

# Variance paradoxes in geometric sampling : A generalisation of the 'Jensen-Gundersen Paradox'

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27th March 2006

# Overview

## Introduction

Volume estimators based on single probes

Second moment formulas for IUR test probes

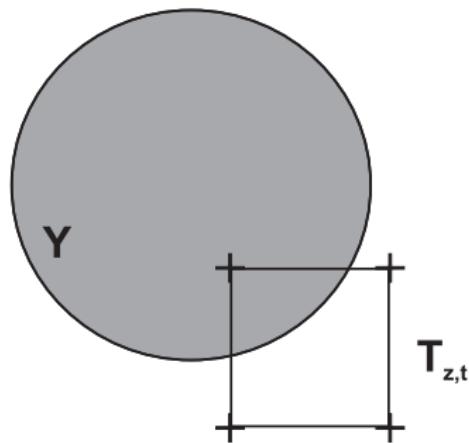
Volume estimators based on test systems

Second moment formulas for test systems

Outlook

## Introduction

- ▶ Jensen-Gundersen Paradox (1982): Pointcounting more precise than area measurement.



**Figure:** Original Jensen-Gundersen Paradox (E.B. Jensen, H.J.G. Gundersen (1982))

- ▶ K. Schladitz (1999) : Pointcounting optimal in some cases.

## Introduction

- ▶ Ohser's Paradox (1990): Counting lines more precise than length measurement.

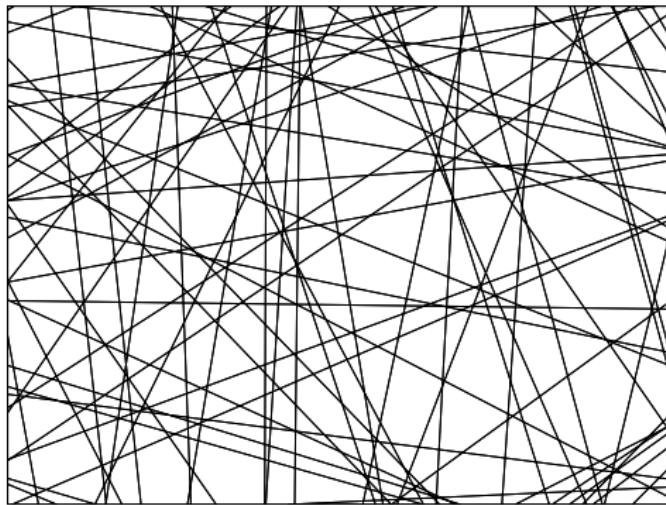


Figure: Ohser's Paradox (J. Ohser (1990))

- ▶ K. Schladitz (1996) : Counting optimal.

## Introduction

- ▶ What happens in the case of test systems?

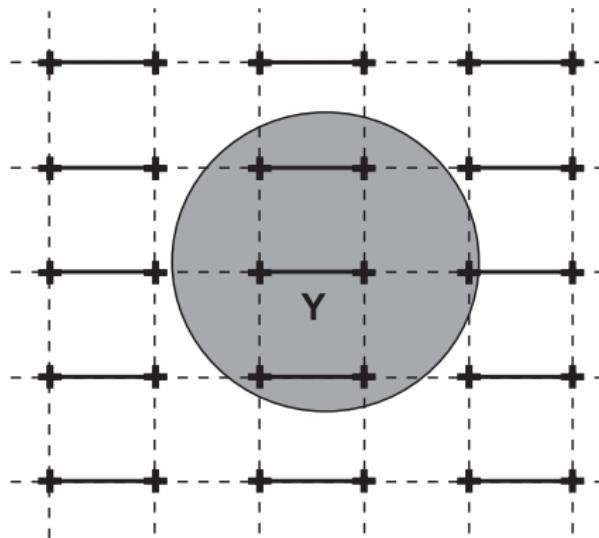


Figure: Test system intersecting a set  $Y$ .

## Overview

1. Volume estimators based on single probes
2. Second moment formulas for IUR test probes
3. Volume estimators based on test systems
4. Second moment formulas for test systems
5. Outlook

