

# A Geostatistical Analysis of Water Losses in an Urban Utility using the R and Tinn-R Open-Source Statistical Computing Environments

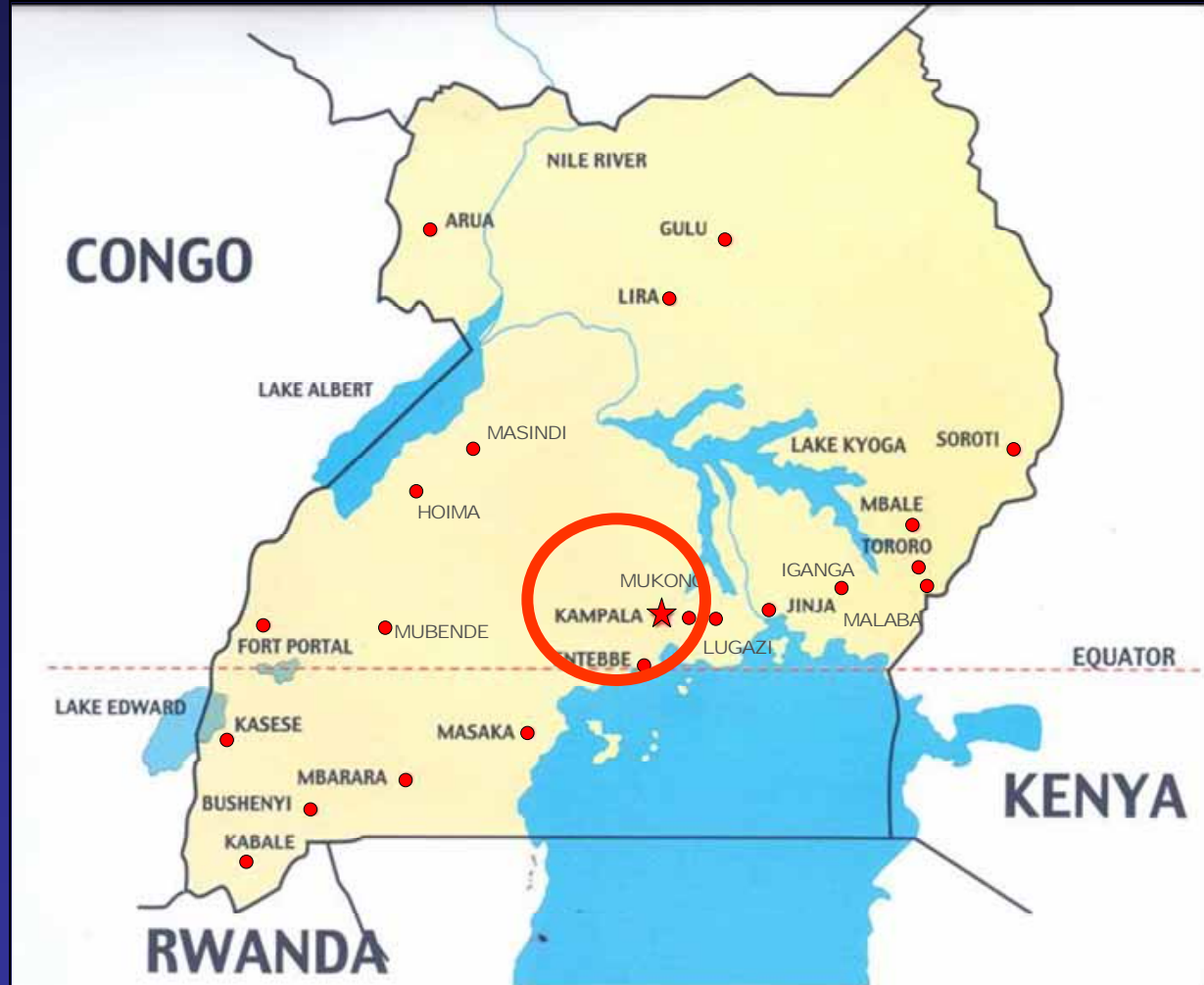
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<sup>a</sup>Royal Institute of Technology (KTH), Sweden

<sup>b</sup>Makerere University, Uganda



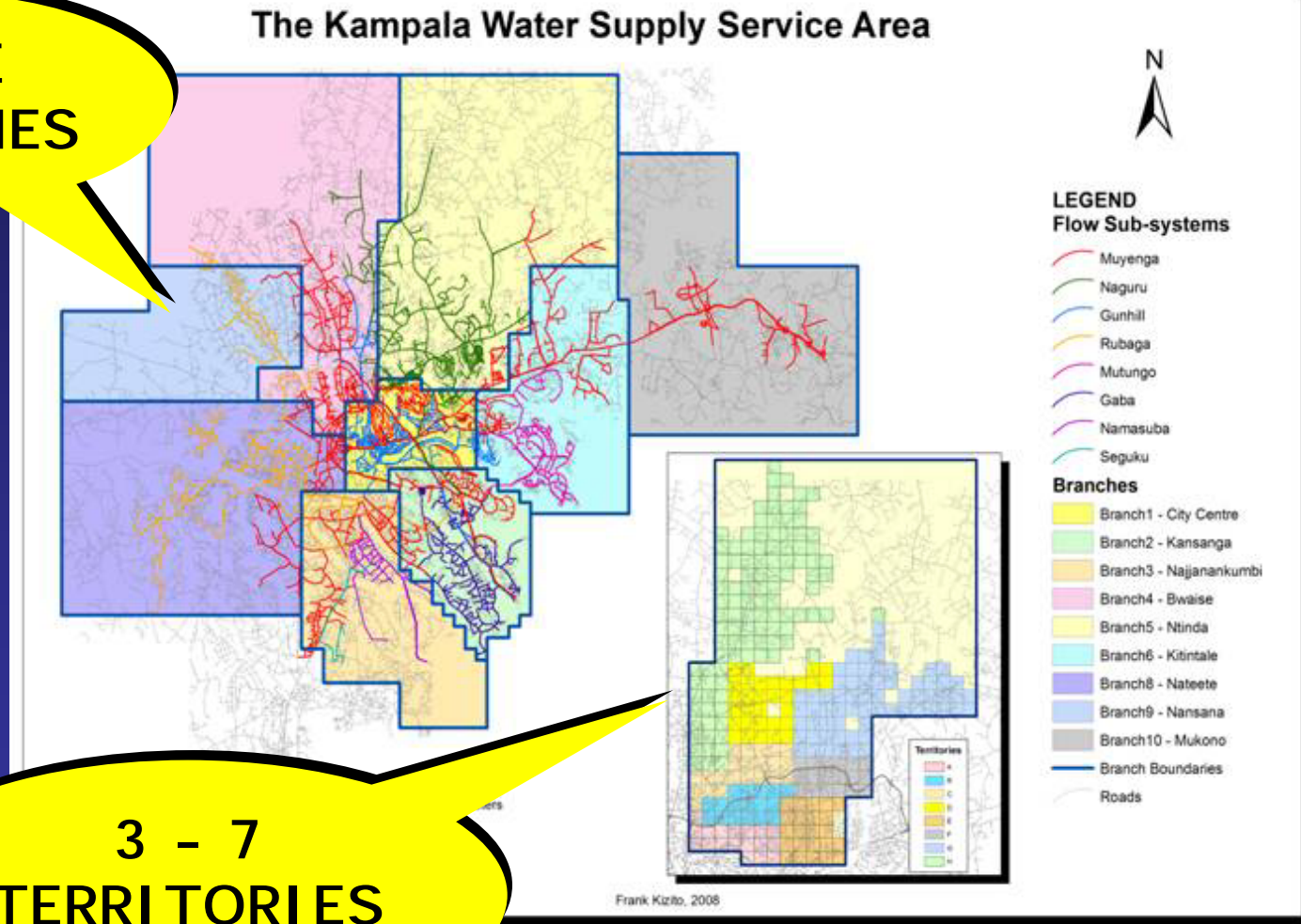
# THE STUDY AREA:



