

Lecture 16

Spatial Data and Cartography (Part 2)

3/22/2018

Plotting

Example Data - NC SIDS

```
nc = st_read(system.file("shape/nc.shp", package="sf"), quiet = TRUE) %>%  
  select(-(AREA:CNTY_ID), -(FIPS:CRESS_ID))
```

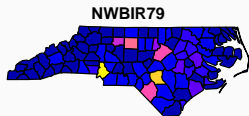
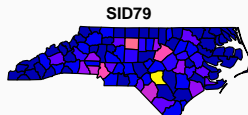
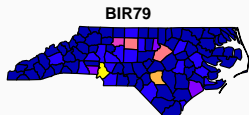
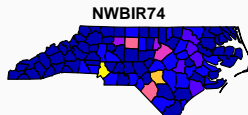
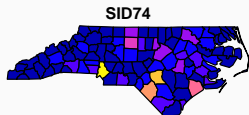
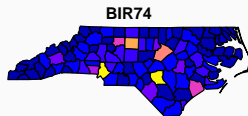
```
tbl_df(nc)
```

```
## # A tibble: 100 x 8
```

```
##   NAME  BIR74  SID74  NWBIR74  BIR79  SID79  NWBIR79  geometry  
##   <fct> <dbl> <dbl>   <dbl> <dbl> <dbl>   <dbl>   <MULTIPOLYGON [°]>  
## 1 Ashe  1091.    1.     10.  1364.    0.     19.  (((-81.47276 36.23436, ~  
## 2 Alle~  487.    0.     10.   542.    3.     12.  (((-81.23989 36.36536, ~  
## 3 Surry 3188.    5.     208. 3616.    6.     260. (((-80.45634 36.24256, ~  
## 4 Curr~  508.    1.     123.  830.    2.     145. (((-76.00897 36.3196, -7~  
## 5 Nort~ 1421.    9.    1066. 1606.    3.    1197. (((-77.21767 36.24098, ~  
## 6 Hert~ 1452.    7.     954. 1838.    5.    1237. (((-76.74506 36.23392, ~  
## 7 Camd~  286.    0.     115.  350.    2.     139. (((-76.00897 36.3196, -7~  
## 8 Gates  420.    0.     254.  594.    2.     371. (((-76.56251 36.34057, ~  
## 9 Warr~  968.    4.     748. 1190.    2.     844. (((-78.30876 36.26004, ~  
## 10 Stok~ 1612.    1.     160. 2038.    5.     176. (((-80.02567 36.25023, ~  
## # ... with 90 more rows
```

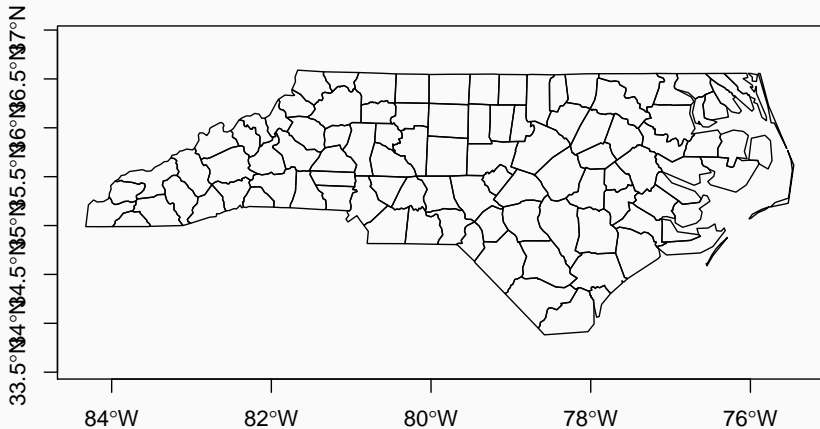
Base Plots

`plot(nc)`



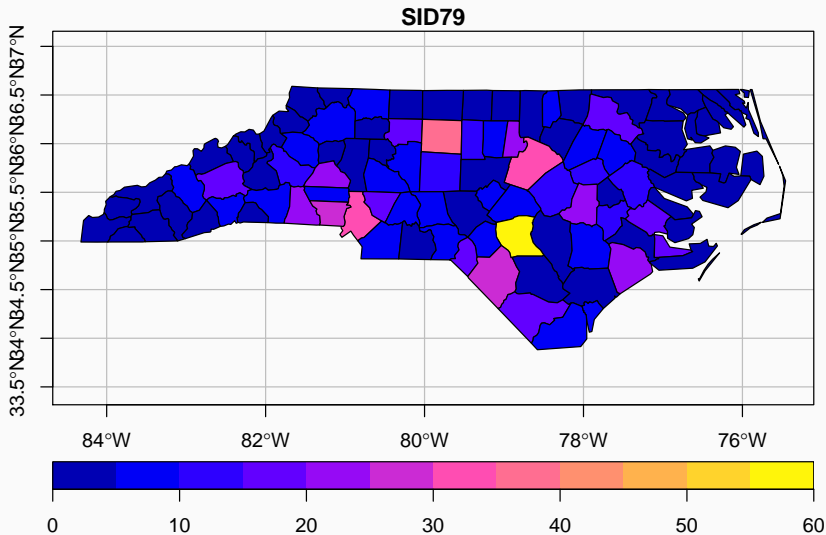
Geometry Plot

```
plot(st_geometry(nc), axes=TRUE)
```