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Introduction

Volume estimators based on single probes

Second moment formulas for IUR test probes

Volume estimators based on test systems

Second moment formulas for test systems

Outlook

## IUR probes hitting a $d$ -dimensional set

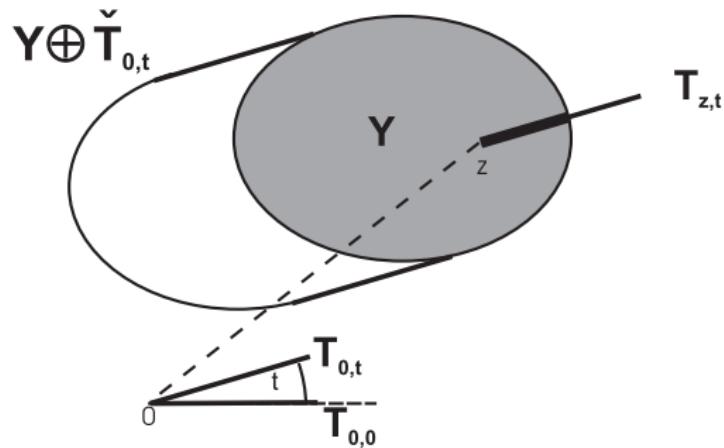


Figure: IUR line segment hitting a set  $Y$  in  $\mathbb{R}^2$

## Estimation of volume with a single bounded probe

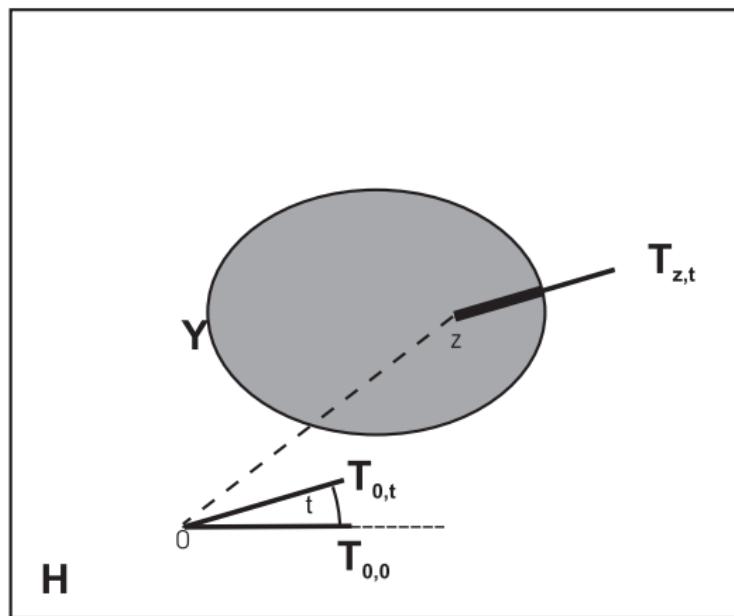


Figure: Estimation with a single test probe

## IUR probes hitting a $d$ -dimensional set

Let

- ▶  $T_{0,0}$  be a fixed set of dimension  $q$
- ▶  $T_{z,t}$  be the set after isotropic rotation by  $t \in G_{d[0]}$  and uniform random translation by  $z \in Y \oplus \check{T}_{0,t}$

Then  $T_{z,t}$  is called isotropic uniform random (IUR) hitting  $Y$  and

$$\widehat{\nu}_d(Y, T_{z,t}) := \frac{\mathbb{E}_t \nu_d(Y \oplus \check{T}_{0,t})}{\nu_q(T_{0,0})} \nu_q(T_{z,t} \cap Y)$$

is an unbiased estimator for  $\nu_d(Y)$ .

# Overview

Introduction

Volume estimators based on single probes

Second moment formulas for IUR test probes

Volume estimators based on test systems

Second moment formulas for test systems

Outlook

## The geometric covariogram

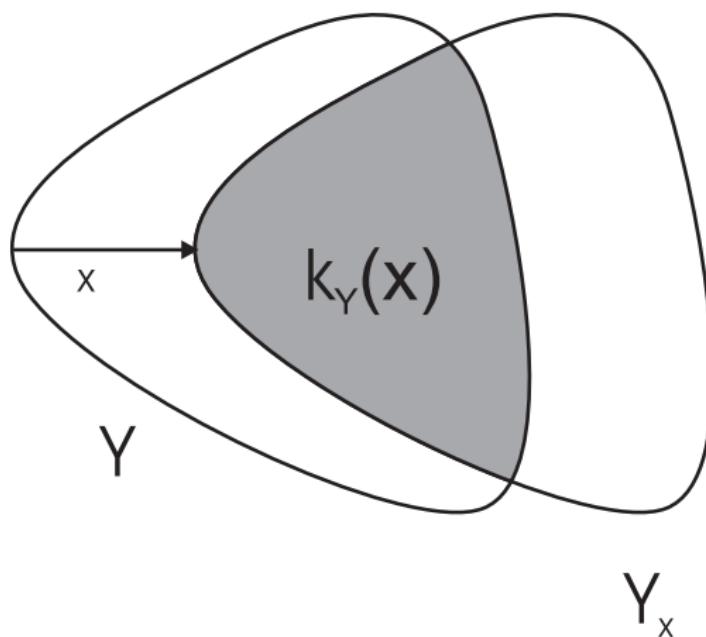


Figure: The geometric covariogram

## Second moment formulas for bounded IUR probes

### Theorem

Let  $Y \subset \mathbb{R}^d$ ,  $\dim(Y) = d$  and  $T_{z,t}$  be an IUR probe of dimension  $q$  hitting  $Y$ , then