# THE STUDY AREA:

**NINE  
BRANCHES**

**3 - 7  
TERRITORIES  
PER BRANCH**

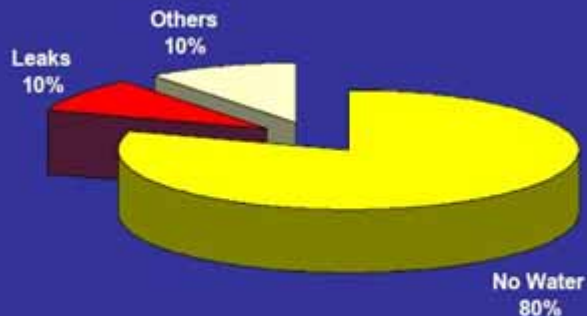
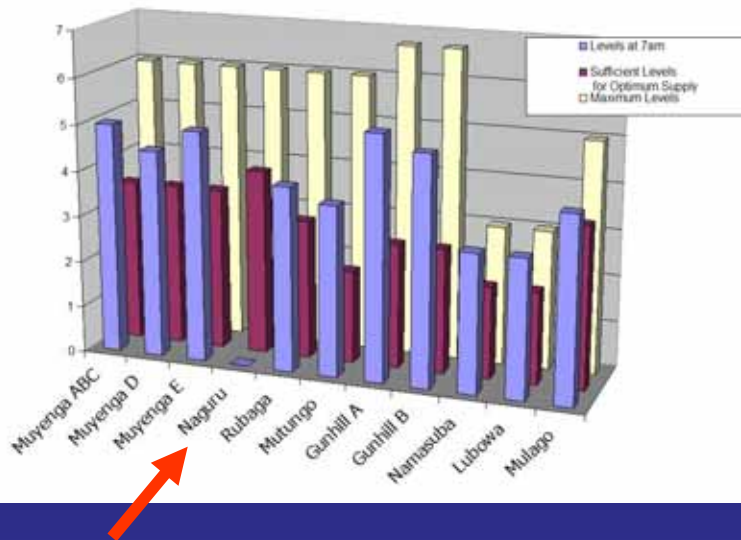




# PROBLEM ISSUES:

## RESERVOIR LEVELS FOR 2-05-2007

(Conversion factor of 1m=3.3ft used for Gunhill Levels)



## Problem 1: Water Supply Intermittence

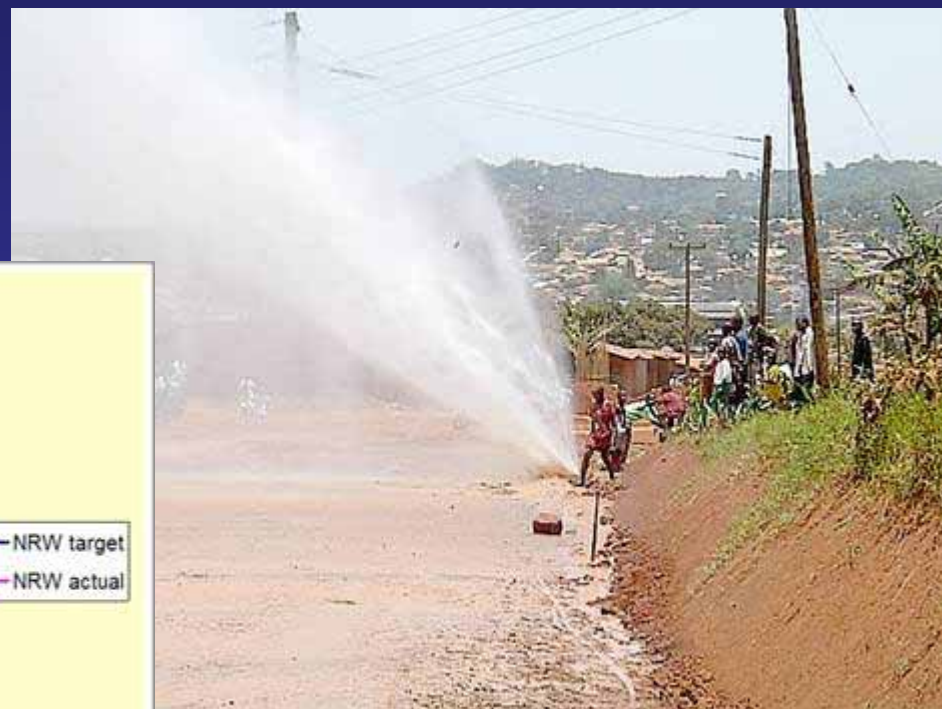


HAPHAZARD PIPE INFRASTRUCTURE  
(Photo: KW Archives)

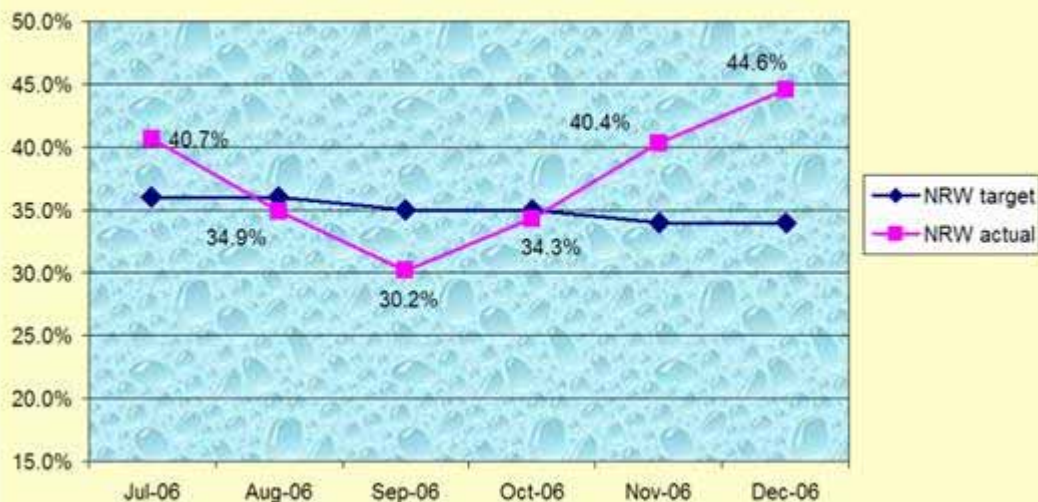
# PROBLEM ISSUES:

