# Spatial and spatio-temporal data in 

ifgi<br>Institute for Geoinformatics<br>University of Münster

Edzer Pebesma

DailyMeteo, Belgrade, 24-27 Jun 2014 http://ifgi.uni-muenster.de/~ ${ }^{\text {epebe_01/R/ }}$

## Overview

1. vector, matrix, array; lists, data.frame
2. selection on data.frame
3. spatial classes
4. selection on spatial objects
5. aggregation, in general
6. aggregation on spatial classes
7. spatio-temporal classes
8. selection, overlay, aggregation on spatio-temporal objects

## All data are spatio-temporal

1. There are no pure-spatial data. Maps reflect either

- a snapshot in time (remote sensing image)
- an aggregate over a time period (e.g., interpolated yearly average temperature, or yearly aggregated daily interpolations)
- something that is constant over a period of time (political boundary)
- a seemingly non-changing phenomenon (geology)

2. There are no pure-temporal data. Time series reflect either

- spatially aggregated values (global temperature curves)
- a single spatial location (air quality sensor DEUB032, at 8.191934E,50.93033N)
- vaguely located, or universal aggregates (world market prices, stock quotes)


## Vector, matrix, array

```
> a = vector(3, mode = "numeric")
> a
[1] 000
> length (a)
[1] 3
or simply by initialisation
\(>c=1: 3\)
> c
[1] 123
> typeof (c)
[1] "integer"
\(>d=1.5: 3.5\)
>d
[1] 1.52 .53 .5
> typeof (c)
```

> m = matrix(rnorm(6), 2, 3)

```
> m = matrix(rnorm(6), 2, 3)
> print(m, digits=3)
```

```
> print(m, digits=3)
```

```
\begin{tabular}{lrrr} 
& {\([, 1]\)} & {\([, 2]\)} & {\([, 3]\)} \\
{\([1]\),} & 0.415 & 0.735 & -0.171 \\
[2,] & -1.115 & -0.540 & -1.029 \\
\(>\) & \(\operatorname{dim}(m)\)
\end{tabular}
[1] 23
\(>a=\operatorname{array}(1:(5 * 7 * 9), c(5,7,9))\)
> dim(a)
[1] 579
```

[1] 1.52 .53 .5
> typeof (c)

```

\section*{lists, data.frame}

Lists can contain anything:
```

> a = list(1:3, x = c("foo", "bar"), c(TRUE, FALSE))
> a
[[1]]
[1] 1 2 3
\$x
[1] "foo" "bar"
[[3]]
[1] TRUE FALSE
> a[1]
[[1]]
[1] 1 2 3
> a[[1]]
data.frame is a column store, but mimics records of mixed type
> $a[[1]]=1: 2$
$>b=$ as.data.frame(a)
> names(b) = c("NR", "what", "cond")
> b

```
    NR what cond
```

    NR what cond
    1 1 foo TRUE
1 1 foo TRUE
2 2 bar FALSE
2 2 bar FALSE
> is.list(b)
> is.list(b)
[1] TRUE

```
```

[1] TRUE

```
```

[1] 123
> $\mathrm{a} \$ \mathrm{x}$

## Selection on data.frame

| > b |
| :---: |
| NR what cond |
| 11 foo TRUE |
| 22 bar FALSE |
| > $\mathrm{b}[[1]]$ |
| [1] 12 |
| > b [ ["NR"]] |
| [1] 12 |
| > $\mathrm{b} \$ \mathrm{NR}$ |
| [1] 12 |
| > b[1] |
| NR |
| 11 |
| 22 |

$$
\begin{aligned}
& >b[1,] \\
& \text { NR what cond } \\
& 11 \text { foo TRUE } \\
& \text { > } \mathrm{b}[, 1: 2] \\
& \text { NR what } \\
& 11 \text { foo } \\
& 22 \text { bar } \\
& \text { > } \mathrm{b}[, 1] \\
& \text { [1] } 12 \\
& \text { > b[,1,drop=FALSE] } \\
& \text { NR } \\
& 11 \\
& 22
\end{aligned}
$$

## Deletion, negative selection, replacement

```
> b\$cond2 = ! b\$cond
> b
```

    what cond cond2
    1 foo TRUE FALSE
2 bar FALSE TRUE
$>b[1,1]=N A$
$>b$
what cond cond2
1 <NA> TRUE FALSE
2 bar FALSE TRUE
> class (b\$what)
[1] "factor"
> b\$what
[1] <NA> bar
Levels: bar foo
> as.numeric(b\$what)

## Spatial classes (sp)

Class Spatial provides a coordinate reference system and a bounding box.