$$\mathbb{E}\nu_q^2(Y \cap T_{z,t}) = \frac{1}{\mathbb{E}_t \nu_d(Y \oplus \check{T}_{0,t})} \int_{T_{0,0}} \int_{T_{0,0}} k_Y(\|y - x\|) \nu_q(dx) \nu_q(dy) \quad (1)$$

See [Baddeley and Cruz-Orive, 1995] for similar formulas.

## Second moment formulas for single probes

This formula is in general difficult to use, see the following figure :

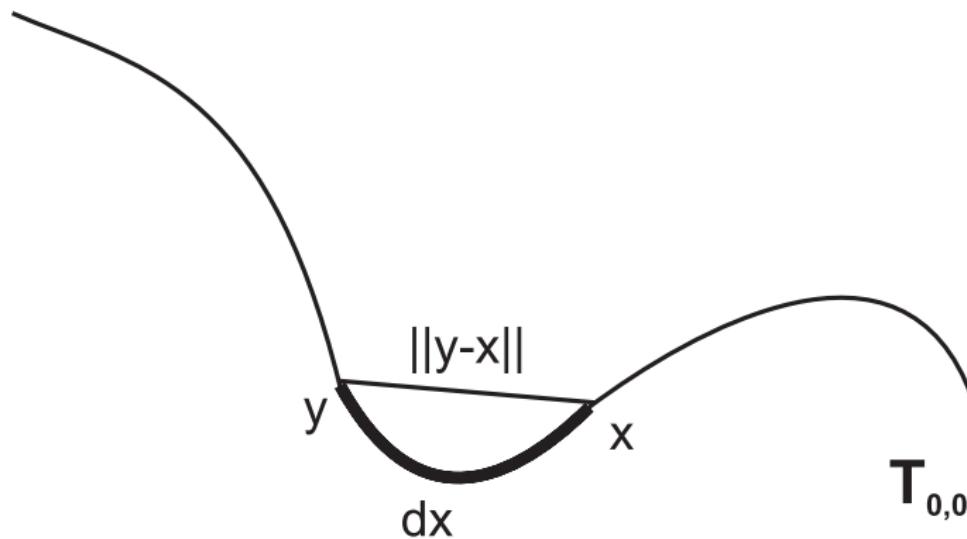


Figure: Values for  $\|x - y\|$  for a curve in  $\mathbb{R}^2$ .

## Second moment formulas for bounded IUR probes

### Corollary

If  $T_{0,0}$  is a subset of a  $q$ -dimensional affine-linear subspace, then

$$\mathbb{E}\nu_q^2(Y \cap T_{z,t}) = \frac{1}{\mathbb{E}_t \nu_d(Y \oplus \check{T}_{0,t})} \int_0^\infty qb_q r^{q-1} k_Y(r) k_T(r) dr \quad (2)$$

where  $k_T$  is the isotropic geometric covariogram of  $T_{0,0}$  regarded as a subset of  $\mathbb{R}^q$ .

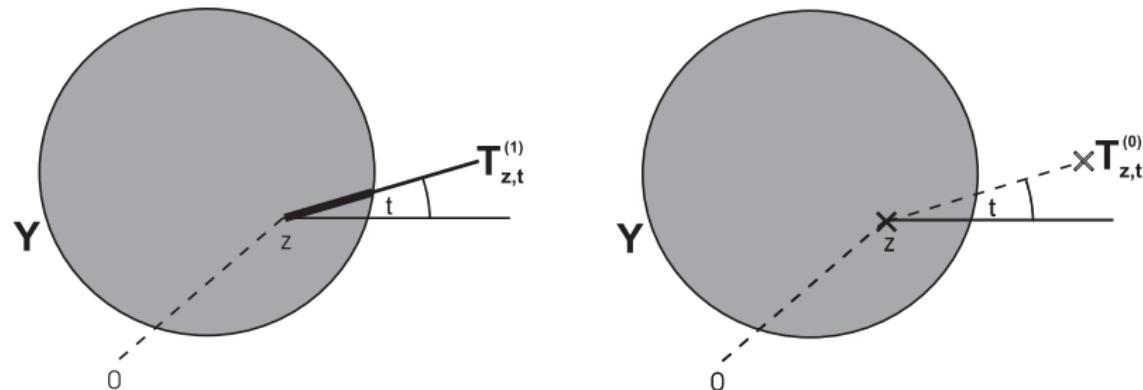
## Second moment formula for an IUR $q$ -flat

