



■ Spatial Analysis

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○ Basic statistics

➤ Samples

$$\{z_i\}_{i=1,n}$$

➤ Arithmetic mean

$$m = \frac{1}{n} \sum_{i=1}^n z_i$$

➤ Variance

$$\sigma^2 = \frac{1}{n} \sum_{i=1}^n (z_i - m)^2$$

➤ Standard deviation

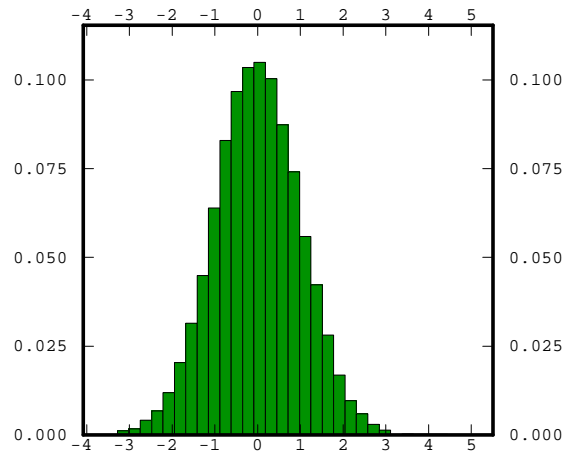
$$\sigma$$

➤ Coefficient of variation

$$C_v = \frac{\sigma}{m}$$

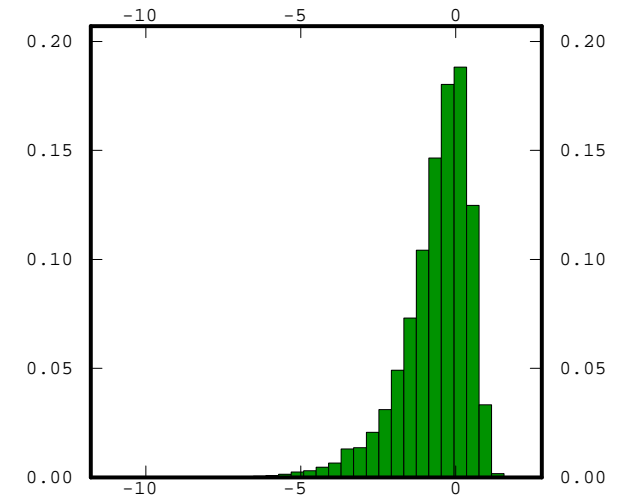
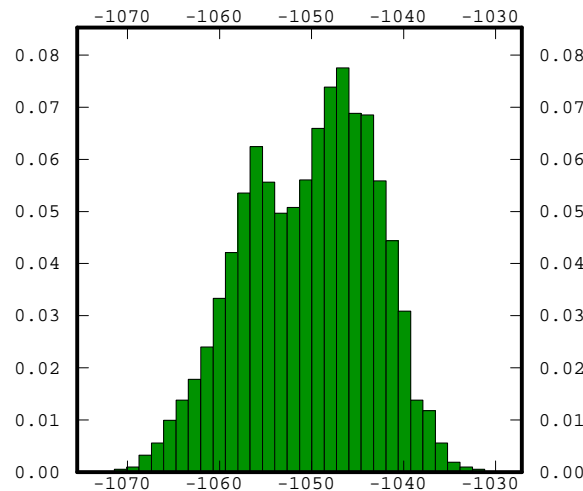
o Histograms

