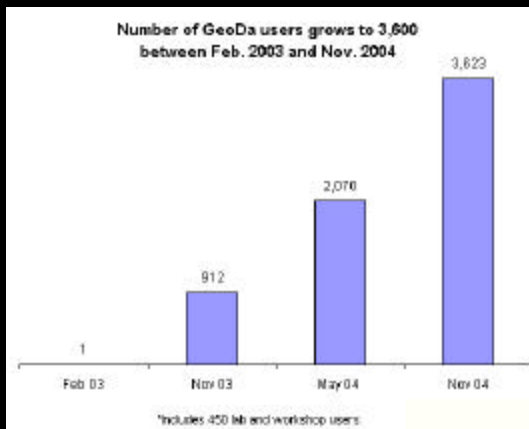
- Free, introductory, user-friendly software (<http://sal.agecon.uiuc.edu>)
- Path from Exploratory Spatial Data Analysis (ESDA) to limited Spatial Regression Analysis tools
- Designed for lattice data (polygons and points)
- GIS expertise not assumed



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## GeoDa Users

17 downloads from NZ



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## Who develops GeoDa?

- The Spatial Analysis Lab (SAL) at UIUC:  
<http://sal.agecon.uiuc.edu>
- Directed by Dr. Luc Anselin
- Mission
- GeoDa Team



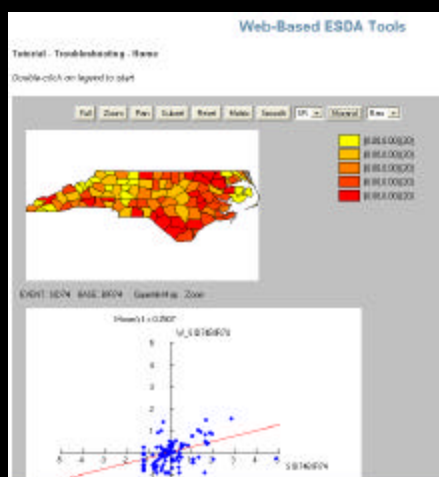
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## SAL Projects

- CSISS Tools
- Geovisualization and Spatial Analysis of Cancer Data
- Prostate Cancer ESDA and Spatial Statistics
- Web-Based Tools for the Exploration of Spatial Data



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## SAL Funders



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## GeoDa & Other Free Software

- Stand-alone, Windows platform
- Philosophy: Supplement, not Substitute
- Based on ideas in SpaceStat and DynESDA but built new in C++
- Other free packages: CrimeStat, SaTScan, R-Geo (see Luc Anselin's review at <http://www.naaccr.org/>)



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# GeoDa Overview



- 1 Data Manipulation
- 2 Mapping
- 3 Weights Matrices
- 4 Multivariate Exploratory Data Analysis (EDA)
- 5 Spatial Autocorrelation
- 6 Spatial Regression

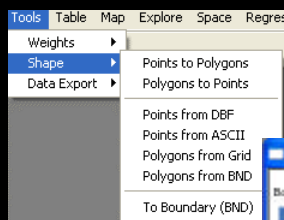


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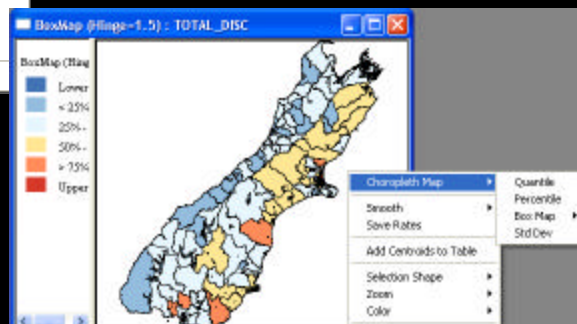
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## Overview: Data Manipulation & Mapping