### Theorem

Let  $Y \subset \mathbb{R}^d$ ,  $\dim(Y)=d$  and  $L_q(z, t)$  be an IUR  $q$ -flat hitting  $Y$ , then

$$\mathbb{E}\nu_q^2(Y \cap L_q(z, t)) = \frac{1}{\mathbb{E}_t \nu_{d-q}(Y'_t)} \int_0^\infty qb_q r^{q-1} k_Y(r) dr \quad (3)$$

## Example : Disk probed by a line segment and its endpoints

Figure: 2 probes used to estimate  $\nu_2(Y)$

## Example : Disk probed by a line segment and its endpoints

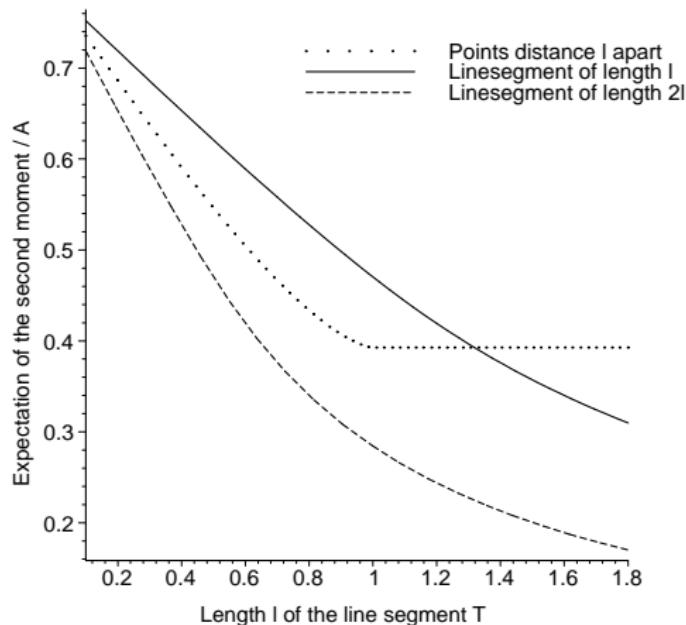


Figure: Second moments of the estimators for a disk  $Y$  of diameter 1.

## Example : Disk probed by a line segment and its endpoints

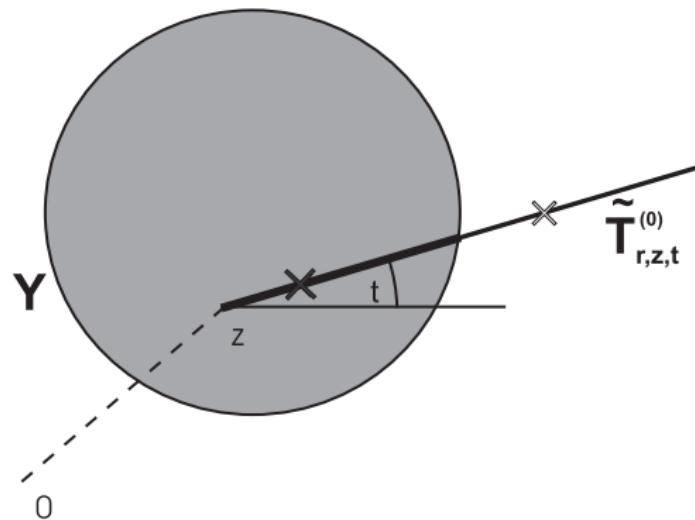
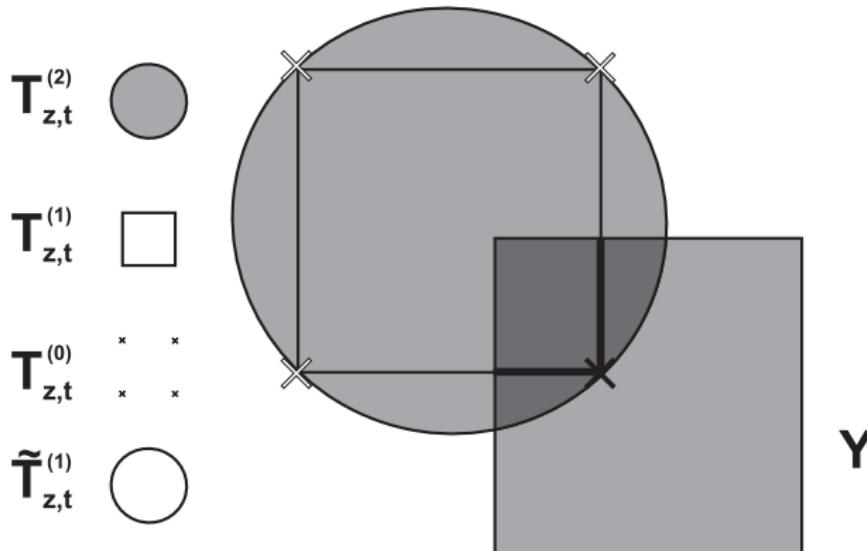