## Problem 2: High Non-Revenue Water (NRW) levels

SYSTEM INPUT VOLUME	Authorised Consumption	Billed Authorised Consumption	Billed Metered Consumption	REVENUE WATER
			Billed Unmetered Consumption	
		Unbilled Authorised Consumption	Unbilled Metered Consumption	NON-REVENUE WATER
			Unbilled Unmetered Consumption	
	Water Losses	Apparent (Commercial) Losses	Unauthorised use (Theft)	
			Metering Inaccuracies	
		Real (Physical) Losses	Leaks	
			Bursts	



NRW Performance Trends (July-December 2006)

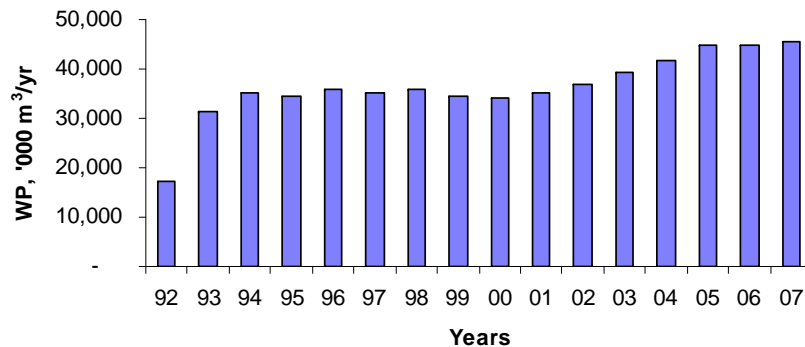


LEAKS AND BURSTS  
(Photo: KW Archives)

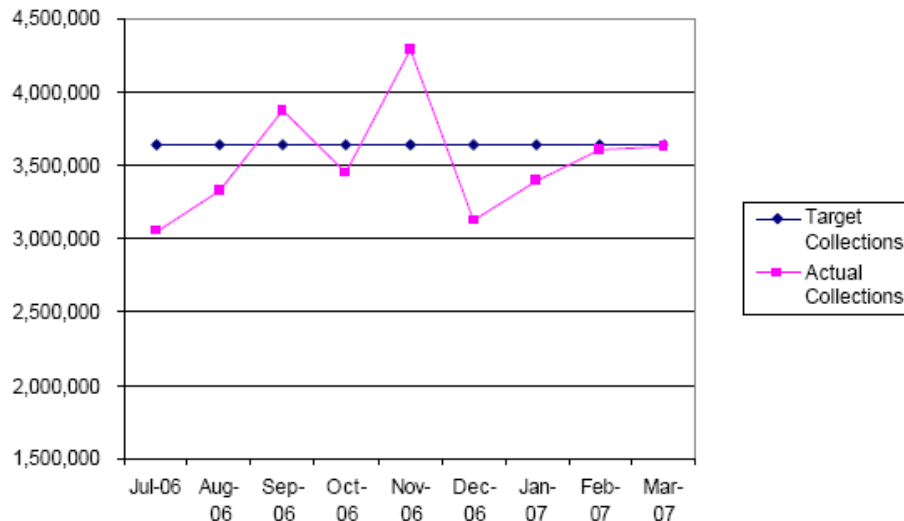
# PROBLEM ISSUES:

## Problem 3: Rising Production Costs vs Stagnant Collections

Ggaba Water Production 1992 -2007



Revenue Collections (Ushs 000' excl VAT)



GABA III WATER WORKS  
(Photo: Roger Thunvik)



**BRANCH 5  
NTINDA**

**ARREARS AND COLLECTIONS STATUS AS AT 26TH FEB 2008**

**TE 00070402.5**

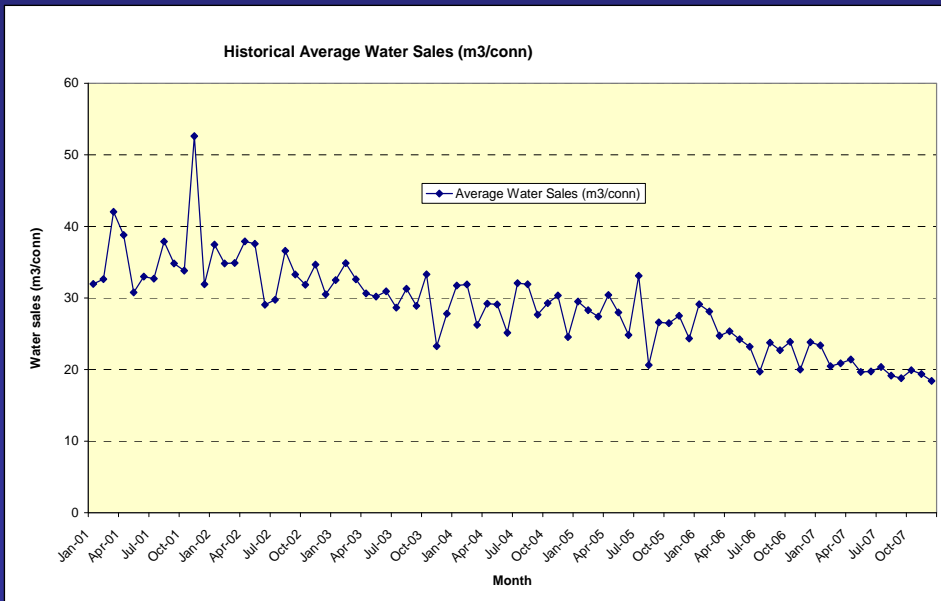
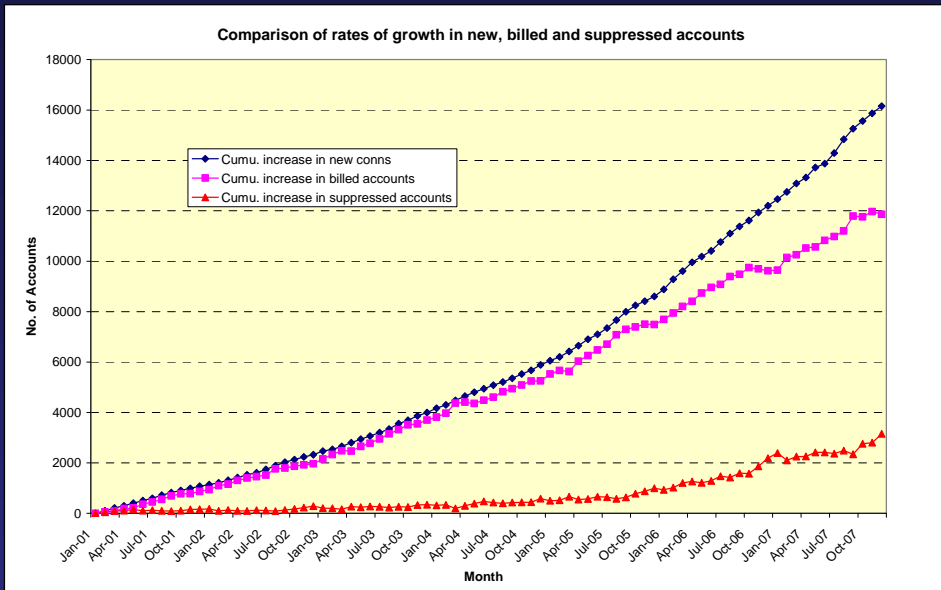
**ARREARS STATUS - 26/02/08 BY REGION**