### 1 Data Manipulation

### 2 Mapping



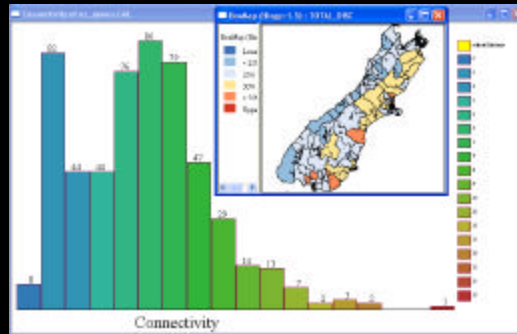
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# Overview: Weights Matrices

## 3 Create Weights Matrices



Weights Characteristics

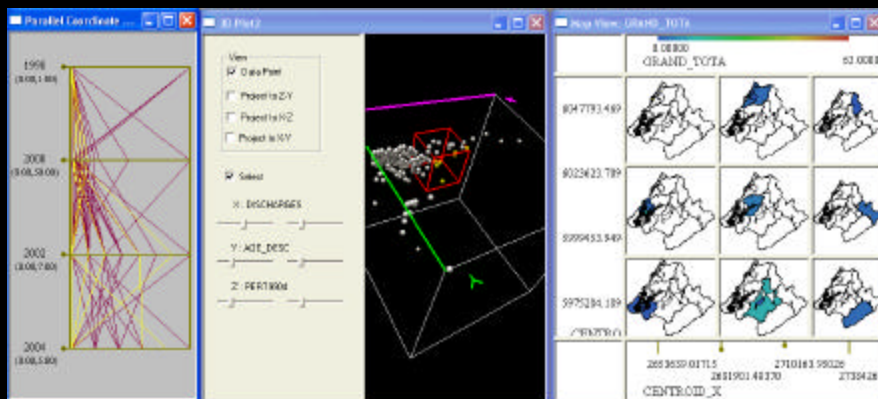


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# Overview: Multivariate EDA



## 4 Multivariate Exploratory Data Analysis (EDA)

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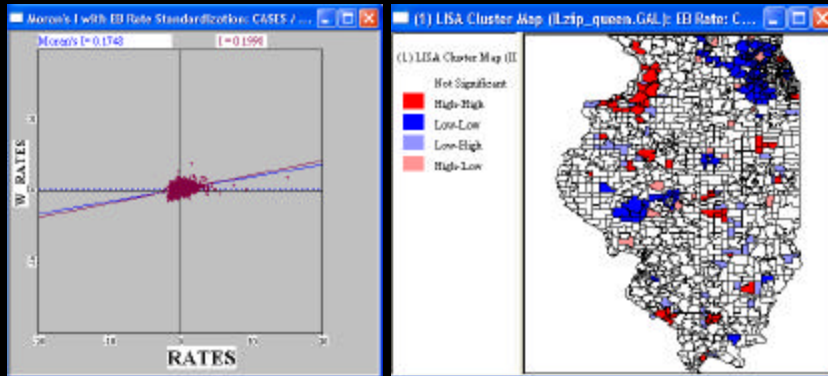


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# Overview: Spatial Autocorrelation



Global

Local

## 5 Spatial Autocorrelation

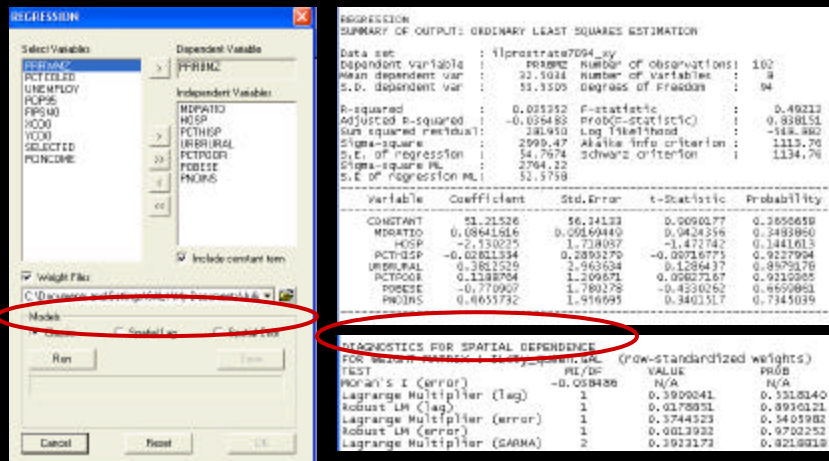


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# Overview: Spatial Regression