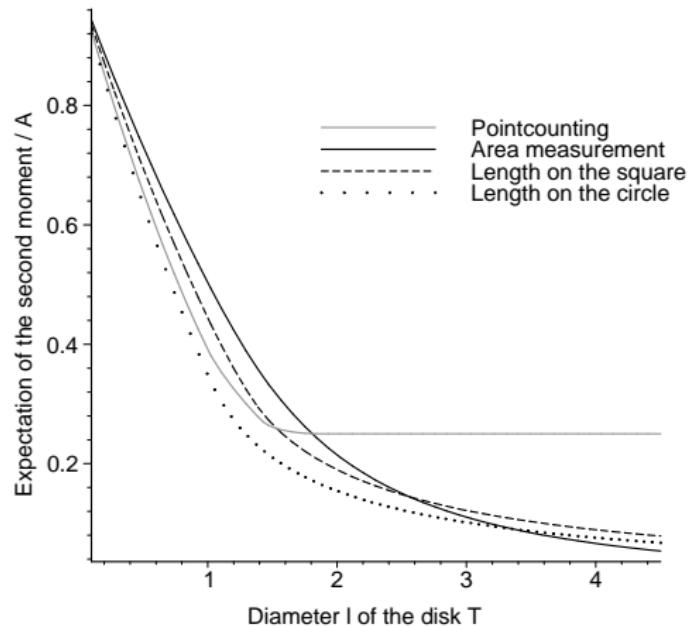
Figure: The 2 connected probes.

## Example : Area of square estimated by different probes

Figure: The 4 probes used to estimate  $\nu_2(Y)$ .

- $Y \subset \mathbb{R}^2$  square of side 1
- $T_{z,t}^{(0)} \subset T_{z,t}^{(1)} \subset T_{z,t}^{(2)}$  with 3 different probes

## Example : Area of square estimated by different probes

Figure:  $\frac{1}{A} \mathbb{E} \widehat{\nu}_2^2(Y, T^{(i)})$  of the 4 estimators with respect to  $l$ .

