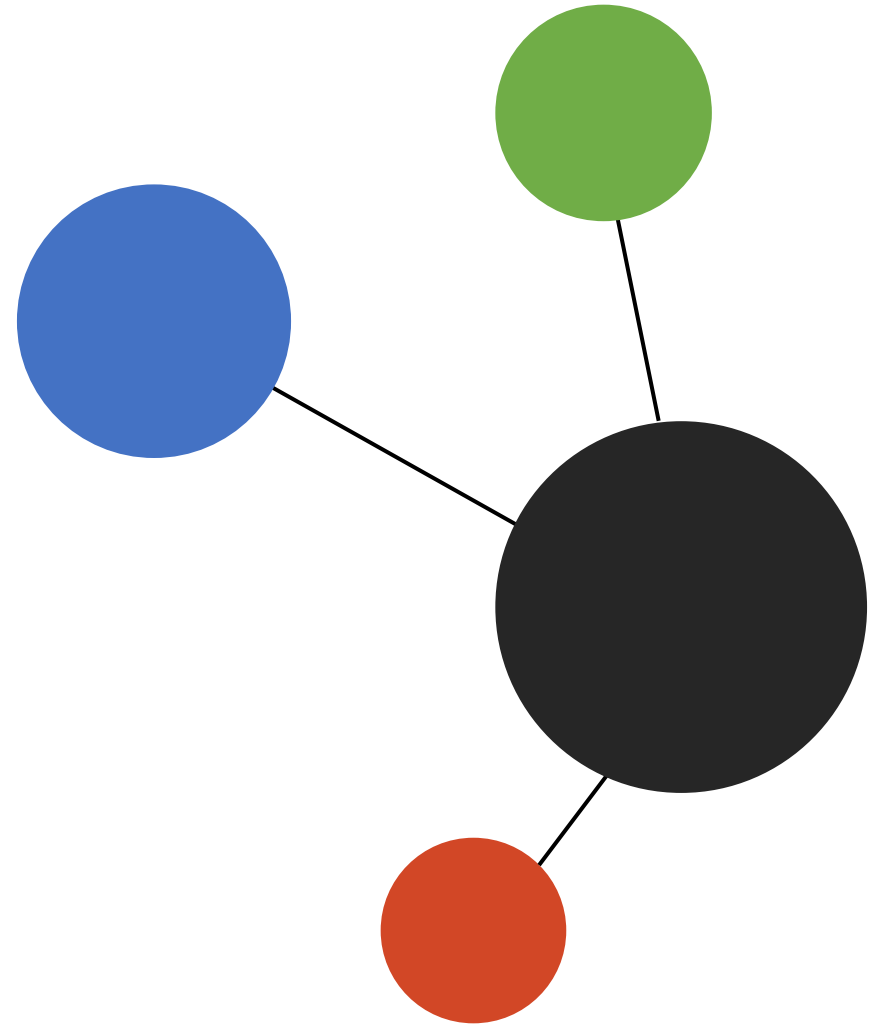


# Spatial Pattern

Dr. Eko Budiyanto, M.Si.



# What is Spatial Pattern ?

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definition

**Spatial pattern analysis methods provide insights about where things occur, how the distribution of incidents or the arrangement of data aligns with other features in the landscape, and what the patterns may reveal about potential connections and correlations**

Lauren M Scott, 2015

*Metode analisis pola spasial memberikan gambaran tentang :*

- **di mana** sesuatu terjadi ?
- **bagaimana sebaran** kejadian atau rangkaian sebaran data selaras dengan fitur lain di lapangan?
- **pola apa** yang dapat mengungkapkan potensi koneksi dan korelasi ?