**COLLECTIONS STATUS - 26/02/08 BY REGION**

04 08 2008

## A TYPICAL BRANCH OFFICE (Photo: KW Archives)

# STUDY OBJECTIVE:



To investigate the possible causes of declining water sales in a selected Branch, using geostatistical analysis.



# TOOLS USED:



R version 2.6.1 (2007-11-26)  
Copyright (C) 2007 The R Foundation for Statistical Computing



**Tinn-R - GUI/Editor for R language and environment**

**Version 1.19.4.7**

<https://sourceforge.net/projects/tinn-r>

<http://www.sciviews.org/Tinn-R>

**Copyright 2001-2008**

**Under the GNU General Public License - GPL**

**R**: A statistical computing environment, developed under the Free Software Foundation's GNU project.

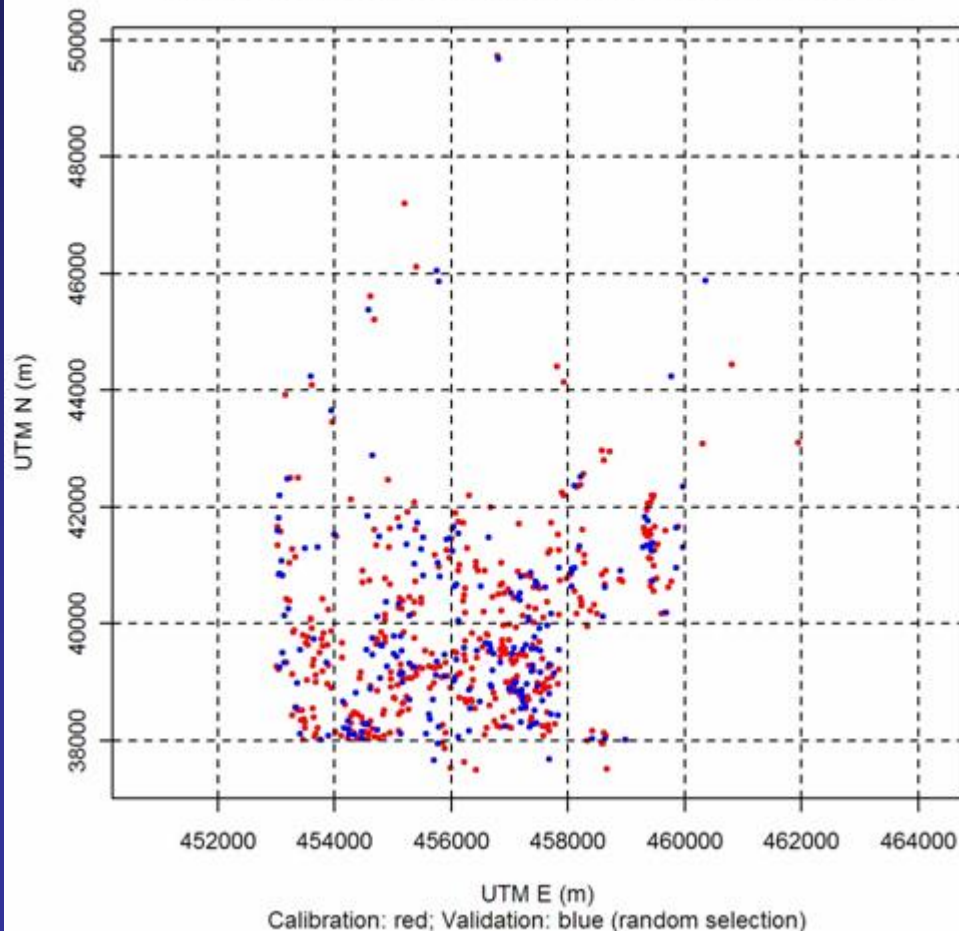
(<http://www.r-project.org/>;  
<http://www.gnu.org/>)

**Tinn R**: A free, simple code editor for R.  
(<http://sourceforge.net/projects/tinn-r/>;  
<http://www.sciviews.org/Tinn-R/>)

# GEOSTATISTICAL ANALYSES:

## (1) Selection of calibration and validation datasets

Spatial distribution of calibration and validation datasets



```
# Random selection of calibration and validation datasets
cal.id <- sample(1:dim(d200312.all@data)[1], 4592)
sort(cal.id)
d200312.cal <- d200312.all[cal.id, ]
str(d200312.cal)
summary(d200312.cal)

d200312.val <-
d200312.all[!is.element(1:dim(d200312.all@data)[1], cal.id),
]
str(d200312.val)
summary(d200312.val)

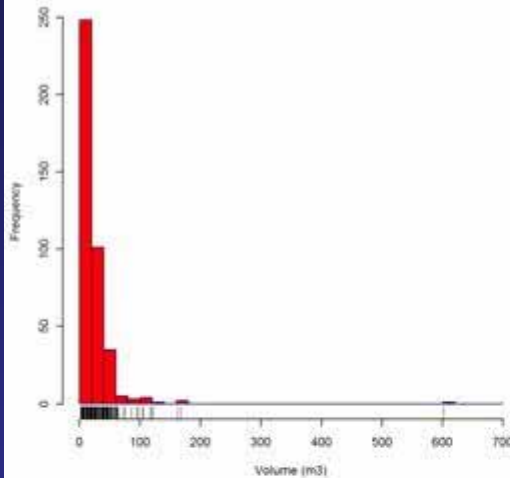
# Save calibration and validation datasets
save(d200312.all, d200312.cal, d200312.val, file =
"Project.RData")

# Spatial distribution of calibration and validation datasets
plot(coordinates(d200312.cal), col = "red", asp = 1, pch =
20, cex = 0.8, xlab = "UTM E (m)", ylab = "UTM N (m)", main =
and validation datasets", sub = selection))
points(coordinates(d200312.val), col = "blue", pch = 20, cex
= 0.8)
grid(lty = 500, col = "black")
```