- Mode: most probable value
- Quantiles



Symmetrical

Multi-modal



Asymmetrical

o Multivariate

➤ Variables

$$\{z_i^1, z_i^2\}_{i=1,n}$$

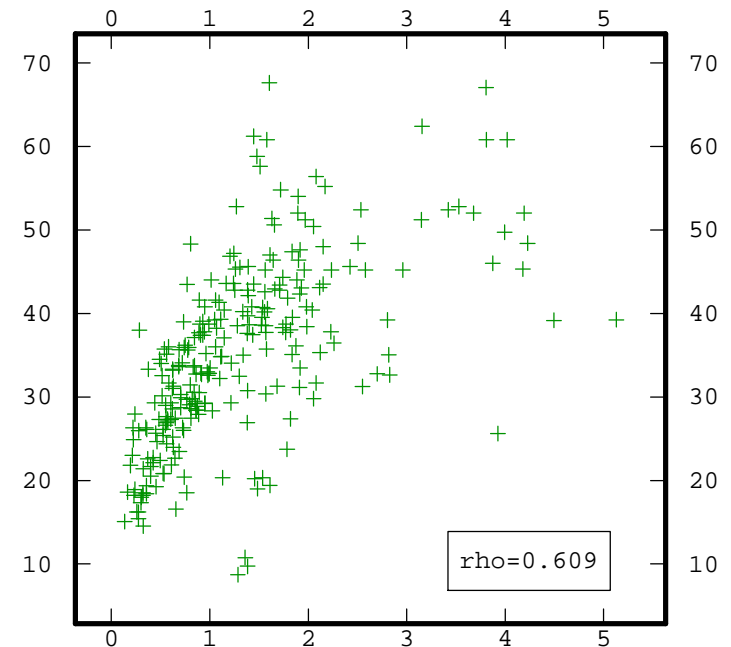
➤ Covariance

$$C_{12} = \frac{1}{n} \sum_{i=1}^n (z_i^1 - m_1)(z_i^2 - m_2)$$

➤ Correlation coefficient

$$\rho = \frac{C_{12}}{\sigma_1 \sigma_2}$$

➤ Scatter plot



○ Experimental variograms

- Data is a **regionalized** variable

$$z_i = z(x_i)$$

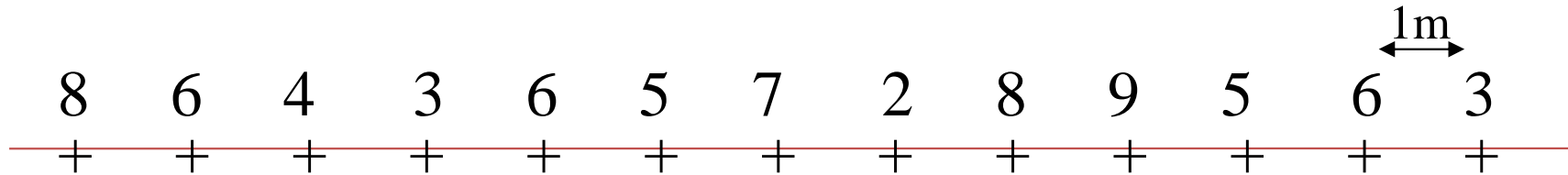
- The experimental variogram is a (discrete) function

$$\gamma(h) = \frac{1}{2N(h)} \sum_{i=1}^{N(h)} [z(x_i + h) - z(x_i)]^2$$

where $N(h)$ is the number of pairs of points distant by h

o Experimental variogram for regular 1-D grid

- The variable is defined on a regular 1-D grid (mesh=1m)



- Calculate:
 - The mean and variance
 - The experimental variogram for the lag 1m, 2m and 3m
- What happens when replacing z by y , such that:

$$y(x) = z(x) + 3.2$$

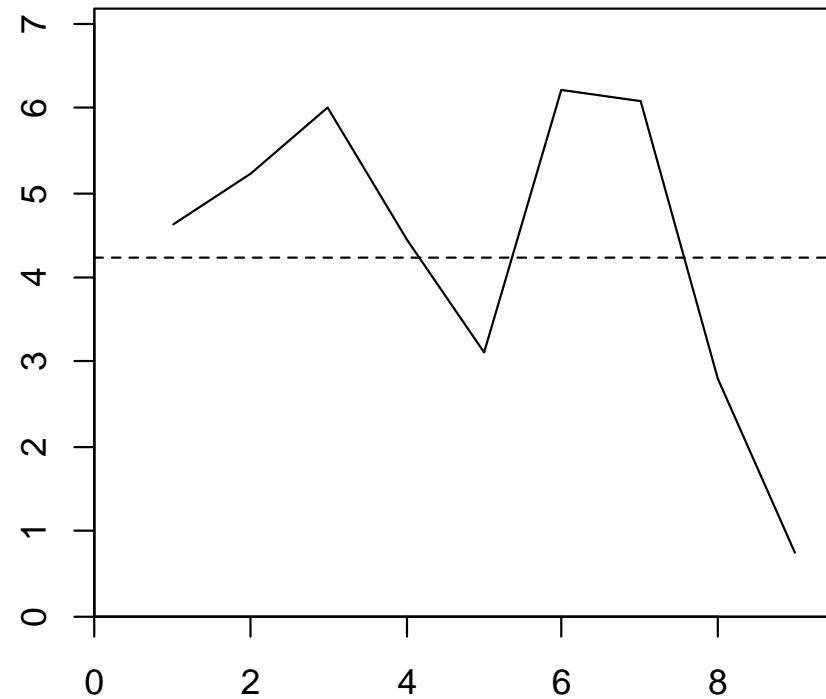
o Experimental variogram for regular 1-D grid