# What is Spatial Pattern ?

coverages

## Spatial Pattern Analysis

1. Identifying, describing, and measuring the shape,
2. Arrangement
3. Location
4. Configuration
5. Trend
6. Relationships

geographic data

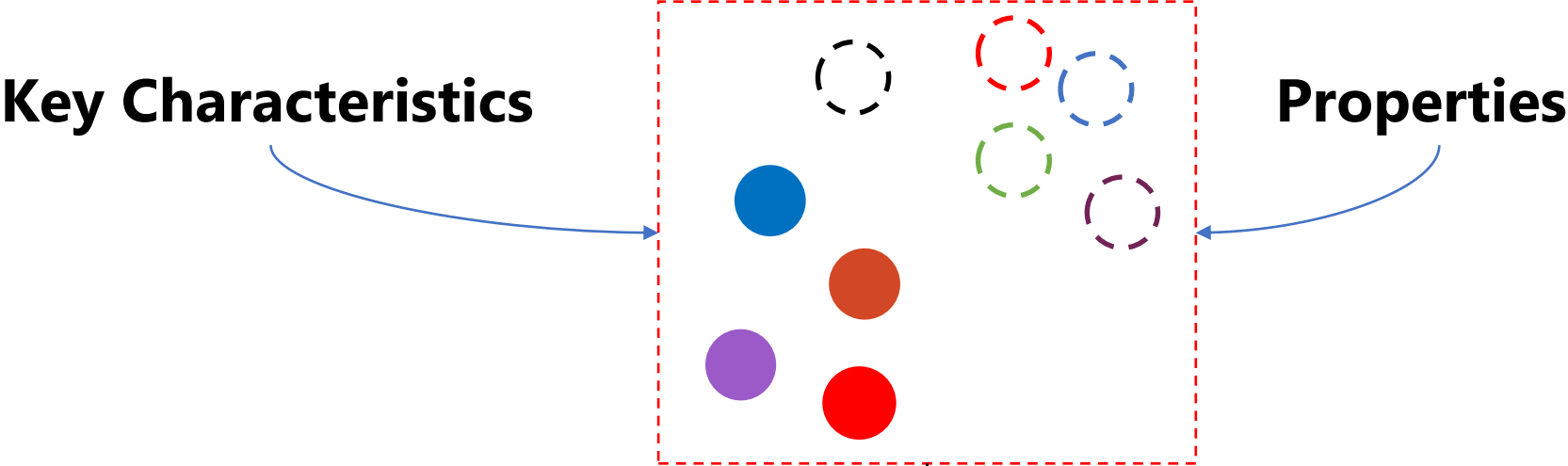
- ✓ Discernable pattern ?
- ✓ Order ?
- ✓ Structure associated ?

**Descriptive**  
**Spatial**  
**Pattern**  
**Analysis**

**Inferential**  
**Spatial**  
**Pattern**  
**Analysis**

# Descriptive Spatial Pattern Analysis

Analysis object



- How quickly and widely is a disease spreading through the village ?
  - Where are the core areas for particular language dialects ?
- How integrated are they and which have the broadest spatial extent ?

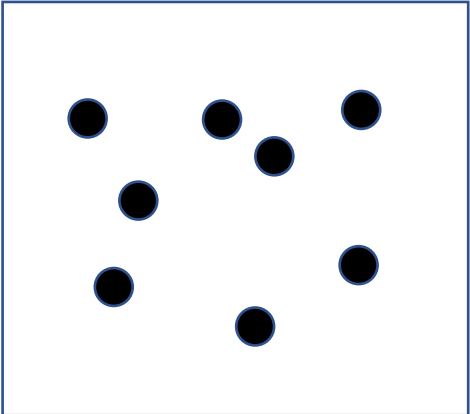
- Which resource is most accessible?
- Has the center of innovation changed over time?
- What is the primary direction of migration?

