Norwegian University of Science and Technology Department of Mathematical Sciences



Contact person during exam: Professor Henning Omre (90937848/735 93531)

## Exam in TMA4250 SPATIAL STATISTICS

Friday May 21. 2010 Time: 09.00 - 13:00

Support:

Statistiske tabeller og formler, Tapir NTNU Calculator (HP30S) Personal handwritten yellow peep-sheet - A4-format

Sensur: Friday June 11. 2010

**Problem 1** CONTINUOUS RANDOM FIELDS.

Consider a Gaussian random field  $\{R(x); x \in \mathcal{D} \subset \mathbb{R}^2\}$ , with expectation function  $E\{R(x)\} = \mu_R(x)$ ;  $x \in \mathcal{D}$ , variance function  $\operatorname{Var}\{R(x)\} = \sigma_R^2(x)$ ;  $x \in \mathcal{D}$ , and positive definite spatial correlation function  $\operatorname{Corr}\{R(x'), R(x'')\} = \rho_R(x', x'')$ ;  $x', x'' \in \mathcal{D}$ . Assume that all model parameters are known.

a) Specify the exact requirements for  $\{R(x); x \in \mathcal{D}\}$  to be a Gaussian random field. Specify the additional requirements for  $\{R(x); x \in \mathcal{D}\}$  to be stationary and isotropic.

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Consider a related continuous random field:

$$\{S(x) = \sum_{l=1}^{L} B_l g_l(x) + R(x) = g^T(x)B + R(x); x \in \mathcal{D}\}$$

with

$$B = (B_1, \dots, B_L)^T \to \text{Gauss}_L(b; 0, \sigma_B^2 I)$$
$$g(x) = (g_1(x), \dots, g_L(x))^T; x \in \mathcal{D}$$

where model parameter  $\sigma_B^2$  and functions g(x) are known. Assume further that  $\{R(x); x \in \mathcal{D}\}$  is a stationary and isotropic Gaussian random field.

**b)** Is  $\{S(x); x \in \mathcal{D}\}$  a Gaussian random field ? Justify the answer.

Develop expressions for the expectation function  $\mu_S(x)$ , the variance function  $\sigma_S^2(x)$ ; and the spatial correlation function  $\rho_S(x', x'')$  for  $\{S(x); x \in \mathcal{D}\}$ . The expressions will depend on the model parameters of  $\{R(x); x \in \mathcal{D}\}$ .

Consider a set of observations of  $\{S(x); x \in \mathcal{D}\}$  in locations  $x^d = (x_1, \ldots, x_n)$  and denote them  $s(x^d) = (s(x_1), \ldots, s(x_n)).$ 

c) Consider an arbitrary location  $x_0 \in \mathcal{D}$ . Develop the expression for:

$$Prob\{S(x_0) > s_0 | S(x^d) = s(x^d)\}$$

## Problem 2 EVENT RANDOM FIELDS

A cheese-type contains holes that can be modeled as follows: The hole-centres are located according to a homogeneous Poisson random field (three dimensional)  $\{X_i, i = 1, \ldots, N; \mathcal{D} \subset \mathbb{R}^3\}$  with intensity  $\lambda$  ( $[dm^3]^{-1}$ ). The holes are circular with constant radius r (dm). Hence a cheese-unit consists of cheese with density  $\rho$  ( $g/dm^3$ ) and holes (that possibly overlap) that add nothing to the weight.

a) Specify the expression for the probability function for the number of hole-centres inside a cheese-unit of volume  $1 \ dm^3$ .

b) Consider a cheese-unit of volume  $1 dm^3$ .

Develop an expression for the expected weight of the cheese-unit.

Note that the probability density function for the distance from an arbitrary location in the cheese to the closest hole-centre is:

$$f(d) = 4\lambda\pi d^2 \times \exp\{-\lambda\frac{4}{3}\pi d^3\} ; d \ge 0$$

c) Consider an exactly circular hole in the cheese-unit (no overlap with other holes). Develop an expression for the probability density function for the minimum thickness of the cheese between this hole and another hole.

## Problem 3 MOSAIC RANDOM FIELDS

Consider an Ising random field  $L : \{L_u; u \in \mathcal{L}_D\}$  where  $\mathcal{L}_D$  is a regular lattice over  $\mathcal{D} \subset \mathbb{R}^2$ , and  $L_u \in \{-1, 1\}$ . The clique system consists of all closest neighbors of lattice nodes and the interaction parameter is  $\beta$ . The Gibbs formulation of random field is:

$$Prob\{L = l\} = const \times \exp\{-\beta \times \sum_{\substack{u,v \in \mathcal{L}_{\mathcal{D}} \\ < u,v >}} l_u l_v\}$$

In the following only lattice nodes in the interior of  $\mathcal{L}_{\mathcal{D}}$  need to be considered - hence border problems can be ignored.

a) Specify the Markov formulation for the random field and specify in particular the associated neighborhood system  $\{\delta(u); u \in \mathcal{L}_{\mathcal{D}}\}$ 

Observations are available in all lattice nodes  $d = \{d_u; u \in \mathcal{L}_D\}$  and the likelihood model contains blurring:

$$[d_u | L = l] = \frac{1}{5} \sum_{t \in \nu(u)} l_t + e_u$$

with blurring-domain  $\nu(u)$  being the lattice node u and the four closest lattice nodes. If u = (i, j) the blurring-domain is ((i, j), (i - 1, j), (i, j - 1), (i + 1, j), (i, j + 1)), is five lattice nodes. The observation errors  $e_u$  are spatially independent.

b) Develop the expression for the Markov formulation for the posterior model, [L|d], and specify in particular the associated neighborhood system.