# Scale Invariant Summary Functions for Stationary and Inhomogeneous Point Processes

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Section of a gradient sinter filter made of bronze powder

- Locally scaled point processes
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- Locally scaled summary functions
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A point process X on  $\mathcal{X} \subseteq {}^{d}$  is a locally scaled version of a stationary point process  $X_0$  with respect to the scale function  $c : {}^{d} \to (0, \infty)$  if to every  $B \in \mathcal{B}^{d}$  there exists  $\tilde{B} \supseteq B$  such that

$$c(x) \equiv \tilde{c}$$
 for all  $x \in \tilde{B}$ 

implies

$$X \cap B \stackrel{\mathrm{d}}{=} \tilde{c}X_0 \cap B.$$

Consequences:

$$\lambda_X(x) = \tilde{c}^{-d} \lambda_{X_0} \text{ for } x \in B,$$

$$\mathsf{E}^!_x(X(b(x,r))) = \mathsf{E}^!_x(X_0(b(x,r/ ilde c))) ext{ if } b(x,r) \subset B.$$

#### Locally scaled point processes: Examples



Scale invariant versions of summary functions for stationary point processes

*T*: any statistics of a stationary point process *X* with intensity  $\lambda$ . *T*<sup>\*</sup>: corresponding scale invariant version,

$$T^* := T \circ S_{\sqrt[d]{\lambda}},$$

 $S_c$ : scaling operator,  $S_c x = cx, x \in {}^d$ .

Example: K-function

$$egin{aligned} &\mathcal{K}^*_X(r) = \mathcal{K}_{X^*}(r) \ &= rac{1}{\lambda_{X^*}} \mathbf{E}^!_oig(X^*(b(o,r))ig) = \mathbf{E}^!_oig(X(b(o,r/\sqrt[d]{\lambda}))ig) = \lambda \mathcal{K}_X(r/\sqrt[d]{\lambda}) \end{aligned}$$

with  $X^* = S_{\sqrt[d]{\lambda}} X = \sqrt[d]{\lambda} X$ : point process X rescaled to unit intensity.

K-function

$$\mathcal{K}^*(r) = \mathbf{E}^!_x (X(b(x, r/\sqrt[d]{\lambda}))) = \lambda \mathcal{K}(t/\sqrt[d]{\lambda})$$

pair correlation function

$$g^*(r) = rac{\mathrm{d} \mathcal{K}^*(r)}{\mathrm{d} r} / d\omega_d r^{d-1} = g(t/\sqrt[d]{\lambda}) \quad (\omega_d: ext{ unit sphere volume})$$

L-function

$$L^*(r) = \sqrt[d]{K^*(r)/\omega_d} = \sqrt[d]{\lambda}L(t/\sqrt[d]{\lambda})$$

nearest neighbour distance distribution, aka G-function

$$D^*(r) = \mathbf{P}^!_x(X(b(x, r/\sqrt[d]{\lambda})) > 0) = D(t/\sqrt[d]{\lambda})$$

spherical contact distribution, aka F-function

$$H^*_{\mathfrak{s}}(t) = \mathbf{P}\big(X(b(o, r/\sqrt[d]{\lambda})) > 0\big) = H_{\mathfrak{s}}(t/\sqrt[d]{\lambda})$$

Example:  $K^*$ -function

$$\mathcal{K}^*(r) = \mathsf{E}^!_x ig( X(b(x,r/\sqrt[d]{\lambda})) ig) = \mathsf{E}^!_x ig( X(b_\lambda(x,r)) ig)$$

with

[x, y]: line segment connecting x and y.

Individual  $K^*$ -function

$$\mathcal{K}^*_x(r) = \mathbf{E}^!_x \big( X(b_\lambda(x,r)) \big),$$

averaged over a window W:

$$K_W^*(r) = \frac{1}{\Lambda(W)} \int_W K_x^*(r) \Lambda(\mathrm{d} x).$$

**Proposition:** Let X be a locally scaled version of the unit rate point process point process  $X_0$  with respect to the scale function c. Assume that

$$c(u) \equiv \tilde{c}$$
 for all  $u \in \tilde{B} \supset b(x, \tilde{c}r)$ ,

with  $\tilde{B}$  large enough to ensure that

$$X \cap b(x, \tilde{c}r) \stackrel{\mathrm{d}}{=} \tilde{c}X_0 \cap b(x, \tilde{c}r).$$

Then

$$K_x^*(r)=K_0(r).$$

If the scale function does not vary very much within the scaled distance r,

$$K_W^*(r) \approx K_0(r)$$

very closely.

# Estimated intensity





Dotted lines: corresponding Poisson point process

Analysis of the bronze data Checking the local scaling assumption

Division into subwindows



### Analysis of the bronze data: Checking the local scaling assumption



PP-plot of the  $D^*$  for the two subwindows

Dashed lines: horizontal division of the window into two halves

### Analysis of the bronze data: Checking the local scaling assumption

Locally scaled pair correlation function  $g^*$  for the two subwindows



# Analysis of the bronze data: Checking for second-order intensity-reweighted stationarity

Inhomogeneous pair correlation function  $g_{inhom}$  for the two subwindows



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