- Objects deriving from Spatial consist of a geometry:
- SpatialPoints
- SpatialLines
- SpatialPolygons
- SpatialPixels
- SpatialGrid
- from these, Spatial*DataFrame objects derive, and have attributes (a data slot, of class data.frame)
> library(sp)
> library(rgdal)
> p = SpatialPoints(cbind(lon = 8, lat = 52), CRS("+init=epsg:4326"))
$>p$
SpatialPoints:
lon lat
[1,] 852
Coordinate Reference System (CRS) arguments: +init=epsg:4326
+proj=longlat +datum=WGS84 +no_defs +ellps=WGS84
+towgs $84=0,0,0$


## Meuse data set

```
> library(sp)
> data("meuse")
> coordinates(meuse) <- ~x+y
> spplot(meuse["zinc"],
+ col.regions = bpy.colors())
```



## Getting spatial data in $R$

Usually, we don't create spatial objects from scratch, but from external files (readGDAL, readOGR), or from data.frame objects:
> library(sp)
> data(meuse)
> class(meuse)
[1] "data.frame"
> dim(meuse)
[1] 15514
> names(meuse) [1:6]
[1] "x" "y" "cadmium" "copper" "lead" "zinc"
> coordinates(meuse) $=c(" x ", ~ " y ")$
> \# which is short for:
> data(meuse)
> pts = SpatialPoints(meuse[c("x", "y")])
> m = SpatialPointsDataFrame(pts, meuse)
> class(m)
[1] "SpatialPointsDataFrame" attr(,"package")
[1] "sp"

## Selection on spatial objects

Selecting the data.frame metaphor:

- selection of records (features), attributes (columns):
> meuse $[1: 3,1: 6]$

|  | x | y cadmium | copper | lead | zinc |  |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| 1 | 181072 | 333611 | 11.7 | 85 | 299 | 1022 |
| 2 | 181025 | 333558 | 8.6 | 81 | 277 | 1141 |
| 3 | 181165 | 333537 | 6.5 | 68 | 199 | 640 |

- extraction of variables:
> meuse\$zinc[1:3]
[1] 10221141640
- replacement:

```
> meuse\$zinc[1:2] = NA
> meuse[1:3,1:6]
```

|  | x | $y$ | cadmium | copper | lead | zinc |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| 1 | 181072 | 333611 | 11.7 | 85 | 299 | NA |
| 2 | 181025 | 333558 | 8.6 | 81 | 277 | NA |
| 3 | 181165 | 333537 | 6.5 | 68 | 199 | 640 |

## Aggregation, in general

```
\(>d=\) data.frame \((x=1: 6, \operatorname{grp} 1=c(\operatorname{rep}(" A ", 3), \operatorname{rep}(" B ", 3)))\)
> d\$grp2 = \(\operatorname{rep}(c(" P ", " Q ", " R ")\), each \(=2)\)
\(>d\)
```

|  | x | $\operatorname{grp} 1$ | $\operatorname{grp} 2$ |
| ---: | ---: | ---: | ---: |
| 1 | 1 | A | P |
| 2 | 2 | A | P |
| 3 | 3 | A | Q |
| 4 | 4 | B | Q |
| 5 | 5 | B | R |
| 6 | 6 | B | R |

> aggregate(d[1], list(d\$grp1), mean)

|  | Group. 1 |
| :---: | ---: |
| 1 | x |
| 1 | A |
| 2 | B |
| 2 |  |

$>$ aggregate(d[1], list(d\$grp1, d\$grp2), mean)
Group. 1 Group. 2 x

| 1 | A | P | 1.5 |
| :--- | :--- | :--- | :--- |
| 2 | A | Q | 3.0 |
| 3 | B | Q | 4.0 |
| 4 | B | R | 5.5 |

## Aggregation, needs:

\#\# S3 method for class 'data.frame'
aggregate(x, by, FUN, ..., simplify = TRUE)

- an object to aggregate (x)
- an aggregation predicate (by)
- an aggregation function (FUN)

NOTE that

- we pass functions as arguments $\rightarrow \mathrm{R}$ is a functional programming language
- we can write our own function, and pass it to FUN
- ... is passed on to this function


