

# The pairwise relative semivariogram



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## 1 Introduction

The general relative variogram (Deutsch and Journel, 1997) is defined as

$$\gamma(h) = \frac{1}{2N_h} \sum_{i=1}^{N_h} \left( \frac{2(Z(s_i) - Z(s_i + h))}{Z(s_i) + Z(s_i + h)} \right)^2.$$

It is claimed to reveal spatial structure (correlation) better when data are skewed and/or clustered. The `cluster.dat` data set used in this vignette, from the GSLIB distribution<sup>1</sup>, seems to confirm this.

From version 1.02 on, R package `gstat` provides computation of the *pairwise relative semivariogram*. The following code provides an example and verification of the computation using direct R code and using the GSLIB program `gamv`.

The following code imports the `cluster.dat` data from GSLIB, which has been converted to have a single-line header containing column names, packaged with the R `gstat` package, and converts it into a `SpatialPointsDataFrame` object:

```
> library(gstat)
> cluster = read.table(system.file("external/cluster.txt", package = "gstat"),
+   header = TRUE)
> summary(cluster)
```

| X                   | Y             | Primary        | Secondary       |
|---------------------|---------------|----------------|-----------------|
| Min. : 0.50         | Min. : 0.50   | Min. : 0.060   | Min. : 0.1800   |
| 1st Qu.: 9.50       | 1st Qu.:14.25 | 1st Qu.: 0.700 | 1st Qu.: 0.7875 |
| Median :25.50       | Median :27.00 | Median : 2.195 | Median : 2.3750 |
| Mean :23.32         | Mean :25.61   | Mean : 4.350   | Mean : 4.1402   |
| 3rd Qu.:35.50       | 3rd Qu.:36.50 | 3rd Qu.: 5.327 | 3rd Qu.: 5.5800 |
| Max. :48.50         | Max. :48.50   | Max. :58.320   | Max. :22.4600   |
| Declustering_Weight |               |                |                 |
| Min. :0.252         |               |                |                 |
| 1st Qu.:0.445       |               |                |                 |

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<sup>1</sup>F77 source code for Linux, downloaded Aug 28, 2011 from <http://www.gslib.com/>

```

Median :1.012
Mean   :1.000
3rd Qu.:1.416
Max.    :2.023

```

```
> coordinates(cluster) = ~X + Y
```

The following commands specify a sequence of lag boundaries that correspond to the GSLIB conventions, and compute a regular variogram using these boundaries:

```

> bnd = c(0, 2.5, 7.5, 12.5, 17.5, 22.5, 27.5, 32.5, 37.5, 42.5,
+        47.5, 52.5)
> variogram(Primary ~ 1, cluster, boundaries = bnd)

```

|    | np   | dist      | gamma    | dir.hor | dir.ver | id   |
|----|------|-----------|----------|---------|---------|------|
| 1  | 149  | 1.527974  | 58.07709 | 0       | 0       | var1 |
| 2  | 624  | 5.472649  | 54.09188 | 0       | 0       | var1 |
| 3  | 989  | 10.150607 | 48.85144 | 0       | 0       | var1 |
| 4  | 1249 | 15.112173 | 40.08909 | 0       | 0       | var1 |
| 5  | 1148 | 20.033244 | 42.45081 | 0       | 0       | var1 |
| 6  | 1367 | 25.020160 | 48.60365 | 0       | 0       | var1 |
| 7  | 1311 | 29.996102 | 46.88879 | 0       | 0       | var1 |
| 8  | 1085 | 34.907219 | 44.36890 | 0       | 0       | var1 |
| 9  | 904  | 39.876469 | 47.34666 | 0       | 0       | var1 |
| 10 | 611  | 44.716540 | 38.72725 | 0       | 0       | var1 |
| 11 | 219  | 49.387310 | 30.67908 | 0       | 0       | var1 |

To compute the relative pairwise variogram, the logical argument `PR` (*pair-wise relative*) needs to be set to `TRUE`:

```
> variogram(Primary ~ 1, cluster, boundaries = bnd, PR = TRUE)
```

|    | np   | dist      | gamma     | dir.hor | dir.ver | id   |
|----|------|-----------|-----------|---------|---------|------|
| 1  | 149  | 1.527974  | 0.3608431 | 0       | 0       | var1 |
| 2  | 624  | 5.472649  | 0.6307083 | 0       | 0       | var1 |
| 3  | 989  | 10.150607 | 0.8376443 | 0       | 0       | var1 |
| 4  | 1249 | 15.112173 | 0.7769083 | 0       | 0       | var1 |
| 5  | 1148 | 20.033244 | 0.8774599 | 0       | 0       | var1 |
| 6  | 1367 | 25.020160 | 0.8961016 | 0       | 0       | var1 |
| 7  | 1311 | 29.996102 | 0.9002297 | 0       | 0       | var1 |
| 8  | 1085 | 34.907219 | 0.9604305 | 0       | 0       | var1 |
| 9  | 904  | 39.876469 | 0.9055426 | 0       | 0       | var1 |
| 10 | 611  | 44.716540 | 0.7554474 | 0       | 0       | var1 |
| 11 | 219  | 49.387310 | 0.8226759 | 0       | 0       | var1 |

Figure 1 shows the two variograms, as plots, side by side

## 2 Verification with plain R code

The following R code reproduces the relative pairwise semivariogram values for the first three lags, i.e. 0-2.5, 2.5-7.5 and 7.5-12.5.