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Introduction

Volume estimators based on single probes

Second moment formulas for IUR test probes

**Volume estimators based on test systems**

Second moment formulas for test systems

Outlook

## Estimation of volume with test systems

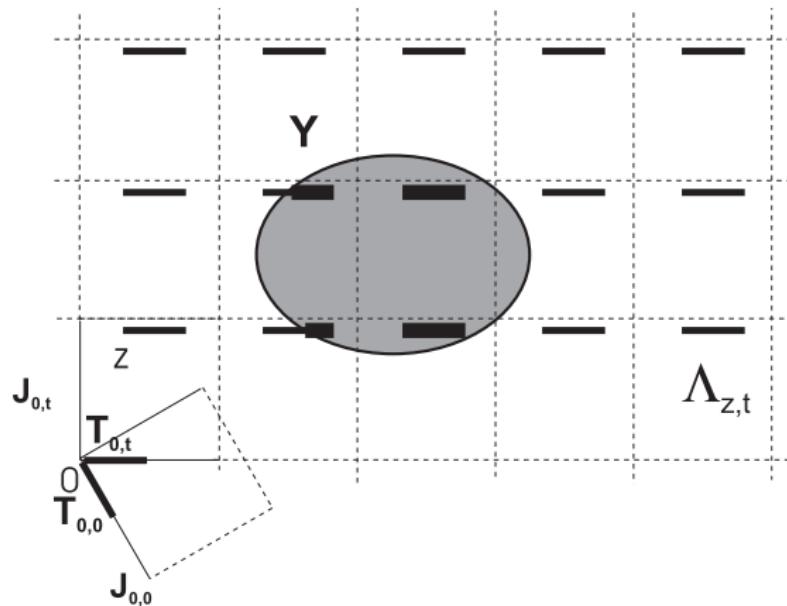


Figure: Estimation with a test system of line segments

## Estimation of volume with test systems

Let

- ▶  $T_{0,0}$  be a set of dimension  $q$  and  $\exists J_{0,0} \subset \mathbb{R}^d$  with
  - ▶  $\mathbb{R}^d = \bigcup_{k \in \mathbb{Z}} J_{z_k,0}$  for  $z_k \in \mathbb{R}^d \ \forall k \in \mathbb{Z}$
  - ▶  $J_{z_k,0} \cap J_{z_j,0} = \emptyset \ \forall k \neq j$
- ▶  $\Lambda_{0,0} = \bigcup_{k \in \mathbb{Z}} T_{z_k,0}$
- ▶  $\Lambda_{z,t}$  be  $\Lambda_{0,0}$  after isotropic rotation by  $t \in G_{d[0]}$  and uniform random translation by  $z$  in  $J_{0,t}$

Then

$$\widehat{\nu}_d(Y, \Lambda_{z,t}) := \frac{\nu_d(J_{0,0})}{\nu_q(T_{0,0})} \nu_q(\Lambda_{z,t} \cap Y)$$

is an unbiased estimator for  $\nu_d(Y)$

# Overview

Introduction

Volume estimators based on single probes

Second moment formulas for IUR test probes

Volume estimators based on test systems

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Outlook

## Second moment formulas for test systems

### Theorem

Let  $\Lambda_{0,0}$  be a test system with  $q$ -dimensional basic probe  $T_{0,0}$ .

Then for a IUR test system  $\Lambda_{z,t}$

$$\mathbb{E}\nu_q^2(Y \cap \Lambda_{z,t}) = \frac{1}{\nu_d(J_{0,0})} \int_{T_{0,0}} \int_{\Lambda_{0,0}} k_Y(\|y - x\|) \nu_q(dx) \nu_q(dy) \quad (4)$$

See e. g. [Matérn, 1989] for  $q = 0$ .

## Probes contained in affine-linear subspaces

### Corollary

If  $J_{0,0} = [0, a_1) \times \cdots \times [0, a_d)$  and  $T_{0,0}$  is a  $q$ -dimensional basic probe with  $T_{0,0} \subset [0, a_1) \times \cdots \times [0, a_q)$  and  $\Lambda_{z,t}$  is IUR, then

$$\begin{aligned} \mathbb{E}\nu_q^2(Y \cap \Lambda_{z,t}) &= \frac{1}{\nu_d(J_{0,0})} \sum_{k \in \mathbb{Z}} \sum_{j \in \mathbb{Z}} \\ &\quad \int_{\mathbb{R}^q} k_Y(\|z + z_j^{(d-q)}\|) k_{T_{0,0}}(z + z_k^{(q)}) \nu_q(dz) \end{aligned} \tag{5}$$

where  $z_k^{(q)}$  are the translations in  $L_q \supset T_{0,0}$ ,  $z_j^{(d-q)}$  are the translations in  $L_q^\perp$ .

## Test systems of lines, line segments and points in $\mathbb{R}^2$

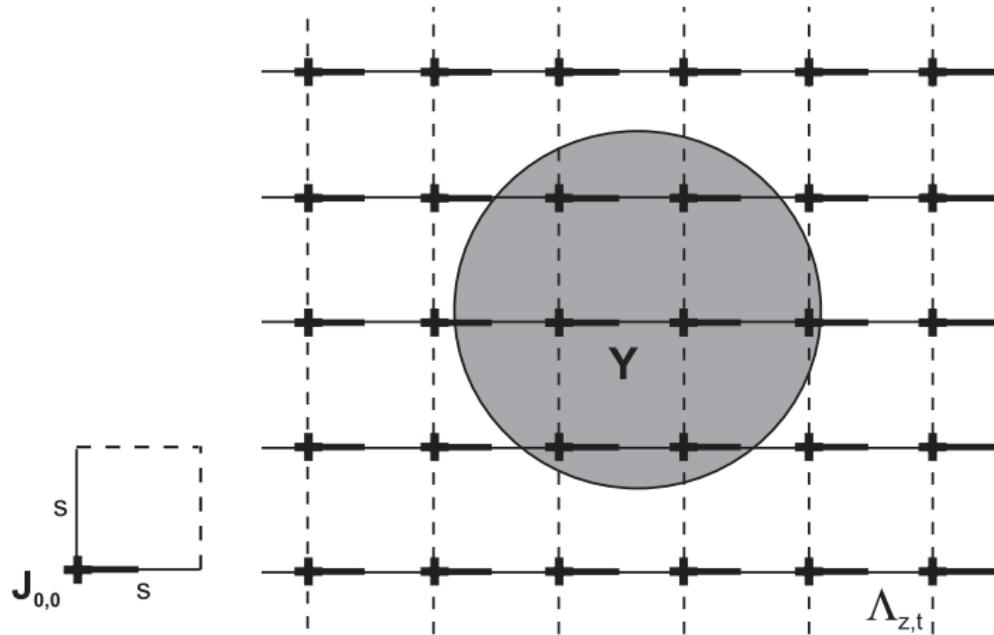


Figure: Different test systems.