## Aggregation of spatial classes

```
> library(sp)
> data("meuse")
> coordinates(meuse) <- ~x+y
> offset = c(178460, 329620)+20
> gt = GridTopology(offset, c(400,400),
+ c(8,11))
> SG = SpatialGrid(gt)
> agg = aggregate(meuse["zinc"], SG)
> spplot(agg["zinc"],
+ col.regions=bpy.colors(),
+ sp.layout = list("sp.points",
+ meuse, col=3))
```



## Aggregating interpolated values

> library(sp)
> data("meuse")
> coordinates (meuse) <- ~x+y
> data("meuse.grid")
> coordinates(meuse.grid) <- ~x+y
> gridded(meuse.grid) <- TRUE
> library (gstat)
$>x=i d w(\log (z i n c) \sim 1$, meuse,

+ meuse.grid, debug.level=0)[1]
> spplot(x[1],col.regions=bpy.colors())



## Aggregating interpolated values, spatially



NOTE: the aggregation predicate (SG) can be of any type: points, lines, polygons, grid.

## Aggregating by attribute value


(NOTE: this is still in $s p$ on $r$-forge, not on CRAN)

## Spatio-temporal classes

Package spacetime tries to combine all cleverness of spatial data in sp, of temporal data in zoo and xts, and then add some. It mainly solves:

- object creation (e.g. from tables, sp and/or xts objects),
- some I/O (RasterStack with time z; TGRASS, PostGIS)
- selection (space, time, attributes)
- aggregation (over space, over time, over space-time)
- plotting


## meteo: precipitation and stations

> library(meteo)
> data(dprec); head(dprec, 2)

|  | staid | time | prec |
| :--- | ---: | ---: | ---: |
| 1 | 2707 | $2011-07-01$ | 0.2 |
| 2 | $67240-99999$ | $2011-07-01$ | 0.0 |

> data(stations); head(stations, 2)

|  | staid | lon | lat | elev_1m | data_source | station_name |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: |
| 9602 | 1 | 14.80 | 56.86667 | 166 | ECA | VAEXJOE |
| 9512 | 10 | 18.05 | 59.35000 | 44 | ECA | STOCKHOLM |

> mtch = match (dprec\$staid, stations\$staid)
> dprec = data.frame(dprec, stations[mtch, c("lon", "lat")])
> head (dprec, 2)

|  | staid | time | prec | lon | lat |
| :--- | ---: | ---: | ---: | ---: | ---: |
| 1 | 2707 | $2011-07-01$ | 0.2 | 7.241389 | 62.24778 |
| 2 | $67240-99999$ | $2011-07-01$ | 0.0 | 7.467000 | 46.30000 |

## meteo: precipitation and stations

```
> library(spacetime)
> m = stConstruct(dprec, c("lon", "lat"), "time")
> #, crs = CRS("+init=epsg:4326"))
> m2 = as(m, "STFDF")
> summary(m2[,,"prec"])
Object of class STFDF
    with Dimensions (s, t, attr): (12923, 31, 1)
[[Spatial:]]
Object of class SpatialPoints
Coordinates:
    min max
lon -179.633 179.75
lat -90.000 83.65
Is projected: NA
proj4string : [NA]
Number of points: 12923
[[Temporal:]]
    Index timeIndex
    Min. :2011-07-01 Min. : 1.0
    1st Qu.:2011-07-08 1st Qu.: 8.5
    Median :2011-07-16 Median :16.0
    Mean :2011-07-16 Mean :16.0
```


## plot: map-panel

```
> data(NLpol) # in meteo!
> proj4string(m2) = proj4string(NLpol)
> m2.NL = m2[NLpol,]
> stplot(m2.NL[,,"prec"],
    col.regions = bpy.colors())
```



## xt: space-time (Hovmöller)



## ts: time series



## time-panel

> proj4string(m2) = proj4string(NLpol)
> m2.NL = m2[NLpol,]
> stplot(m2.NL[120:140, , "prec"],
$+\quad$ mode="tp")

time

## Aggregation on spatio-temporal objects

```
>m2.agg = aggregate(m2.NL[, "prec"],
+ "5 days", sum)
> stplot(m2.agg[,,"prec"],
+ col.regions=bpy.colors())
```



## Aggregation on spatio-temporal objects

m2.aggNL

```
> m2.aggNL = aggregate(m2.NL[, ,"prec"],
+ NLpol, mean, na.rm=TRUE)
> plot(m2.aggNL)
```