→ **Mean Center**  
Describe the central tendency of the feature

→ **Standard Deviation of Ellips**  
Describe the spatial distribution and orientation around mean center

# Descriptive Spatial Pattern Analysis

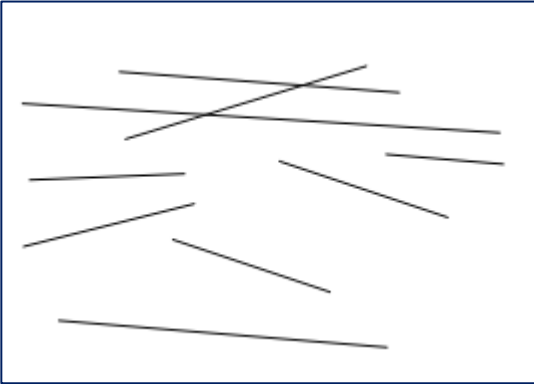
Objects measured



**Point Feature**

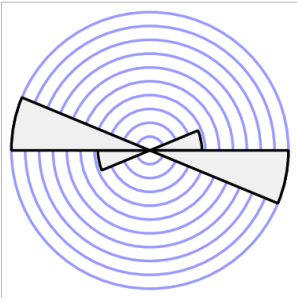
## Central Tendency

Average of X and Y coordinates



**Line Feature**

- Mean Direction
- Mean Orientation
- Mean Line Length
- Mean Center Point
- Circular Variance



# Inferential Spatial Pattern Analysis

Inferential method type

1 → **Average Nearest Neighbor**

Computing the mean distance to each feature's closest neighbor and then comparing that distance to the distance that would be obtained for a random distribution of those same features

Does the spatial pattern of a disease mirror the spatial pattern of the population at risk?

2 → **Quadrat Analysis**

Is the new virus remaining geographically fixed or is it spreading to surrounding communities?

3 → **Kernel Density**

4 → **Spatial Autocorrelation**  
Moran's I, Geary Contiguity

Is there a discernible spatial pattern or not?

compare local statistical properties of an attribute to global properties

### Average Nearest Neighbor

The average nearest neighbor ratio is calculated as the observed average distance divided by the expected average distance

$$ANN = \frac{\bar{D}_O}{\bar{D}_E}$$

$$\bar{D}_O = \frac{\sum_{i=1}^n d_i}{n}$$

$$\bar{D}_E = \frac{0.5}{\sqrt{n/A}}$$

$\bar{D}_O$  : the observed mean distance between each feature and its nearest neighbor

$\bar{D}_E$  : the expected mean distance for the features given in a random pattern

$d_i$  : equals distance between feature  $i$  and its nearest neighboring feature

$A$  : area of minimum enclosing rectangle around all features, or user specified area value

$n$  : number of features

**ANN ratio < 1 : Clustered, ANN ratio > 1 : dispersed**



## Average Nearest Neighbor

The average nearest neighbor ratio is calculated as the observed average distance divided by the expected average distance