## Comparison of lines, line segments and points in $\mathbb{R}^2$

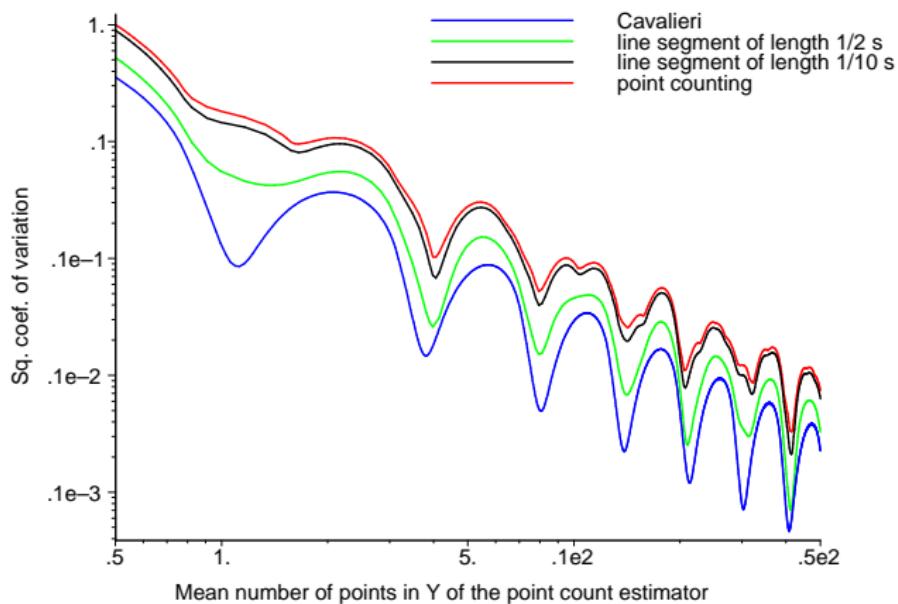


Figure: Square coefficient of variation of different estimators with  $J_{0,0} = [0, s) \times [0, s)$  for a disk  $Y$  of diameter 1

## Comparison of lines, line segments and points in $\mathbb{R}^2$

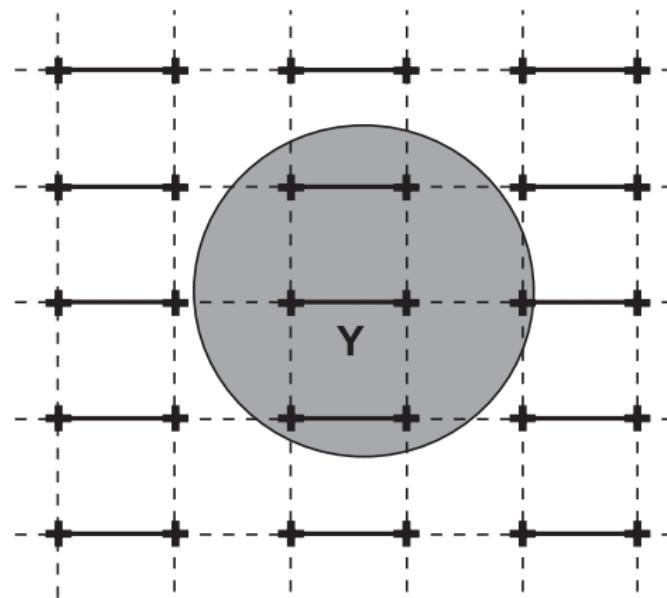
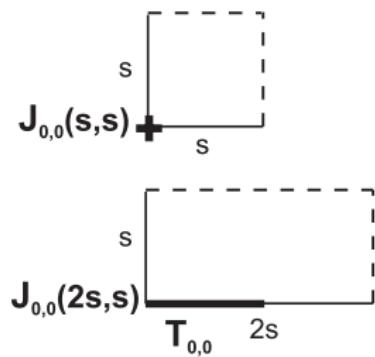


Figure: Test system of points contained in the system of line segments.