## 6 Spatial Regression



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# Key Features for Health Data

- Linking and Brushing
- Rate Smoothing
- Global and Local Clustering

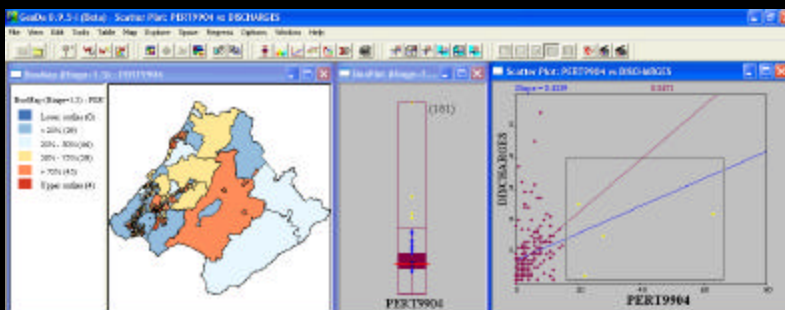


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## Linking & Brushing



- All windows are dynamically linked
- Observations can be selected through brushing
- On-the-fly re-computation of scatter plot results

**DEMO**



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# Rate Smoothing

- Raw rates used to estimate underlying disease risk
- Differences in population size related to problem of variance instability and spurious outliers
- Rate smoothing addresses variance instability by borrowing strength from other spatial units



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# GeoDa Smoothing Options

GeoDa offers four smoothers:

Smooth	Raw Rate
Save Rates	Excess Risk
Add Centroids to Table	Empirical Bayes
Selection Shape	Spatial Rate
	Spatial Empirical Bayes

Where Strength is Borrowed From

- **Excess Risk:** Expected risk based on product of raw rate and average overall risk of all observations
- **Empirical Bayes (EBS):** Overall mean of the underlying risk distribution of all observations
- **Spatial Rate:** Neighbors, as defined in spatial weights matrix
- **Spatial Empirical Bayes:** Same as EBS but strength not borrowed from all observations, only regional subset

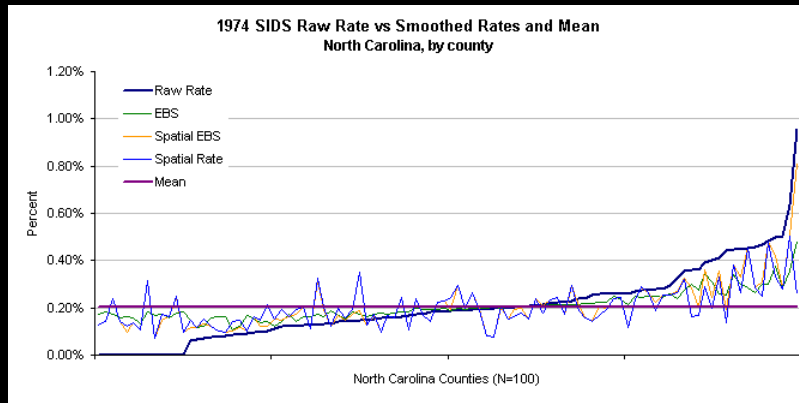


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## Rate Smoothing: Comparison