➤ Results of the calculations

Referenced value (variance,...) = 4.249

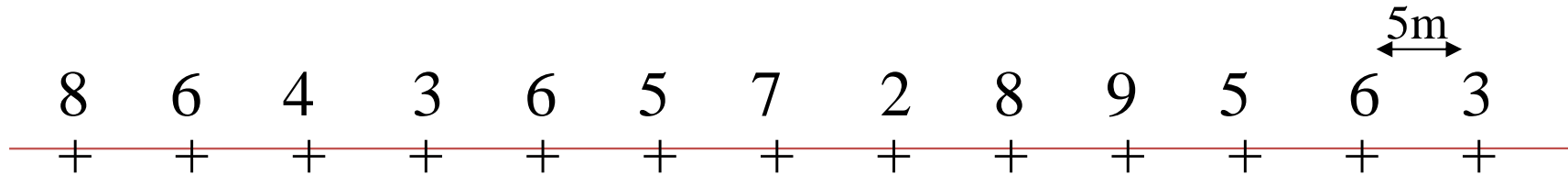
Rank	Npairs	Distance	Value
1	12.000	1.000	4.625
2	11.000	2.000	5.227
3	10.000	3.000	6.000
4	9.000	4.000	4.444
5	8.000	5.000	3.125
6	7.000	6.000	6.214
7	6.000	7.000	6.083
8	5.000	8.000	2.800
9	4.000	9.000	0.750

1-D Variogram

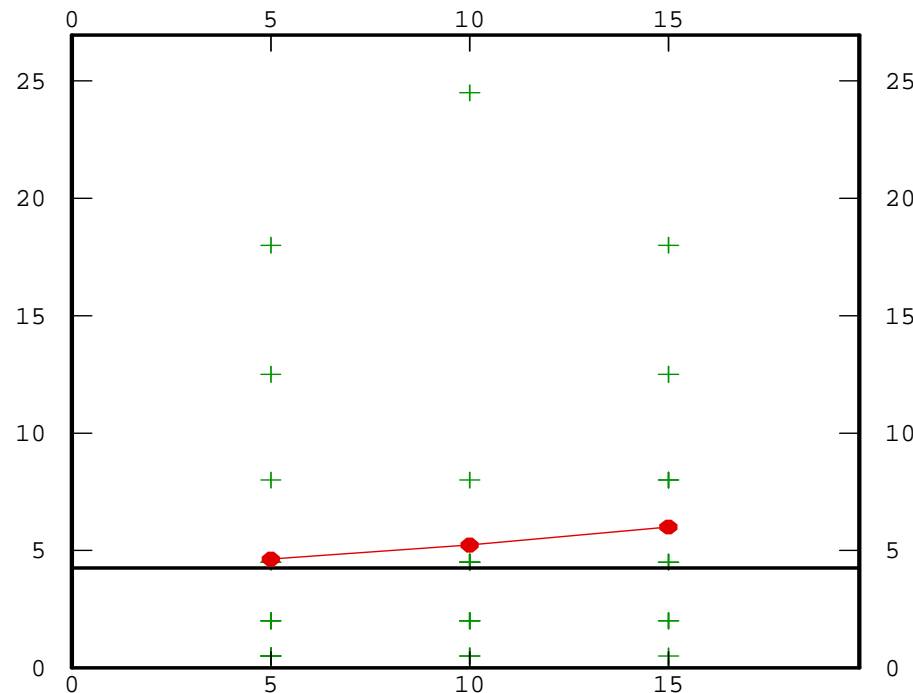


o Variogram cloud

- The variable is defined on a regular 1-D grid (mesh=5m)