## Comparison of lines, line segments and points in $\mathbb{R}^2$

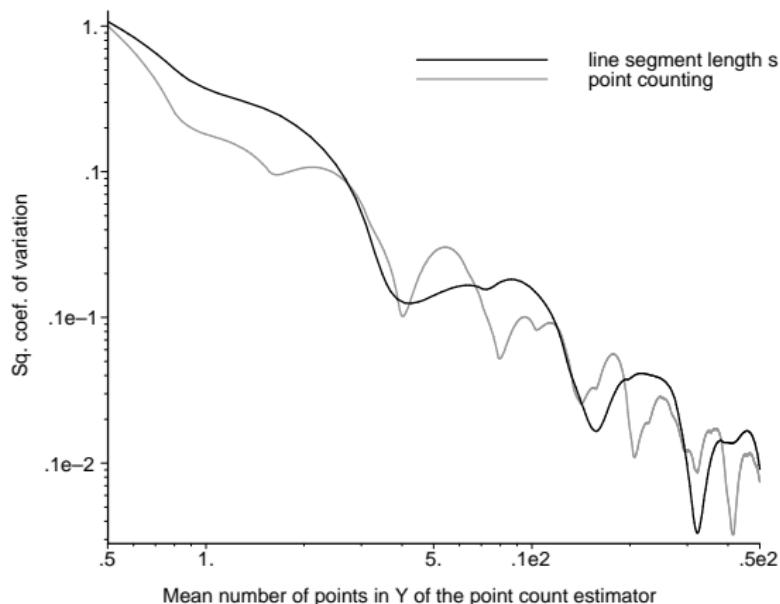


Figure: Square coefficient of variation of the pointcounting and the estimator based on line segments of length  $s$ .

## Overview

Introduction

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Volume estimators based on test systems

Second moment formulas for test systems

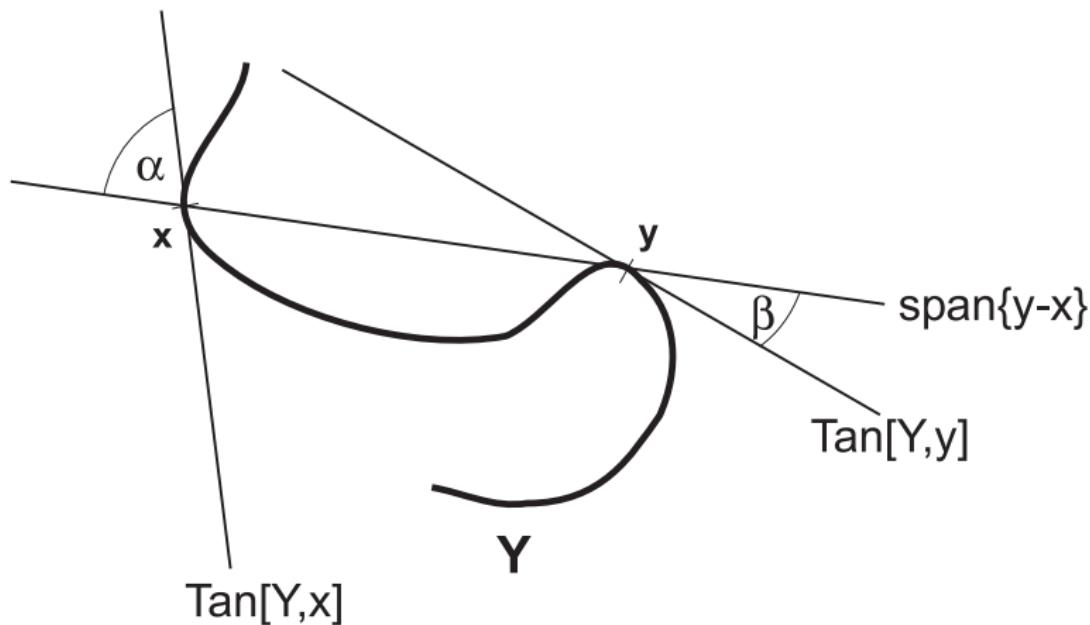
## Outlook

## Outlook : Second moment formula for $\dim(Y) < d$

### Theorem

Let  $Y \subset \mathbb{R}^2$ ,  $\dim(Y)=1$  and  $T_{z,t}$  be an IUR line segment. Then

$$\begin{aligned} & \mathbb{E}\nu_0^2(Y \cap T_{z,t}) \cdot (\pi \mathbb{E}_t \nu_2(Y \oplus \check{T}_{0,t})) \\ &= \int_Y \int_Y k_T(\|y-x\|) \frac{\sin \alpha \sin \beta}{\|y-x\|} \nu_1(dy) \nu_1(dx) + 2\nu_1(T)\nu_1(Y) \end{aligned}$$

Outlook : Second moment formula for  $\dim(Y) < d$ Figure: The angles  $\alpha$  and  $\beta$  in the theorem.

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