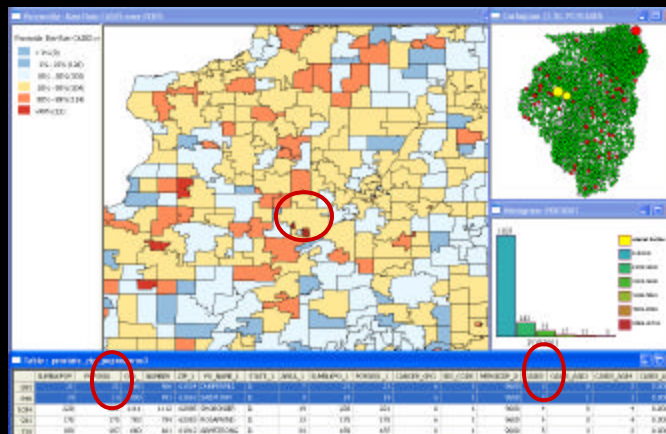
## Raw rate compared to smoothed rates and mean



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## Raw rates for prostate cancer in Illinois, by zip code

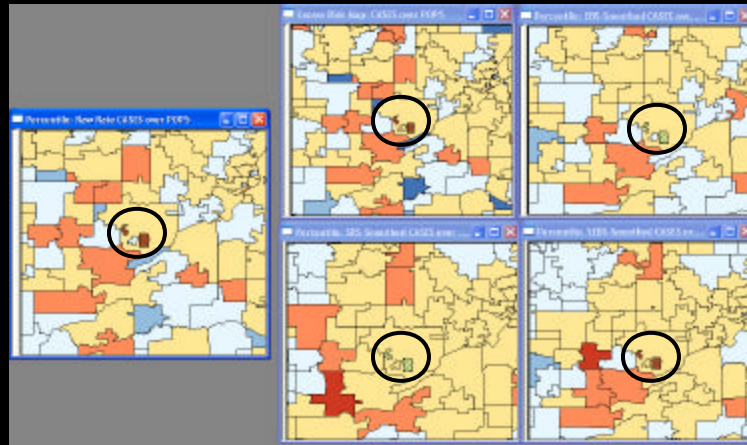


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## Rate Smoothing: Outlier Comparison



Raw and smoothed rates for prostate cancer in Illinois, by zip code



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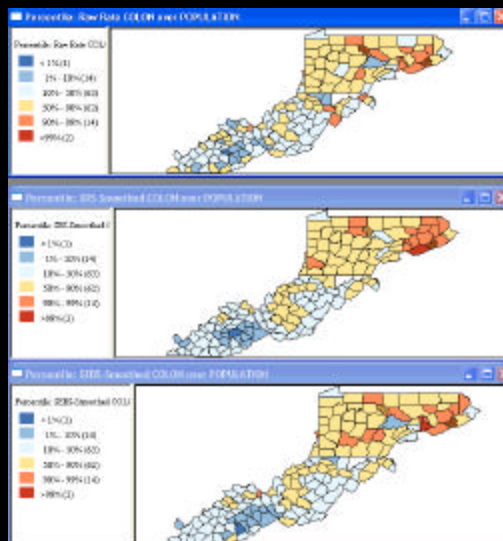
## Rate Smoothing with Weights: Comparison

Raw rates for colon cancer in Appalachia, by county

Spatial Rates with Queen Matrix

Spatial Empirical Bayes Rates with Queen Matrix

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# Global and Local Clustering

## Global Moran's I

- What is the extent of clustering in the total area?
- Is this clustering significantly different from a random spatial distribution?

## Local Moran's I

- Do local clusters (high-high or low-low) or local spatial outliers (high-low or low-high) exist?
- Are these local clusters and spatial outliers statistically significant?



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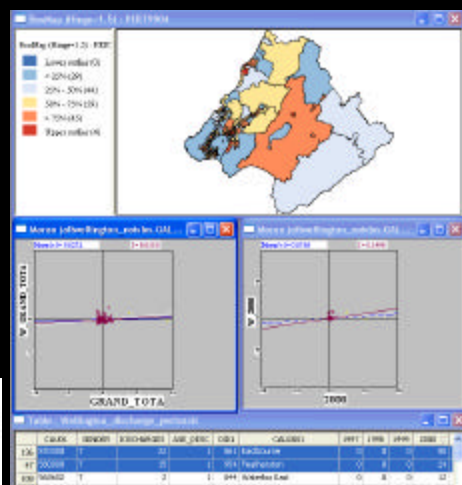
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# Global Clustering