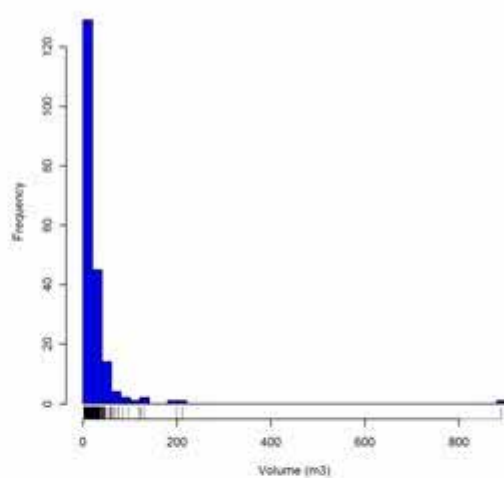
# GEOSTATISTICAL ANALYSES:

## (2) Exploratory Data Analysis

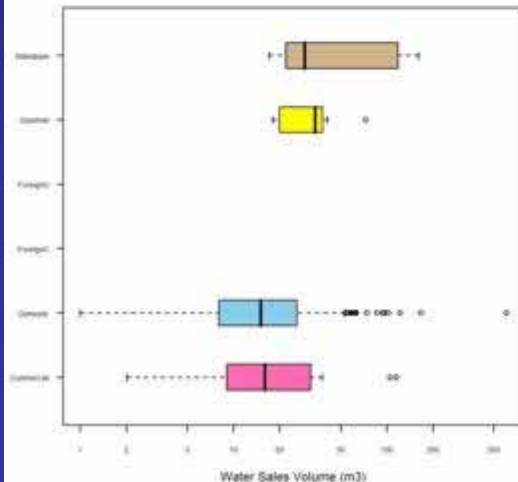
Histogram of Monthly Water Sales Volumes (Calibration Dataset)



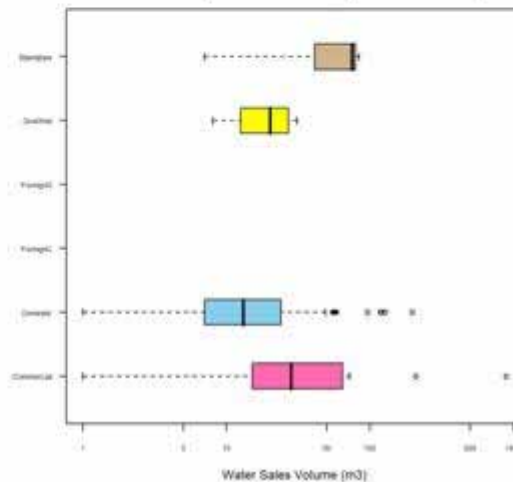
Histogram of Monthly Water Sales Volumes (Validation Dataset)



Classified Boxplot of Water Sales (calibration dataset)



Classified Boxplot of Water Sales (validation dataset)



*# Univariate exploratory graphics*

*#(a) Histograms*

```
hist(d200312.cal$V200312, breaks = seq(0,
700, by = 20), col = "red", border = "darkblue",
main = "Dataset", xlab = "Volume (m3)")
```

```
rug(d200312.cal$V200312)
```

```
hist(d200312.val$V200312, breaks = seq(0,
900, by = 20), col = "blue", border = "black",
main = "Histogram of Monthly Water Sales
Volumes (Validation Dataset)", xlab = "Volume
(m3)")
```

```
rug(d200312.val$V200312)
```

*#(b) Classified Boxplot*

```
par(las=1)
```

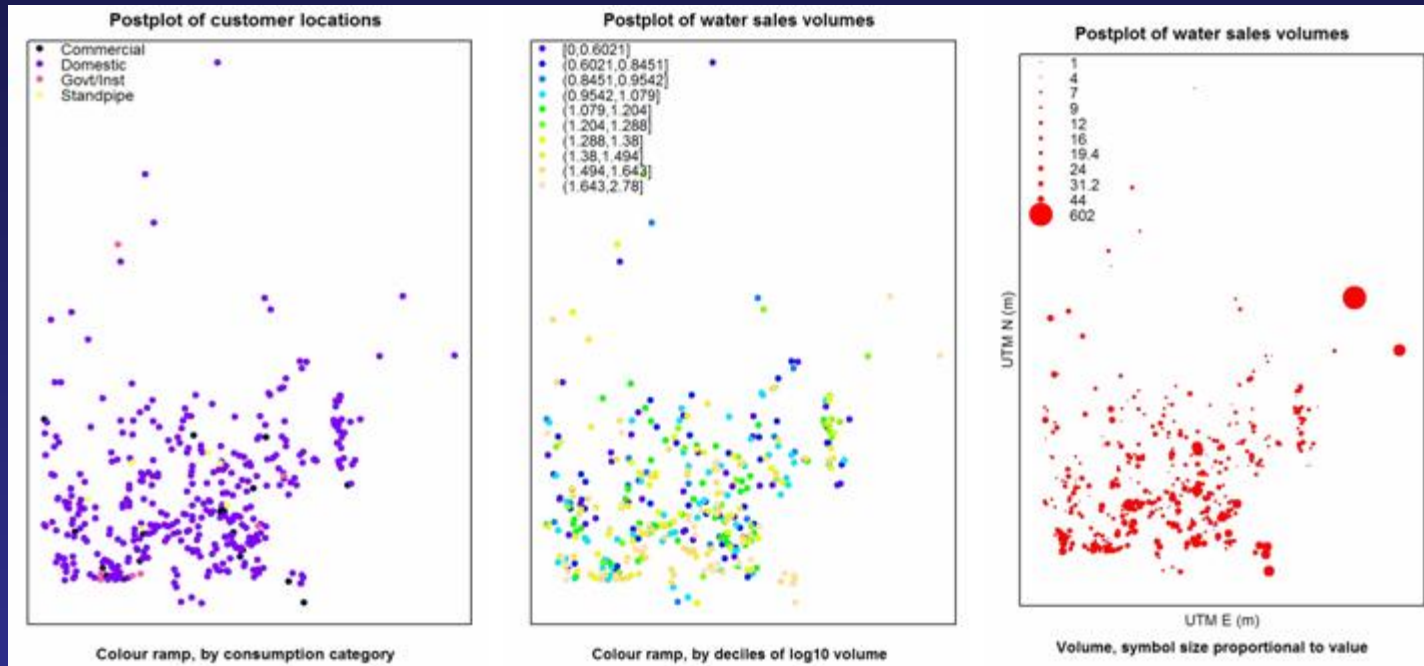
```
par(cex.axis=0.6)
```

```
boxplot(d200312.cal$V200312 ~
d200312.cal$CCat, horizontal = T, outline = T,
log="x", pars = list(boxwex = 0.4, staplewex =
0.3, outwex = 0.3), col = c("hotpink", "skyblue",
"azure", "turquoise", "yellow", "tan"), main =
"Classified Boxplot of Water Sales (calibration
dataset)", xlab = "Volume (m3)",)
```