$$Z = \frac{\bar{D}_O - \bar{D}_E}{SE}$$

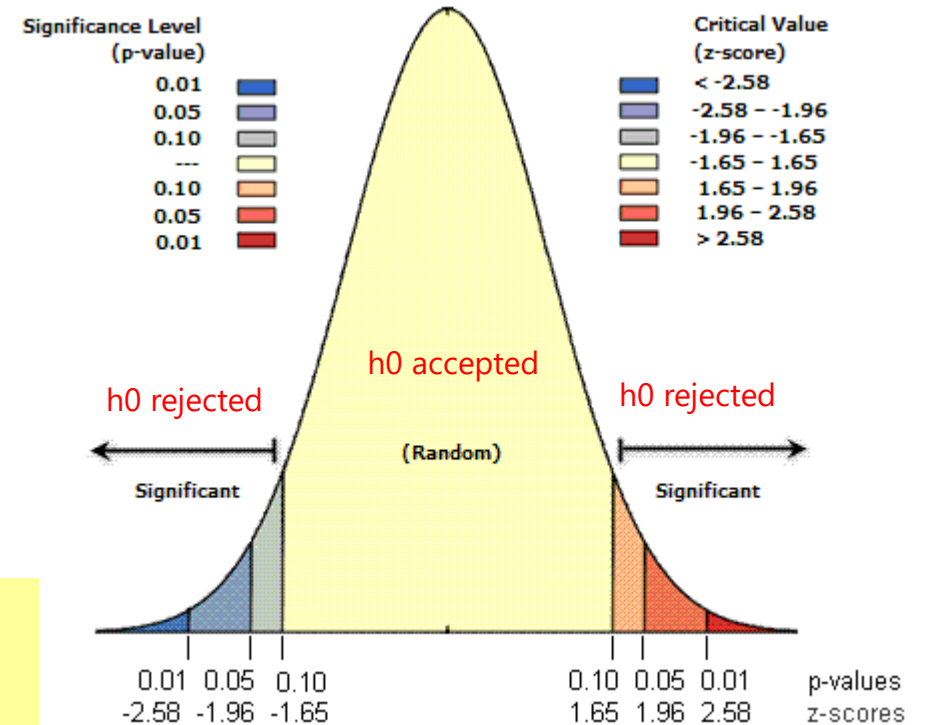
$$SE = \frac{0.26136}{\sqrt{n^2/A}}$$

**Provision...!!!!**

**h0 : Random / Dispersion Significant**

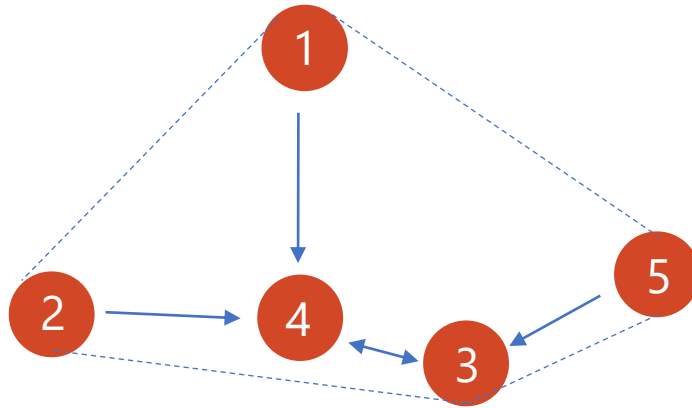
Sign 99%,  $z < -2,58$  or  $z > 2,58$  -> h0 rejected : clustered significant

Sign 95%,  $z < -1,96$  or  $z > 1,96$  -> h0 rejected : clustered significant



## Average Nearest Neighbor

The average nearest neighbor ratio is calculated as the observed **average distance** divided by the **expected average distance**



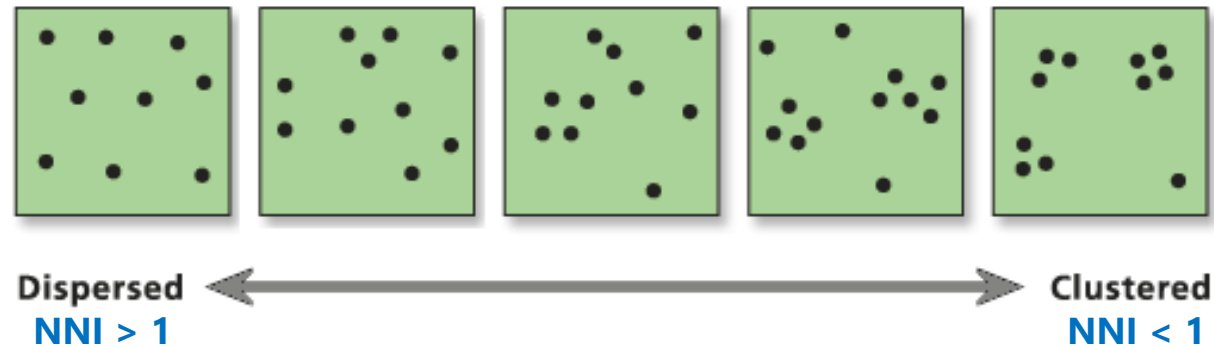
- 3 is the nearest neighbor of 5
- 3 is the nearest neighbor of 4 and vice versa
- 4 is the nearest neighbor of 1
- 4 is the nearest neighbor of 2

$$\bar{D}_O = \frac{\sum_{i=1}^n d_i}{n} \quad \bar{D}_E = \frac{0.5}{\sqrt{n/A}}$$

