Spatial Data Science with R

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Contents

0.1 Preface

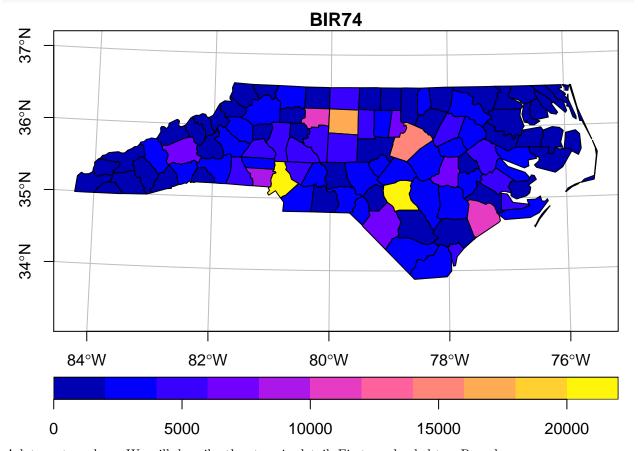
Part I Spatial Data

Hello, world!

0.2 Hello, world!

Let's create a map:

```
library(tidyverse)
#> -- Attaching packages
                                                      ---- tidyverse 1.2.1 --
                            √ purrr
#> √ ggplot2 2.2.1.9000
                                     0.2.4
#> √ tibble 1.4.2
                            √ dplyr 0.7.4
#> √ tidyr 0.8.0
                            √ stringr 1.3.0
#> √ readr 1.1.1
                            √ forcats 0.2.0
#> -- Conflicts -
                                            ----- tidyverse_conflicts() --
#> x dplyr::filter() masks stats::filter()
#> x dplyr::lag()
                    masks stats::lag()
library(sf)
#> Loading required package: methods
#> Linking to GEOS 3.5.1, GDAL 2.2.1, proj.4 4.9.3
system.file("gpkg/nc.gpkg", package="sf") %>%
    read_sf %>%
    st_transform(32119) %>%
    select(BIR74) %>%
    plot(graticule = TRUE, axes = TRUE)
```



A lot went on, here. We will describe the steps in detail. First, we loaded two R packages:

```
library(tidyverse)
library(sf)
```

where tidyverse is needed for the tidyverse functions and methods, and sf is needed for the spatial commands and spatial tidyverse methods. The %>% (pipe) symbols should be read as then:

```
a %>% b %>% c %>% d(n = 10)
```

is simply another way of writing

```
d(c(b(a)), n = 10)
```

or alternatively

```
tmp1 <- b(a)
tmp2 <- c(tmp1)
tmp3 <- d(tmp2, n = 10)</pre>
```

but is easier to read, because we don't have to go from right to left, and we don't have to choose names for intermediate results.

For the illustration we picked a data file that comes with sf, the location of which depends on your operating system:

```
(file <- system.file("gpkg/nc.gpkg", package="sf"))
#> [1] "/home/edzer/R/x86_64-pc-linux-gnu-library/3.4/sf/gpkg/nc.gpkg"
```

Parens around this expression are used to have the result not only stored, but also printed.

Then, we read this file into R using read_sf:

```
(nc <- read_sf(file))</pre>
#> Simple feature collection with 100 features and 14 fields
#> geometry type: MULTIPOLYGON
#> dimension:
                   XY
#> bbox:
                   xmin: -84.3 ymin: 33.9 xmax: -75.5 ymax: 36.6
#> epsq (SRID):
                   4267
#> proj4string:
                   +proj=longlat +datum=NAD27 +no_defs
#> # A tibble: 100 x 15
#>
      AREA PERIMETER CNTY_ CNTY_ID NAME
                                             FIPS FIPSNO CRESS_ID BIR74 SID74
#>
               <dbl> <dbl>
                             <dbl> <chr>
                                                              \langle int \rangle \langle dbl \rangle \langle dbl \rangle
     <dbl>
                                             <chr> <dbl>
#> 1 0.114
                 1.44 1825
                               1825 Ashe
                                             37009
                                                    37009
                                                                 5 1091 1.00
#> 2 0.0610
                 1.23 1827
                               1827 Allegh~ 37005 37005
                                                                 3
                                                                     487 0
#> 3 0.143
                 1.63 1828
                               1828 Surry 37171 37171
                                                                 86
                                                                    3188 5.00
#> 4 0.0700
                 2.97 1831
                               1831 Currit~ 37053 37053
                                                                 27
                                                                     508 1.00
#> 5 0.153
                 2.21 1832
                                1832 Northa~ 37131 37131
                                                                 66
                                                                    1421 9.00
#> 6 0.0970
                 1.67 1833
                                1833 Hertfo~ 37091 37091
                                                                 46 1452 7.00
#> # ... with 94 more rows, and 5 more variables: NWBIR74 <dbl>, BIR79 <dbl>,
     SID79 <dbl>, NWBIR79 <dbl>, geom <MULTIPOLYGON [°]>
```

which creates a "spatial tibble":

```
class(nc)
#> [1] "sf" "tbl_df" "tbl" "data.frame"
```