# GEOSTATISTICAL ANALYSES:

## (3) Investigation of spatial structure



*# Postplot of consumption categories*

```
print(spplot(d200312.cal, z = "CCat", col.regions = bpy.colors(6), main = "Postplot of customer locations", sub = "Colour ramp, by consumption category", key.space = "inside", cex = 0.8))
```

*# Postplots of water sales values*

*#(a) Colour ramp, by deciles of log10 volume*

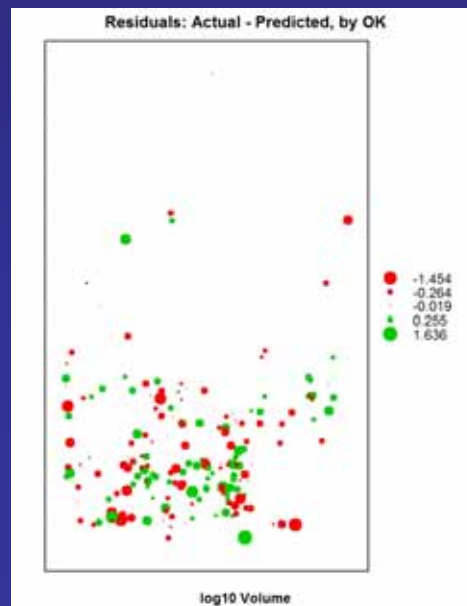
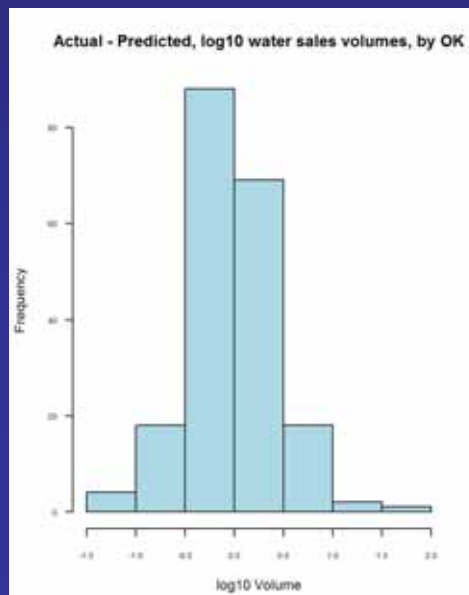
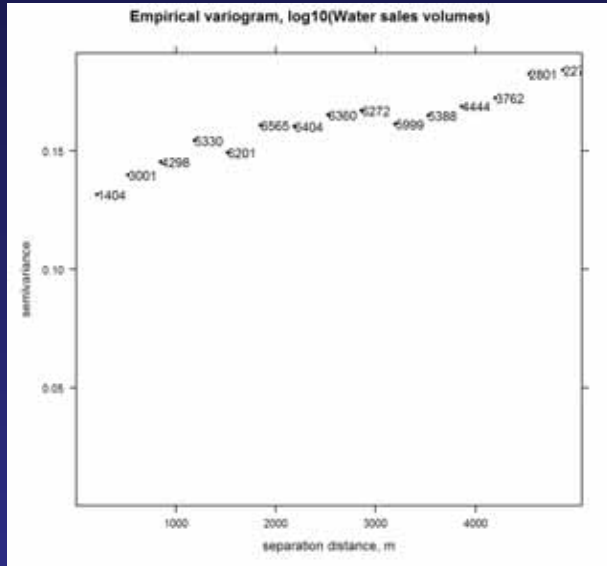
```
print(spplot(d200312.cal, z = "log10V200312", col.regions = topo.colors(64), main = "Postplot of water sales volumes", sub = "log10 volume", key.space = "inside", cuts = quantile(d200312.cal$log10V200312, seq(0, 1, by = 0.1)), cex = 0.8))
```

*#(b) Symbol size representing log10 volume*

```
print(bubble(d200312.cal, "V200312", main = "Postplot of water sales volumes", sub = "Volume, symbol size proportional to value", col = "red", scales = list(draw = TRUE), xlab = "UTM E (m)", ylab = "UTM N (m)", fill = T, aspect = "iso", do.sqrt = T, key.entries = quantile(d200312.cal$V200312, seq(0, 1, by = 0.1))))
```

# GEOSTATISTICAL (4) Variogram modelling

## ANALYSES:



*# Empirical variogram of logarithm of water sales volumes*

```
v <- variogram(log10(V200312) ~ 1, loc = d200312.cal)
```

```
print(v)
```

```
print(plot(v, plot.numbers = T, main = "Empirical variogram, log10(Water sales volumes)", xlab = "separation distance, m", col = "darkblue", pch = 20))
```

*# Fitting variogram model*

```
vm <- vgm(0.04, "Sph", 1200, 0.13)
```

```
vmf <- fit.variogram(v, vm)
```

```
(vm <- vgm(0.005, "Sph", 5000, add.to = vmf))
```

```
(vmf2 <- fit.variogram(v, vm))
```

*# Model validation using validation dataset*

*#(a) Add log10 volume field to validation dataset*

```
d200312.val$log10V200312 <- log10(d200312.val$V200312)
```

*#(b) Predict log10 water sales volumes at validation points*

```
k.val <- krige(log10(V200312) ~ 1, loc = d200312.cal, newdata = d200312.val, model = vmf2)
```

```
summary(k.val)
```

*#(c) Compare predictions to actual values*

```
resid <- d200312.val$log10V200312 - k.val$var1.pred
```

```
summary(resid)
```

```
hist(resid, main = "Actual - Predicted, log10 water sales volumes, by OK", xlab = "log10 Volume", col = "lightblue")
```