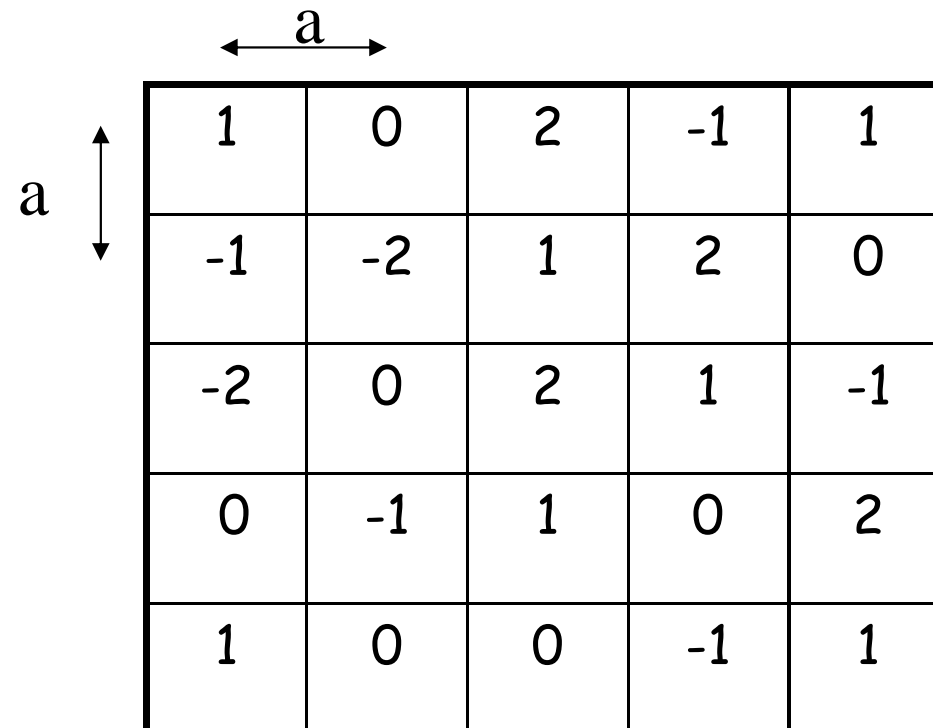
$$\frac{1}{2}(z_1 - z_2)^2$$



$$h(x_1, x_2)$$

○ Experimental variogram for regular 2-D grid

- The variable is defined on a regular 2-D grid (square mesh= a)



o Experimental variogram for regular 2-D grid

➤ Results of the calculations

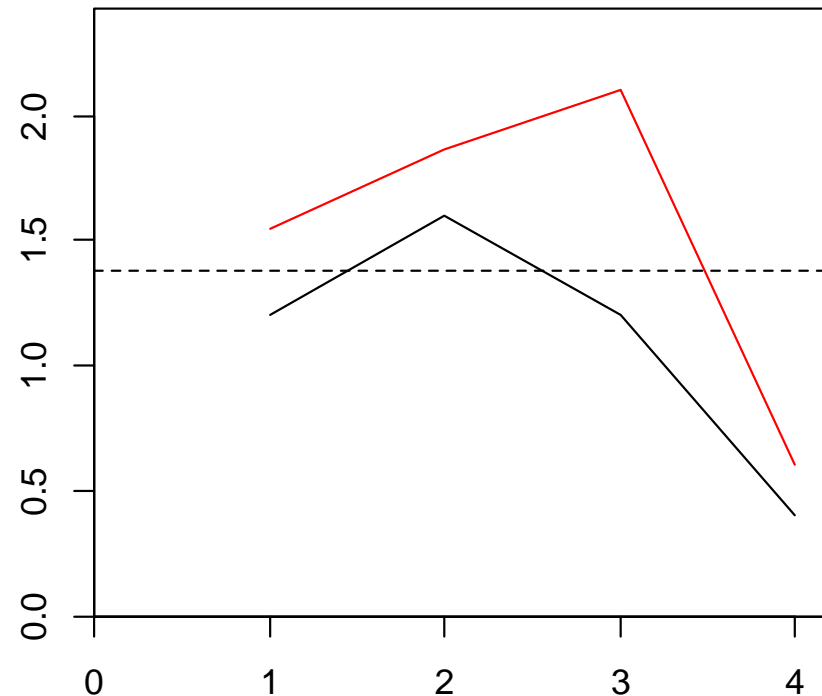
Direction 1 (1.000 0.000)

Rank	Npairs	Distance	Value
1	20.000	1.000	1.200
2	15.000	2.000	1.600
3	10.000	3.000	1.200
4	5.000	4.000	0.400

Direction 2 (0.000 1.000)

