Libraries

```
library(spatstat)
## Loading required package: spatstat.data
## Loading required package: spatstat.geom
## spatstat.geom 3.2-1
## Loading required package: spatstat.random
## spatstat.random 3.1-5
## Loading required package: spatstat.explore
## Loading required package: nlme
## spatstat.explore 3.2-1
## Loading required package: spatstat.model
## Loading required package: rpart
## spatstat.model 3.2-4
## Loading required package: spatstat.linnet
## spatstat.linnet 3.1-1
## spatstat 3.0-6
## For an introduction to spatstat, type 'beginner'
library(reticulate)
library(RColorBrewer)
pd <- import("pandas")</pre>
```

Definition of input Data

```
chains_to_investigate <- list("Chain 1" )
scenario <- 1</pre>
```

Window

```
window = owin(c(0,1000), c(0,1000))
```

Outbreak

Outbreak artificially made to test model:

```
ppp_outbreak <- rescale(ppp_outbreak, 1000, "km")</pre>
```

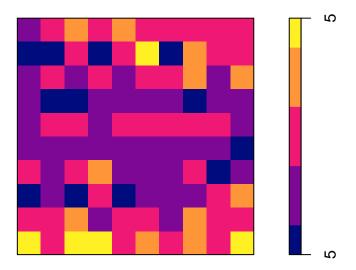
Population Data

plot(im_population)

uniform population of 5 in each cell (500 total)

```
no_of_cells <- 100</pre>
population_per_cell <- 5</pre>
# initialize an empty data.frame
df_population <- data.frame("population" = numeric(), "x_centroid" = numeric(), "y_centroid" = numeric()</pre>
# set values
y <- -50
x <- 50
for (i in 1:no_of_cells) {
  if (i %% 10 == 1) {
    y <- y + 100
    x <- 50
  df_population[i, "y_centroid"] <- y</pre>
  df_population[i, "x_centroid"] <- x</pre>
 x < -x + 100
df_population$population <- rep(population_per_cell, nrow(df_population))</pre>
ppp_population \leftarrow ppp(x = df_population$x_centroid, y = df_population$y_centroid, window = window, mark
ppp_population <- rescale(ppp_population, 1000, "km")</pre>
smo_population <- density(ppp_population, eps = 0.1, positive = TRUE, weights = marks(ppp_population))</pre>
im_population <- smo_population</pre>
im_population <- eval.im(im_population / 100)</pre>
im_population <- eval.im(pmax(im_population, 1e-10))</pre>
```

im_population



Quadrature Scheme

```
Q <- quadscheme(ppp_outbreak, eps = 0.1)
```

Null Model

```
fit0 <- ppm(Q ~ offset(log(im_population)))
print(fit0)

## Nonstationary Poisson process
## Fitted to point pattern dataset 'Q'

##

## Log intensity: ~offset(log(im_population))
##

## Fitted trend coefficient: (Intercept) = 0.6931472

##

## Estimate S.E. CI95.lo CI95.hi Ztest Zval
## (Intercept) 0.6931472 0.3162278 0.07335215 1.312942 * 2.191924</pre>
```

 $\lambda_0(u) = e^{-3.912}Z(u) = 0.02Z(u)$

Shops Data

x_coord <- c(112, 823, 888, 105, 487) y_coord <- c(198, 112, 846, 855, 537)

ppp shops <- rescale(ppp shops, 1000, "km")

Chain <- rep("Chain 1", 5)

```
ID <- 1:length(x_coord)
df_shops <- data.frame(
    ID = ID,
    x_coord = x_coord,
    y_coord = y_coord,
    Chain = Chain,
    Gitter_ID = character(length(x_coord))
)
shops <- df_shops
ppp_shops <- ppp(x = shops$x_coord, y = shops$y_coord, window = window, marks = as.factor(shops$Chain))</pre>
```

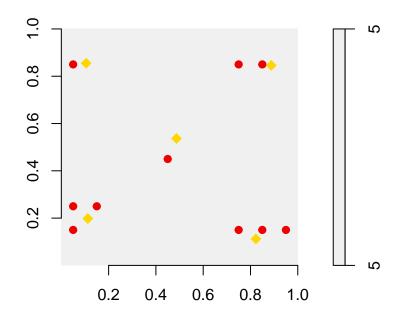
Alternative Model

```
for (chain in chains_to_investigate) {
 #for (chain in levels(ppp_shops$marks)){
 print(chain)
 # Alternative Model
 ppp_chosen <- subset(ppp_shops, marks == chain, drop = TRUE)</pre>
 ppp_chosen <- unmark(ppp_chosen)</pre>
 # plot
   X <- layered(im_population, unmark(subset(ppp_shops, marks != chain, drop = TRUE)),ppp_chosen,ppp_o
 layerplotargs(X)[[2]] \leftarrow list(pch = 18, cex = 0.8, col = "#386f9c")
 layerplotargs(X)[[3]] <- list(pch = 18, cex = 1.5, col = "gold")</pre>
 layerplotargs(X)[[4]] <- list(pch = 20, col = "red2", cex = 1.5)</pre>
 plot(X, main = "Potential sources and cases", axes = TRUE, xlim = c(0, 1), ylim = c(0, 1))
 ls_all_raisins = list()
 for (i in 1:ppp_chosen$n) {
   ls_all_raisins[i] = paste0("log((1 + abs(alpha) * (exp(-(abs(beta)) * ((x- ",ppp_chosen$x[i],")^2]))))) + ((x- ",ppp_chosen$x[i],")^2]
 str_all_raisins <- paste(ls_all_raisins, collapse = "+")</pre>
 eval(parse(text = paste('raisin_func <- function(x, y, alpha, beta) {(', str_all_raisins, ')}', sep
 fit1 <- ippm(Q ~ offset(log(im_population) + raisin_func),</pre>
              start = list(alpha = 1, beta = 1), nlm.args = list(stepmax = 1), gcontrol = glm.control()
 print(paste("Alternative Model for ", chain))
 print(fit1)
 print(paste("Anova for ", chain))
```

```
print(anova(fit0, fit1, test = "LRT"))
}
```

[1] "Chain 1"

Potential sources and cases



```
## [1] "Alternative Model for Chain 1"
## Nonstationary Poisson process
## Fitted to point pattern dataset 'Q'
## Log intensity: ~offset(log(im_population) + raisin_func)
## Fitted trend coefficient: (Intercept) = 0.6560832
## Irregular parameters (covfunargs) fitted by 'ippm':
## alpha = -0.007440344
## beta = -3.473749e-07
                Estimate
                              S.E.
                                      CI95.lo CI95.hi Ztest
## (Intercept) 0.6560832 0.3162278 0.03628815 1.275878
## [1] "Anova for Chain 1"
## Analysis of Deviance Table
## Model 1: ~offset(log(im_population))
## Model 2: ~offset(log(im_population) + raisin_func)
    Npar Df
               Deviance Pr(>Chi)
## 1
       1
```