Figure 1: Regular variogram (left) and pairwise relative variogram (right) for the GSLIB data set `cluster.dat`.

```

> z = cluster$Primary
> d = spDists(cluster)
> zd = outer(z, z, "-")
> zs = outer(z, z, "+")
> pr = (2 * zd/zs)^2
> prv = as.vector(pr)
> dv = as.vector(d)
> mean(prv[dv > 0 & dv < 2.5])/2

[1] 0.3608431

> mean(prv[dv > 2.5 & dv < 7.5])/2

[1] 0.6307083

> mean(prv[dv > 7.5 & dv < 12.5])/2

[1] 0.8376443

```

### 3 Verification with GSLIB

In a verification with the GSLIB (Deutsch and Journel, 1997) code of `gamv`, the following file was used:

```

Parameters for GAMV
*****

START OF PARAMETERS:
../data/cluster.dat
file with data
1 2 0
columns for X, Y, Z coordinates
1 3
number of variables,column numbers
-1.0e21 1.0e21
trimming limits
gamv.out
file for variogram output
10
number of lags
5.0
lag separation distance
2.5
lag tolerance
1
number of directions
0.0 90.0 50.0 0.0 90.0 50.0
azm,atol,bandh,dip,dtol,bandv
0
standardize sills? (0=no, 1=yes)

```

```

2
number of variograms
1 1 1
tail var., head var., variogram type
1 1 6
tail var., head var., variogram type

```

Running this program with these parameters gave the following output:

| Semivariogram |        | tail:Primary |      | head:Primary | direc-  |
|---------------|--------|--------------|------|--------------|---------|
| tion 1        |        |              |      |              |         |
| 1             | .000   | .00000       | 280  | 4.35043      | 4.35043 |
| 2             | 1.528  | 58.07709     | 298  | 8.62309      | 8.62309 |
| 3             | 5.473  | 54.09188     | 1248 | 5.41315      | 5.41315 |
| 4             | 10.151 | 48.85144     | 1978 | 4.42758      | 4.42758 |
| 5             | 15.112 | 40.08909     | 2498 | 4.25680      | 4.25680 |
| 6             | 20.033 | 42.45081     | 2296 | 3.74311      | 3.74311 |
| 7             | 25.020 | 48.60365     | 2734 | 4.09575      | 4.09575 |
| 8             | 29.996 | 46.88879     | 2622 | 4.15950      | 4.15950 |
| 9             | 34.907 | 44.36890     | 2170 | 3.77190      | 3.77190 |
| 10            | 39.876 | 47.34666     | 1808 | 4.54173      | 4.54173 |
| 11            | 44.717 | 38.72725     | 1222 | 5.15251      | 5.15251 |
| 12            | 49.387 | 30.67908     | 438  | 4.56539      | 4.56539 |

  

| Pairwise Relative |        | tail:Primary |      | head:Primary | direc-  |
|-------------------|--------|--------------|------|--------------|---------|
| tion 1            |        |              |      |              |         |
| 1                 | .000   | .00000       | 280  | 4.35043      | 4.35043 |
| 2                 | 1.528  | .36084       | 298  | 8.62309      | 8.62309 |
| 3                 | 5.473  | .63071       | 1248 | 5.41315      | 5.41315 |
| 4                 | 10.151 | .83764       | 1978 | 4.42758      | 4.42758 |
| 5                 | 15.112 | .77691       | 2498 | 4.25680      | 4.25680 |
| 6                 | 20.033 | .87746       | 2296 | 3.74311      | 3.74311 |
| 7                 | 25.020 | .89610       | 2734 | 4.09575      | 4.09575 |
| 8                 | 29.996 | .90023       | 2622 | 4.15950      | 4.15950 |
| 9                 | 34.907 | .96043       | 2170 | 3.77190      | 3.77190 |
| 10                | 39.876 | .90554       | 1808 | 4.54173      | 4.54173 |
| 11                | 44.717 | .75545       | 1222 | 5.15251      | 5.15251 |
| 12                | 49.387 | .82268       | 438  | 4.56539      | 4.56539 |

As can be seen, the values in the third column (semivariogram for the first section, pairwise relative semivariogram for the second) correspond to the output generated by `variogram` of package `gstat`. Two differences with respect to the `gstat` output are:

- for the first lag with distance zero, GSLIB reports that the semivariance value is zero based on 280 point pairs;
- the number of point pairs in GSLIB is double the number reported by `gstat`.

The ground for these differences seems that the GSLIB `gamv` uses a single routine for computing variograms as well as cross variograms and cross covariances. For cross variograms or covariograms, considering two variables  $Z_a$

and  $Z_b$  each having  $N$  observations, the  $N^2$  point pairs  $Z_a(s_i), Z_b(s_i + h)$  and  $Z_a(s_i + h), Z_b(s_i)$  need to be evaluated, and all contribute information.

For direct (non-cross) variograms or covariograms,  $Z_a = Z_b$  and the  $N^2$  pairs considered contain the  $N$  trivial pairs  $(Z(s_i) - Z(s_i))^2 = 0$ , which contribute no information, as well as all duplicate pairs, i.e. in addition to  $(Z(s_i) - Z(s_i + h))^2$ , the identical pair  $(Z(s_i + h) - Z(s_i))^2$  is also considered. This leads to correct variogram value estimates, but incorrect unique point pair numbers. (Data set **cluster** contains  $N = 140$  observations.)

In contrast, **gstat** considers (and reports) only the number of unique pairs for each lag.

## References

- Deutsch, C.V., A.G. Journel, 1997. **GSLIB: Geostatistical Software Library and User's Guide**, second edition. Oxford University Press.