This object is transformed into a new coordinate reference system (North Carolina State Plane, with EPSG code 32119):

```
(nc.32119 <- st_transform(nc, 32119))
#> Simple feature collection with 100 features and 14 fields
#> geometry type: MULTIPOLYGON
#> dimension:
               XY
#> bbox:
               xmin: 124000 ymin: 14700 xmax: 931000 ymax: 318000
#> epsg (SRID):
               32119
              #> proj4string:
#> # A tibble: 100 x 15
#>
     AREA PERIMETER CNTY_ CNTY_ID NAME FIPS FIPSNO CRESS_ID BIR74 SID74
#>
    <dbl> <dbl> <dbl> <dbl> <dbl> <chr> <chr> <dbl> <int> <dbl> <dbl> <
             1.44 1825 1825 Ashe 37009 37009
                                                     5 1091 1.00
#> 1 0.114
              1.23 1827
#> 2 0.0610
                        1827 Allegh~ 37005 37005
                                                      3
                                                          487 0
#> 3 0.143
             1.63 1828 1828 Surry 37171 37171
                                                     86 3188 5.00
#> 4 0.0700
              2.97 1831 1831 Currit~ 37053 37053
                                                     27
                                                         508 1.00
              2.21 1832 1832 Northa~ 37131 37131
#> 5 0.153
                                                     66 1421 9.00
          1.67 1833
#> 6 0.0970
                        1833 Hertfo~ 37091 37091
                                                     46 1452 7.00
\#> \# ... with 94 more rows, and 5 more variables: NWBIR74 <dbl>, BIR79 <dbl>,
#> # SID79 <dbl>, NWBIR79 <dbl>, geom <MULTIPOLYGON [m]>
```

and a single attribute column is selected

```
(nc.32119.bir74 <- select(nc.32119, BIR74))
#> Simple feature collection with 100 features and 1 field
#> geometry type: MULTIPOLYGON
#> dimension:
                XY
#> bbox:
                xmin: 124000 ymin: 14700 xmax: 931000 ymax: 318000
#> epsg (SRID):
                32119
               #> proj4string:
#> # A tibble: 100 x 2
#>
   BIR74
                                                                 geom
#>
   <dbl>
                                                     <MULTIPOLYGON [m]>
#> 1 1091 (((387345 278387, 381334 282774, 379438 282943, 373250 290553, 36~
     487 (((408602 292425, 408565 293985, 406643 296873, 406420 3e+05, 402~
#> 3 3188 (((478717 277490, 476936 278867, 471503 279173, 470806 281394, 46~
#> 4 508 (((878194 289128, 877381 291117, 875994 290881, 874941 292805, 87~
#> 5 1421 (((769835 277796, 768364 274842, 762616 274401, 763168 269009, 76~
#> 6 1452 (((812328 277876, 791158 277012, 789882 277579, 777724 277107, 76~
#> # ... with 94 more rows
```

Finally, the result is plotted, with the command:

```
plot(nc.32119.bir74, graticule = TRUE, axes = TRUE)
```

0.3 Spaces: 1, 2 and 3-dimensional, spherical, time, bounded spaces

discusses spaces

bounded: water, rivers, road networks

0.4 Geometries

vertices, edges, lines, polygons, simple features; raster cells

0.5 Vector/Raster

differences, correspondence; properties of rasters; arrays

0.6 Geometric Manipulations

discuss

0.7 Attributes

 $\operatorname{discuss}$

0.8 Reference Systems

Units of measure, reference systems, coordinate transformation and conversion

Part II

Maps

Plotting spatial data

0.9 Plotting spatial data

Plotting of lines, symbols, polygons (choroplets; overlapping polygons), rasters using color

0.10 Base Plot

0.11 ggplot2

 ${\tt geom_sf}$ examples; useful annotations and manipulations

0.12 Interactive Maps

base plot: identify, locator leaflet, tmap, mapview mapedit?

Part III Spatial Analysis

0.13 Summarizing Geometries

Properties: dimension, length, area, etc, if not earlier in Ch 3? counts, density, intensity (units; meaningful)

0.14 Point Pattern Analysis

Basics PP, beyond counting; basic steps in PPA sf - spatstat interface; rasters;

- 0.15 Manipulating attributes: summarise, aggregate, union, sample
- 0.16 Units of measure revisited: attribute units, intensive and extensive variables

0.17 Up- and Downscaling

sampling

largest sub-geometry

area-weighted interpolation

0.18 Spatial Interpolation and geostatistics

intro; variograms; gstat (needs to be sf-ed)

0.19 Area Data and Spatial Correlation

${\bf 0.20}\quad {\bf Spatial}\ {\bf Regression}\ {\bf and}\ {\bf Autocorrelation}$

intro;

0.21 Raster Modelling

map algebra; ABM; SDM; Robert's book.

Part IV Spatialtemporal Analysis

- 0.22 Array data: raster and vector data cubes
- 0.23 Movement data
- 0.24 Statistical modelling of spatiotemporal data
- 0.25 Scalability