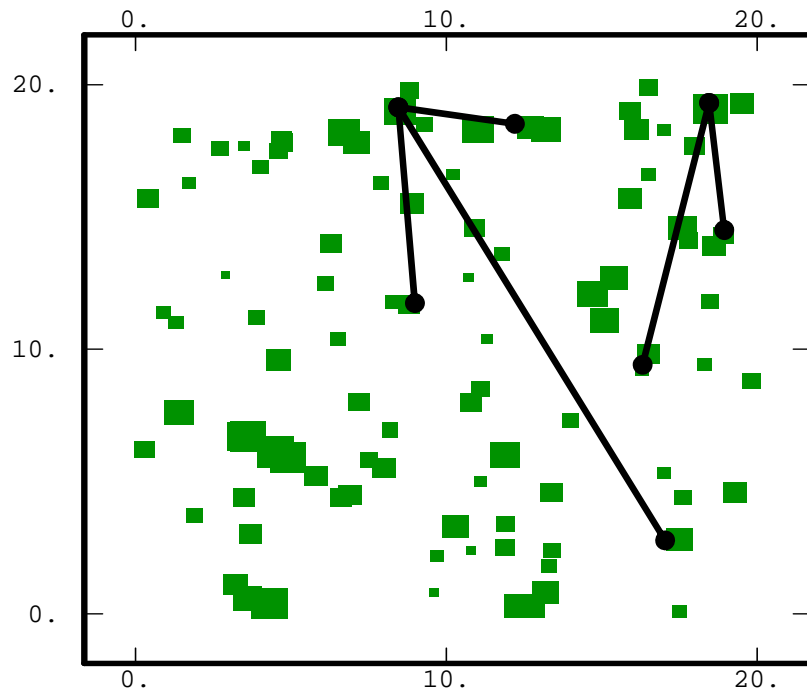
Rank	Npairs	Distance	Value
1	20.000	1.000	1.550
2	15.000	2.000	1.867
3	10.000	3.000	2.100
4	5.000	4.000	0.600