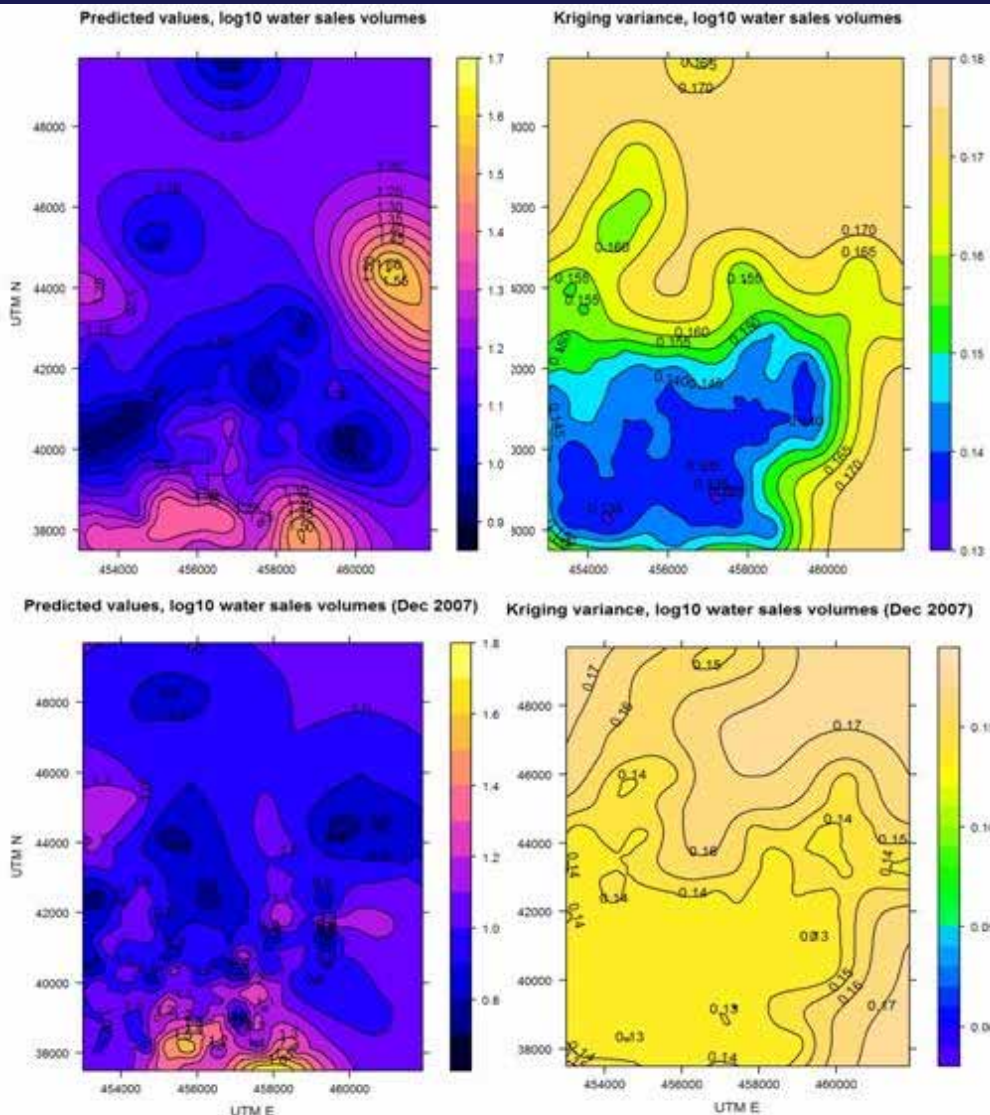
```
resid <- as.data.frame(resid)
```

```
coordinates(resid) <- coordinates(d200312.val)
```

```
bubble(resid, maxsize= 2, main = "Residuals: Actual - Predicted, by OK", sub = "log10 Volume")
```

# GEOSTATISTICAL ANALYSES:

## (5) Water sales kriging predictions



*# Raster map of predictions*

*#(a) Selection of grid spacing*

```
vc <- variogram(log10(V200312) ~ 1, loc = d200312.cal, cloud = T)
```

```
str(vc)
```

```
min(vc$dist)
```

```
(min.x <- floor(bbox(d200312.cal)["XCoord", "min"] - 10))
```

```
(min.y <- floor(bbox(d200312.cal)["YCoord", "min"] - 10))
```

```
(max.x <- ceiling(bbox(d200312.cal)["XCoord", "max"] + 10))
```

```
(max.y <- ceiling(bbox(d200312.cal)["YCoord", "max"] + 10))
```

```
(cells.x <- (max.x - min.x)/50)
```

```
(cells.y <- (max.y - min.y)/50)
```

```
cells.x * cells.y
```

*#(b) Creation of grid*

```
d200312.grid <- SpatialGrid(GridTopology(c(min.x + 25, min.y + 25), c(50, 50),
```

```
c(cells.x, cells.y)))
```

```
str(d200312.grid)
```

```
d200312.grid <- SpatialPoints(d200312.grid)
```

```
gridded(d200312.grid) <- T
```

```
str(d200312.grid)
```

*#(c) Prediction on grid*

```
k.grid <- krige(log10(V200312) ~ 1, loc = d200312.cal, newdata = d200312.grid, model = vmf2)
```

```
summary(k.grid)
```

*#(d) Plotting gridded predictions*

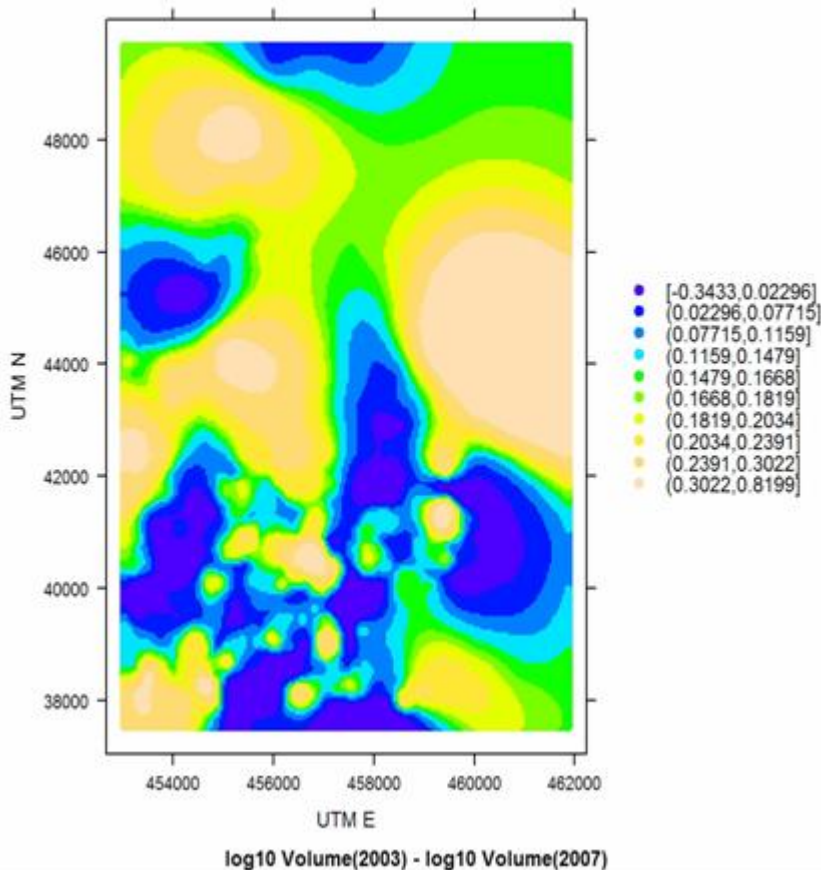
```
print(spplot(k.grid, zcol = "var1.pred", pretty = T, contour = T, col.regions = bpy.colors(64), main = "Predicted values, log10 water sales volumes", xlab = "UTM E", ylab = "UTM N", scales = list(draw = T)))
```