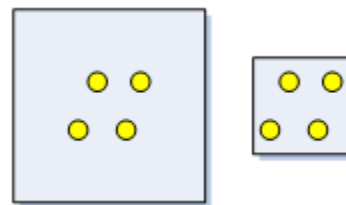
$$\text{Average Nearest Neighbor Distance} = \frac{\text{distance}_{5-3} + \text{distance}_{3-4} + \text{distance}_{1-4} + \text{distance}_{2-4}}{4}$$

## Average Nearest Neighbor

The average nearest neighbor ratio is calculated as the observed average distance divided by the expected average distance



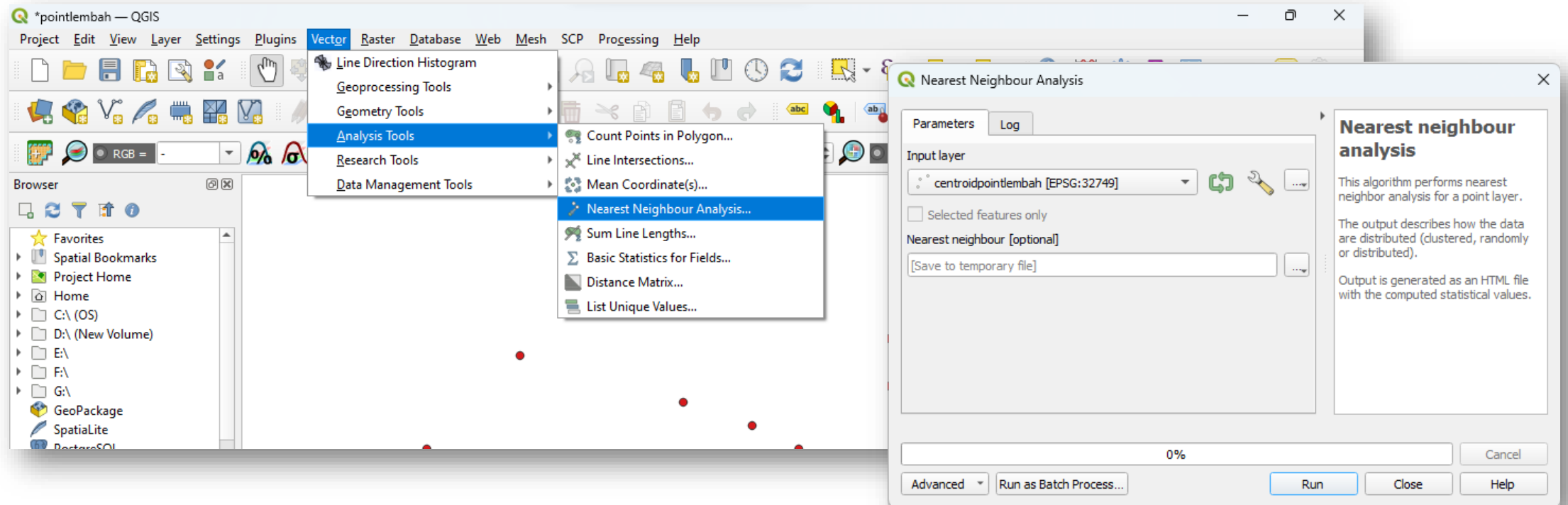
The average nearest neighbor method is very sensitive to the Area value