2-D Variogram

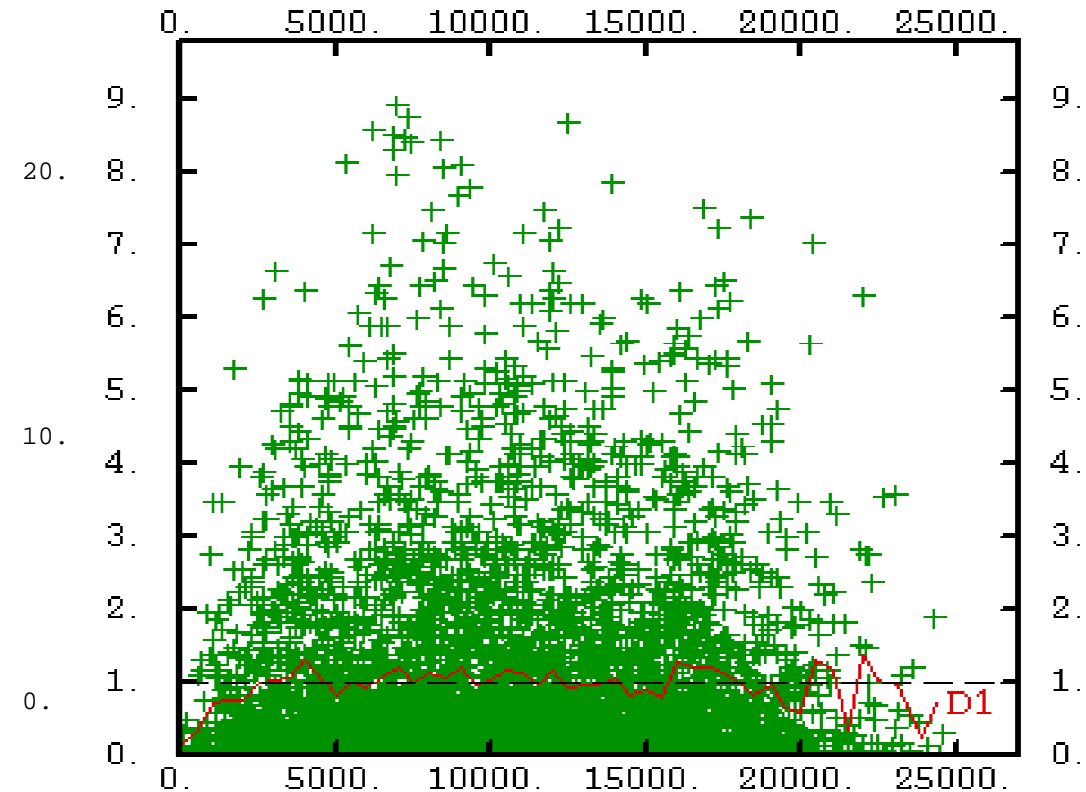


- Experimental variogram for irregular 2-D data set

- Calculation of the experimental omni-directional variogram



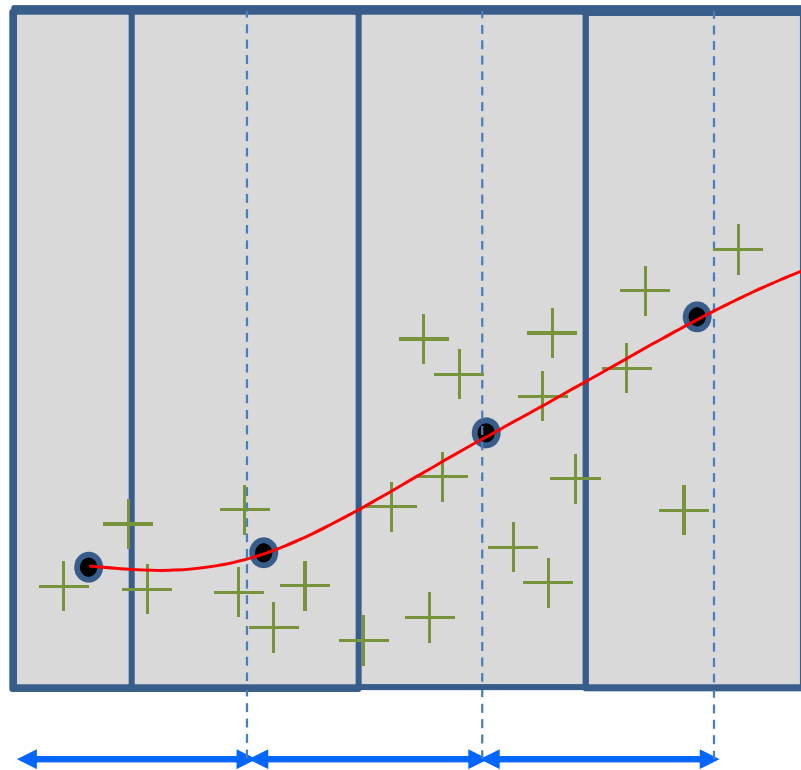