# GEOSTATISTICAL ANALYSES:

## (6) Difference map, highlighting areas with declining water sales

Difference in log10 water sales volumes, 2003 and 2007



*# Compare 2003 predicted values and 2007 predicted values and generate a difference map*

```
str(k.grid)
```

```
str(kComp.grid)
```

```
diff <- (k.grid@data$var1.pred - kComp.grid@data$var1.pred)
```

```
str(diff)
```

```
diff <- as.data.frame(diff)
```

```
str(diff)
```

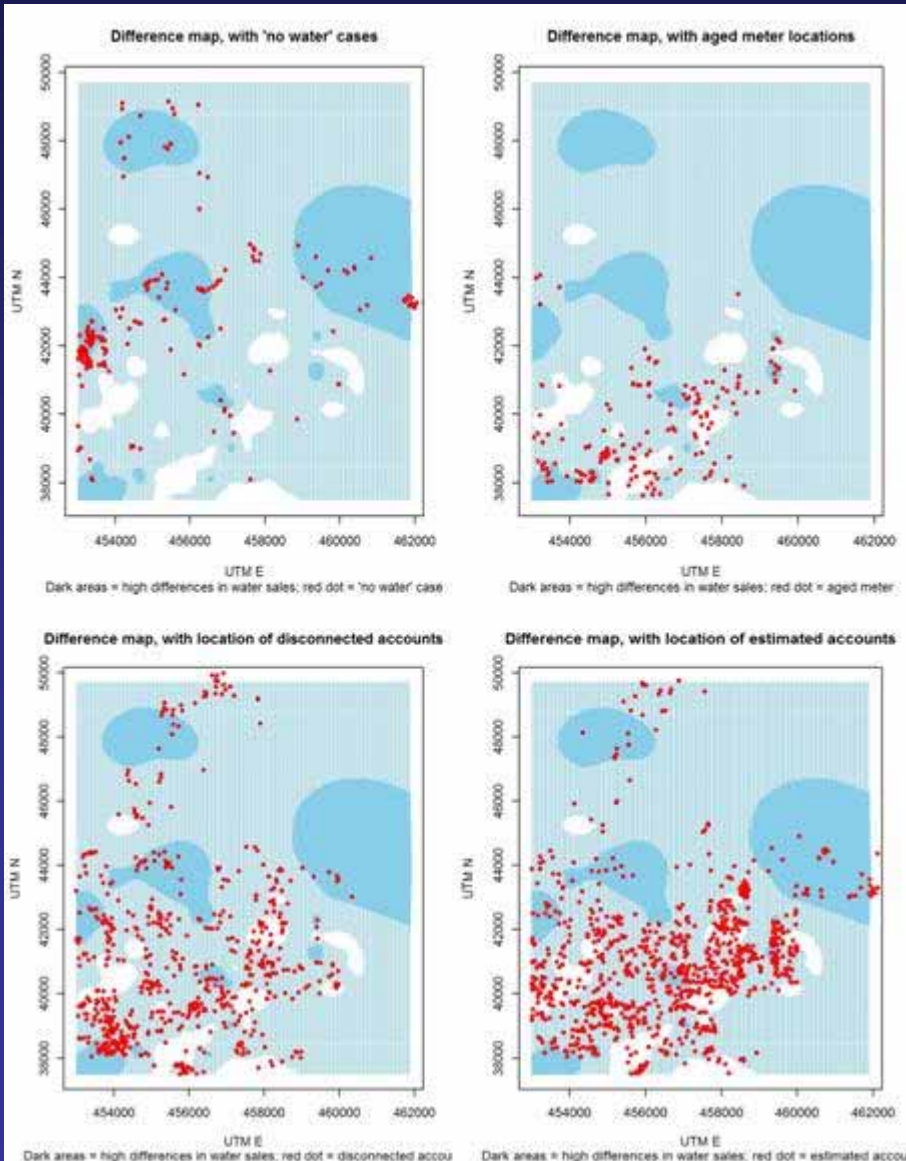
```
coordinates(diff) <- coordinates(d200312.grid)
```

```
str(diff)
```

```
print(spplot(diff, zcol = "diff", cuts = quantile(diff$diff, seq(0, 1, by = 0.1)), pretty = T, contour = T, col.regions = topo.colors(64), main = "Difference in log10 water sales volumes, 2003 and 2007", sub = log10Volume(2003) - log10 Volume(2007)", xlab = "UTM E", ylab = "UTM N", scales = list(draw = T), key.space = "right"))
```

# GEOSTATISTICAL (7) Overlays of reported field anomalies

## ANALYSES:



### # Load datasets of anomalies

```
NoWater <- read.table("NoWater.dat", header = T)
coordinates(NoWater) <- c("XCoord", "YCoord")
AgedMeter <- read.table("AgedMeter.dat", header = T)
coordinates(AgedMeter) <- c("XCoord", "YCoord")
Disconnected <- read.table("Disconnected.dat", header = T)
coordinates(Disconnected) <- c("XCoord", "YCoord")
Estimated <- read.table("Estimated.dat", header = T)
coordinates(Estimated) <- c("XCoord", "YCoord")
```

### # Postplots of anomalies, superimposed on difference map

#### #(a) No water cases

```
plot(coordinates(diff), cex = 1.5*(diff$diff)/max(diff$diff), pch = 20, col = "skyblue", main = "Difference map, with 'no water' cases", sub = high differences in water sales; red dot = 'no water' case", xlab = "UTM E", ylab = "UTM N")
```

```
points(coordinates(NoWater), col = "red", pch = 20, cex = 1.3)
```

#### #(b) Aged meters

```
plot(coordinates(diff), cex = 1.5*(diff$diff)/max(diff$diff), pch = 20, col = "skyblue", main = "Difference map, with aged meter locations", sub = areas = high differences in water sales; red dot = aged meter", xlab = "UTM E", ylab = "UTM N")
```

```
points(coordinates(AgedMeter), col = "red", pch = 20, cex = 1.3)
```

# RESULTS AND CONCLUSIONS:

- ▶ Out of eight factors investigated, “intermittent supply” cases correlated most with areas of declining water sales.
- ▶ Aged meters were also seen to have a contributing effect to low water sales.
- ▶ Disconnected and inactive accounts were numerous and widespread throughout the study area.
- ▶ Leaks and illegal cases seemed to have been too few to impact significantly on water sales.



# ACKNOWLEDGMENTS

This study was carried out within the framework of the Sida/SAREC-funded project:

“Sustainable Technological Development in the Lake Victoria Basin”





Thank You!

Asanteni!

TACK!!