1997-2004 Pertussis  
Cases in Wellington

Global Moran's I scatter  
plot for 1997-2004 and  
2000 cases

$$I = \left( \frac{N}{S_0} \right) \frac{\sum_i \sum_j w_{ij} z_i z_j}{\sum_i z_i^2}$$

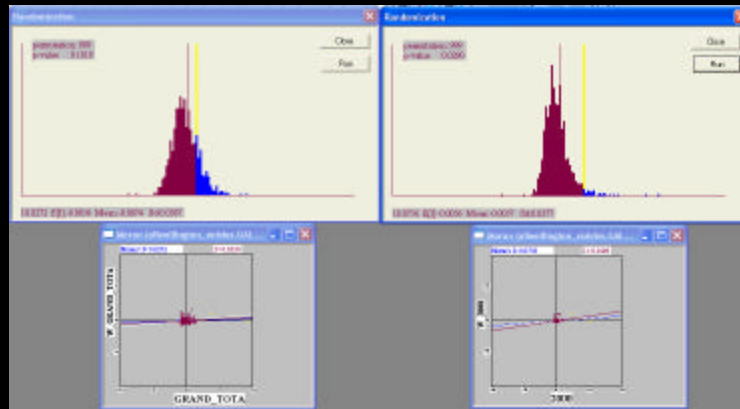


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## Global Clustering: Significance Tests



Global Moran's I scatter plots and significance tests for 1997-2004 & 2000 Pertussis cases in Wellington



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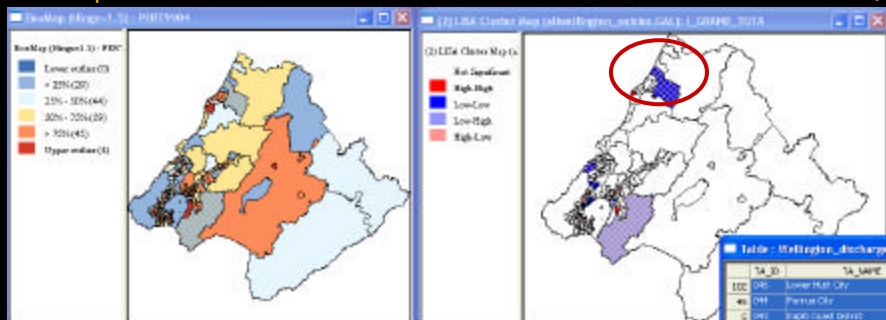
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## Local Clusters

Box map

LISA map



Local Indicators of Spatial Association (LISA) maps can be used to identify spatial clusters and outliers at different significance levels



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# Local Cluster Computation

Illustration of low-low Kaitawa cluster



$$I_i = \frac{(x_i - \mu_n) \sum_j w_{ij} (x_j - \mu_n)}{\sum_j (x_j - \mu_n)^2 / n}$$

Cross-product of standardized value for area i and average standardized values of neighbors j

Numerator for Kaitawa (mean=5): (0-5) \* [(0-5) + (3-5) + (2-5) + (4-5) + (0-5)]

Denominator: Sum of squared standardized values for each area i in total study area, divided by N

GeoDa uses row-standardized weights (rows sum to one)

DEMO



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## Conclusion

- GeoDa offers spatial analysis tools that can be used separately or in addition to GIS and statistical analyses
- GeoDa results can be exported and integrated in other packages
- Rate smoothing and global/local clustering are particularly useful for health data



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## Current & Future Developments

- OpenGeoDa
  - Cross-platform, open-source
  - Including full Help system
- Python modules for cancer-related
  - smoothing
  - cluster analysis
  - spatial regression



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## More Information

- [http://sal.agecon.uiuc.edu/geoda\\_main.php](http://sal.agecon.uiuc.edu/geoda_main.php)
- Subscribe to Openspace listserv for GeoDa support
- One-on-one technical assistance with your own data at *GeoHealth 2004*



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