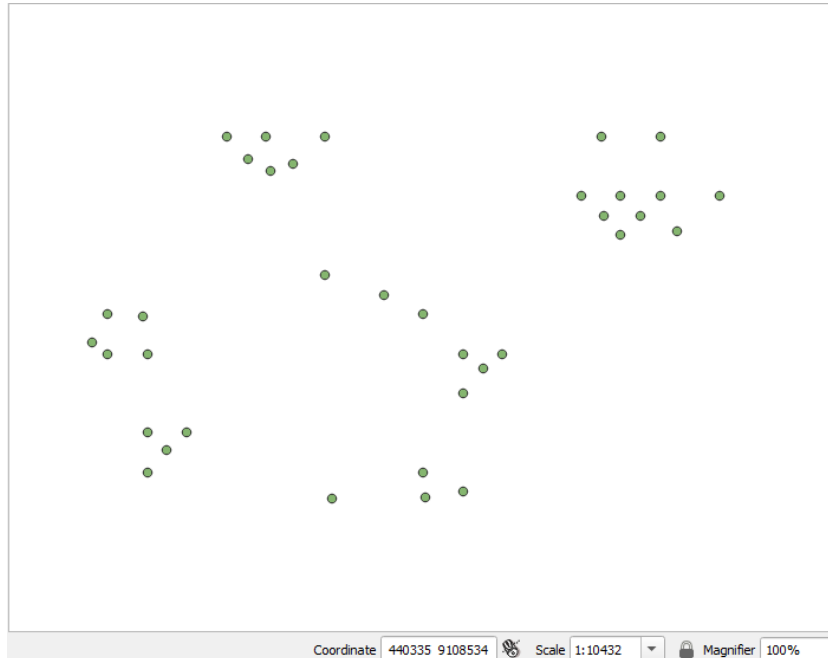
## Average Nearest Neighbor

NNA process with QGIS software

**Vector -> Analysis Tools -> Nearest Neighbour Analysis**



## Average Nearest Neighbor



Observed mean distance: 80.48985620950

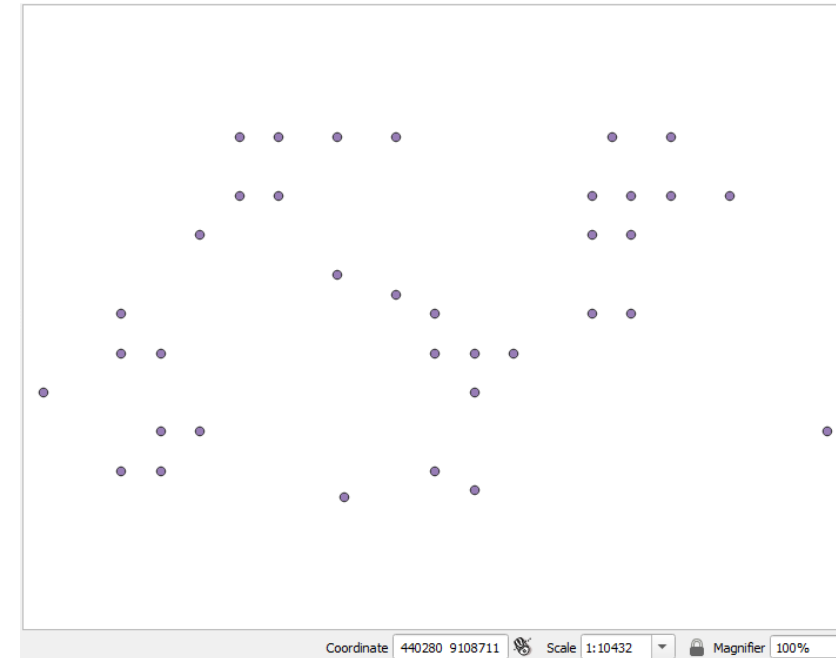
Expected mean distance: 103.94032025276

Nearest neighbour index: 0.77438530124 **NNI < 1 : Clustered**

Number of points: 36

Z-Score: -2.58970039904

$z < -2,58 \rightarrow h_0$  accepted : clustered significant in 99% sign



Observed mean distance: 121.19203739246

Expected mean distance: 103.94032025276

Nearest neighbour index: 1.16597714051 **NNI > 1 : Dispersed**

Number of points: 36

Z-Score: 1.90515542372

$z < 1,96 \rightarrow h_0$  accepted : Dispersed significant in 95% sign

# Task

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Let you learn Kernel Density and Moran's I formulation  
as the spatial pattern method

Thank You