Base map






Variogram Cloud

o Experimental variogram for irregular 2-D data set

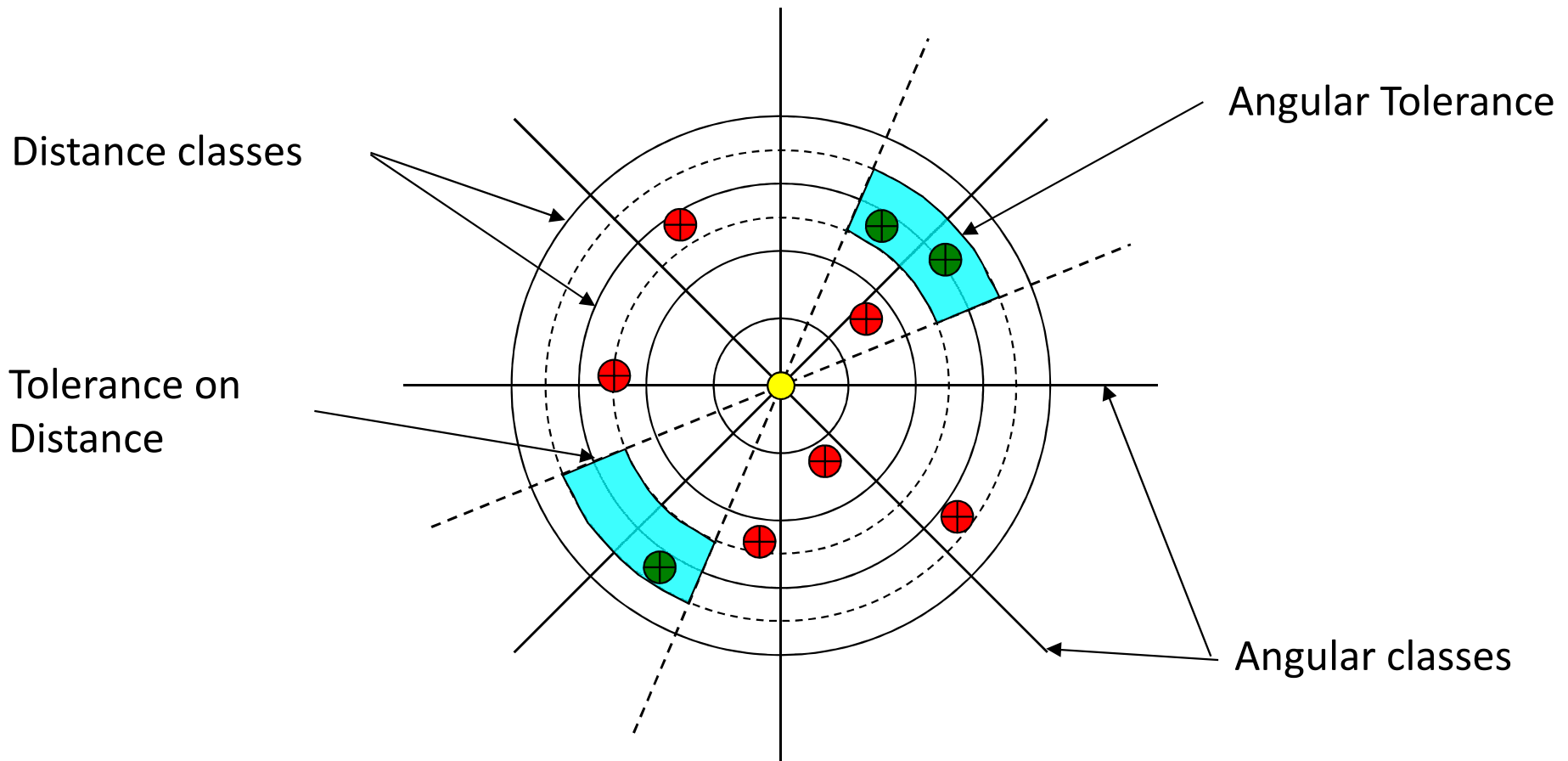
➤ From the variogram cloud to the experimental variogram



