# Estimating RACS Properties from a Binary Map

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This document is a short demonstration of estimating various properties of a stationary RACS from an observation that is a binary map. See (Hingee, 2019; Hingee et al., 2019) for more rigorous discussion of the properties and estimators.

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## 1 Preparing the Binary Map

We will need an image in spatstat's im format with values of 1, 0 and NA representing foreground, background and outside the observation window respectively. For this vignette we will use a small image already prepared. We reduced the resolution for greater speed in building this vignette. You can see how we prepared the image from remotely sensed data in the demo: import\_remote\_sense\_data.

This demo can be run by typing the following in R:

demo("import\_remote\_sense\_data", package = "lacunaritycovariance").

```
> library(lacunaritycovariance)
> load(system.file("extdata/egbinarymap.RData",
+ package="lacunaritycovariance"))
> # the following converts egbinarymap to logically-valued pixels
> egbinarymap <- as.im(egbinarymap, eps = egbinarymap$xstep*8)
> egbinarymap <- eval.im(egbinarymap > 0.5)
> plot(egbinarymap,
+ col = c("grey", "black"),
+ main = "The Binary Map")
```

### The Binary Map

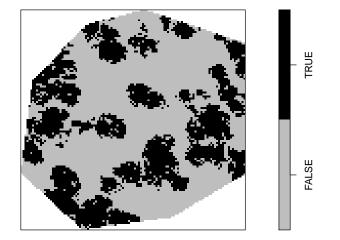


Figure 1: The binary map used in this example. Black (TRUE) is tree canopy, grey (FALSE) is not tree canopy and white (NA) is outside the observation window.

This binary map is a small subset of a tree canopy map with a spatial resolution of 20cm derived from aerial stereophotography following the methods described by Caccetta et al. (2015).

- Spatial resolution was 0.2m. The resolution has been reduced to 1.6m in this vignette.
- Year of capture was 2009.

- Location was a sparsely forested region just north of Perth, Western Australia.
- The map is approximately 300m x 300m in extent.
- Data format: ERMapper raster (.ers).

### 2 Estimate Properties of Stationary RACS

The package lacunaritycovariance has functions for estimating coverage probability, covariance and gliding box lacunarity (GBL). GBL is one of the most popular lacunarity indices, and theory and estimation of GBL was described by Hingee et al. (2019). Covariance estimators were primarily developed by Picka (2000). Hingee (2019) summarises some of Picka's work. Coverage probability is a popular RACS property that is also known as the coverage fraction. It is an important first-order property of a stationary RACS.

Below we estimate the coverage probability, covariance and gliding box lacunarity of a RACS from the binary map in Figure 1.

The coverage probability is estimated by the proportion of the observation window covered by the foreground.

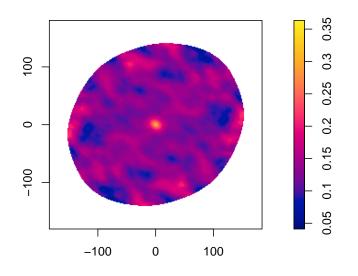
```
> phat <- coverageprob(egbinarymap)
> phat
```

#### [1] 0.3648768

Covariance estimates using the balanced estimator inspired by Picka's additively modified estimator of centred covariance (Picka, 2000) are shown below. This estimator typically has smaller variance than the traditional (plug-in moment) estimator and is consistent with covariance estimates made from the complement of the binary map.

```
> cvchat <- racscovariance(egbinarymap, estimators = "pickaH",
+ drop = TRUE)
> plot(cvchat, main = "Estimated RACS Covariance", axes = TRUE)
```

**Estimated RACS Covariance** 



#### Figure 2: Estimated Covariance

The additively modified estimate of pair-correlation (Picka, 2000) is shown below. It was obtained from the earlier estimate of covariance, but can also be obtained directly using the function paircorr. The rotational mean of the pair correlation estimate is an estimate of isotropic pair correlation and can be obtained using the function rotmean in spatstat: rotmean(pclnest, padzero = FALSE, result = "fv").

```
> pclnest <- eval.im(cvchat / (phat<sup>2</sup>))
> plot(pclnest, main = "Pair Correlation Estimate")
```

**Pair Correlation Estimate** 

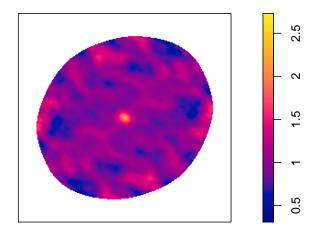
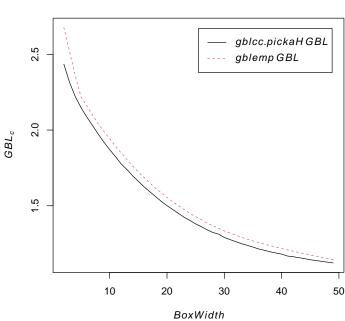


Figure 3: Estimated Pair Correlation.

The function gbl can give estimates of GBL using the empirical gliding-box method or our new covariance-based estimators (Figure 4).

```
> gblest <- gbl(xi = egbinarymap, seq(1, 200/4, by = 1),
+ estimators = c("GBLcc.pickaH", "GBLemp"))
> plot(gblest[[1]], main = "GBL Estimate")
```



**GBL Estimate** 

Figure 4: GBL Estimates.

## **3** References

Caccetta, P., Collings, S., Devereux, A., Hingee, K., McFarlane, D., Traylen, A., Wu, X., Zhou, Z. (2015) *Monitoring land surface and cover in urban and peri-urban environments using digital aerial photography.* International Journal of Digital Earth, 1-19.

Hingee, K.L. (2019) Spatial Statistics of Random Closed Sets for Earth Observations. PhD: Perth, Western Australia: University of Western Australia. Submitted.

Hingee K, Baddeley A, Caccetta P, Nair G (2019). Computation of lacunarity from covariance of spatial binary maps. *Journal of Agricultural, Biological and Environmental Statistics*, 24, 264-288. DOI: 10.1007/s13253-019-00351-9.

Picka, J.D. (2000) Variance reducing modifications for estimators of standardized moments of random sets. *Advances in Applied Probability*, 32, 682-700.