 Lag
 Tolerance
 Experimental Variogram

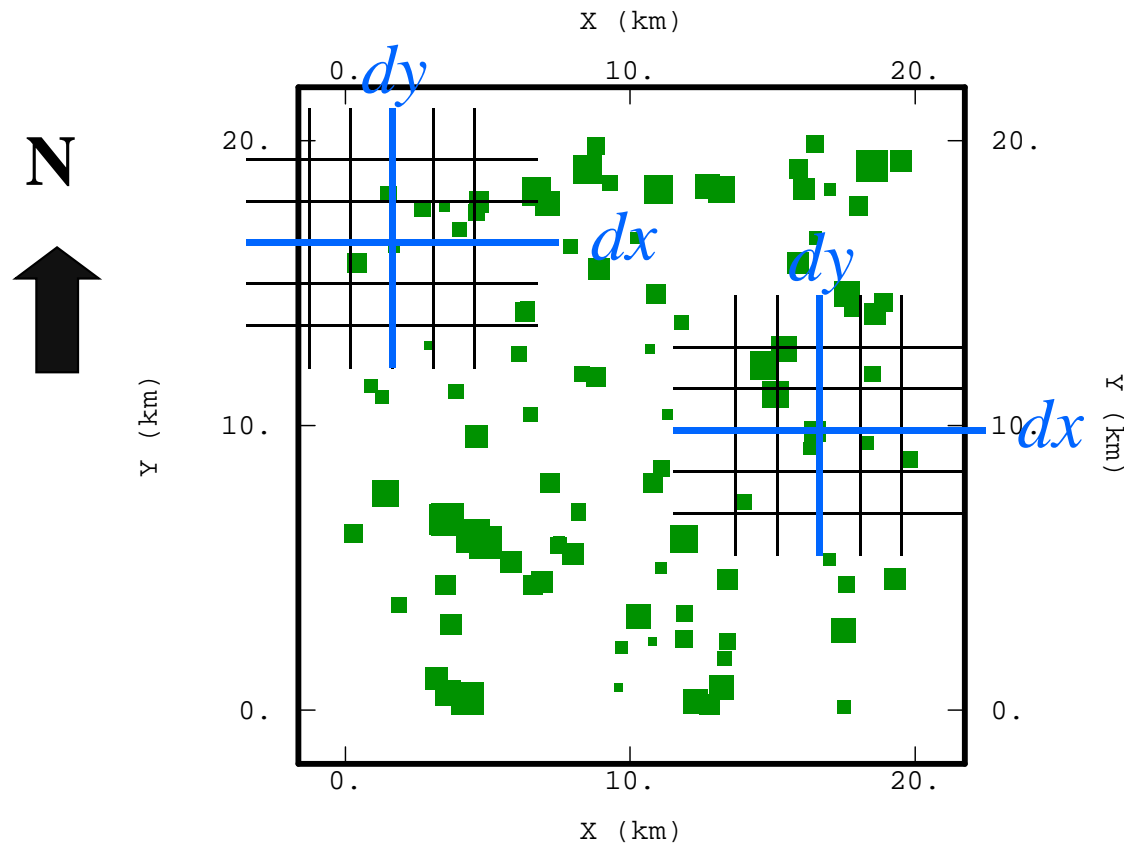
o Experimental directional variograms

- Considering each sample in turn (central point)



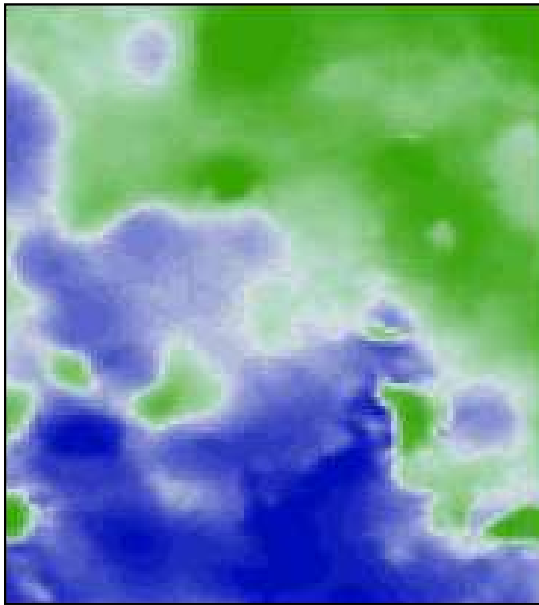
o Variogram Map

- The variogram map shows the variogram as a surface on a regular grid

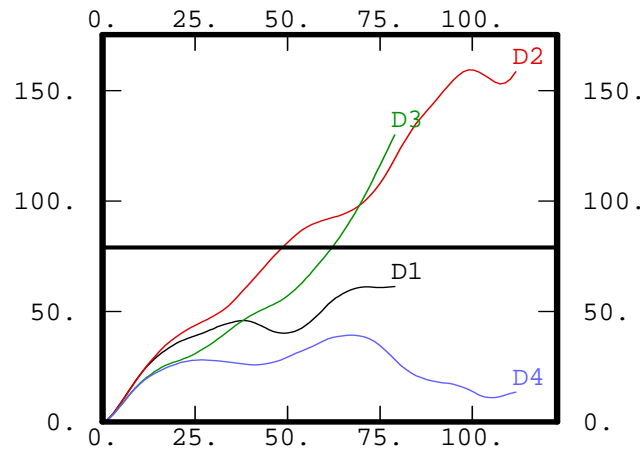


o Variogram map

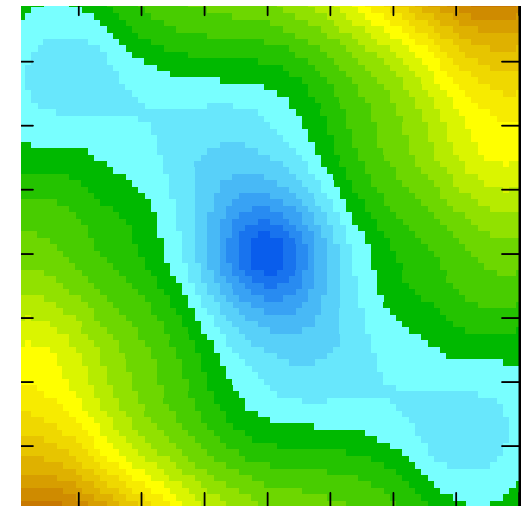
- Illustration using the Vineyard topographic surface



Data



Experimental Variograms calculated in 4 directions



Variogram Map