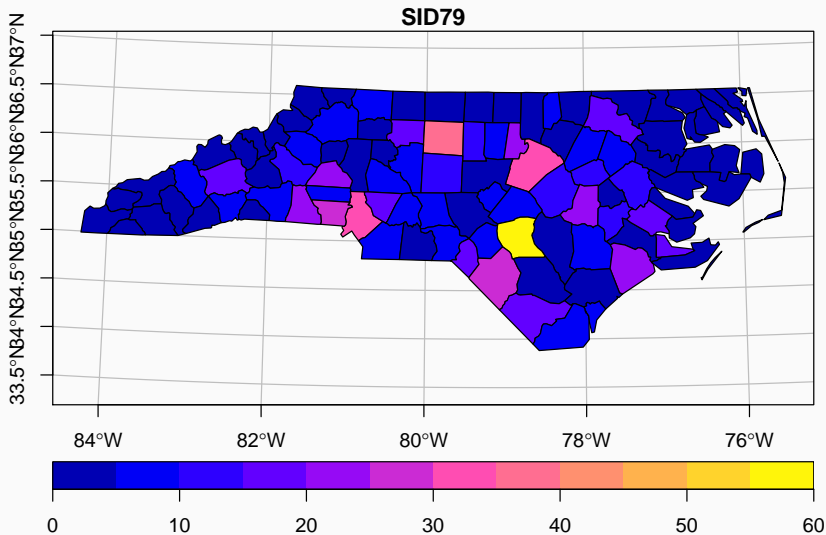
Graticules

```
plot(nc[, "SID79"], graticule=st_crs(nc), axes=TRUE)
```



Graticules (EPSG:3631)

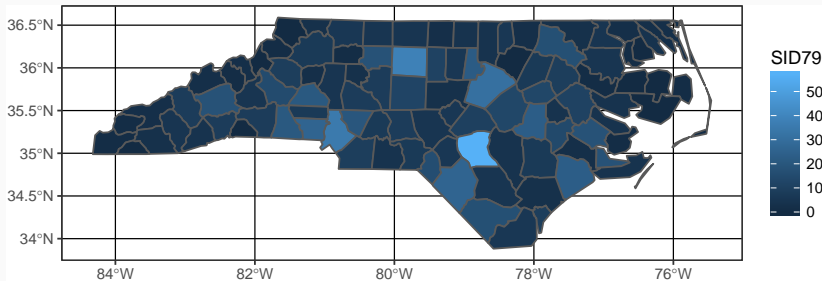
```
plot(st_transform(nc[, "SID79"], 3631), graticule=st_crs(nc), axes=TRUE)
```



ggplot2 (dev)

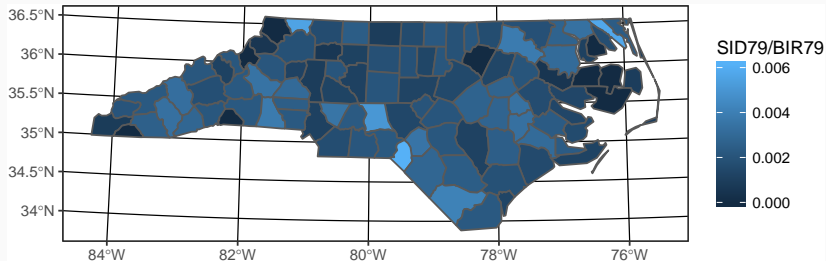
```
devtools::install_github("tidyverse/ggplot2")
```

```
ggplot(nc) +  
  geom_sf(aes(fill=SID79))
```



ggplot2 + projections

```
ggplot(st_transform(nc, 3631)) +  
  geom_sf(aes(fill=SID79 / BIR79))
```



Example Data - Meuse

```
data(meuse, meuse.riv, package="sp")

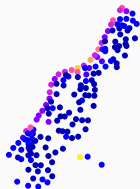
meuse = st_as_sf(meuse, coords=c("x", "y"), crs=28992)
meuse_riv = st_polygon(list(meuse.riv)) %>% st_sfc() %>% st_set_crs(28992)

tbl_df(meuse)
## # A tibble: 155 x 13
##   cadmium copper lead zinc elev dist om ffreq soil lime
## *   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <fct> <fct> <fct>
## 1  11.7    85.  299. 1022.  7.91 0.00136 13.6 1 1 1
## 2   8.60   81.  277. 1141.  6.98 0.0122  14.0 1 1 1
## 3   6.50   68.  199.  640.  7.80 0.103  13.0 1 1 1
## 4   2.60   81.  116.  257.  7.66 0.190   8.00 1 2 0
## 5   2.80   48.  117.  269.  7.48 0.277   8.70 1 2 0
## 6   3.00   61.  137.  281.  7.79 0.364   7.80 1 2 0
## 7   3.20   31.  132.  346.  8.22 0.190   9.20 1 2 0
## 8   2.80   29.  150.  406.  8.49 0.0922  9.50 1 1 0
## 9   2.40   37.  133.  347.  8.67 0.185  10.6 1 1 0
## 10  1.60   24.   80.  183.  9.05 0.310   6.30 1 2 0
## # ... with 145 more rows, and 3 more variables: landuse <fct>,
## #   dist.m <dbl>, geometry <POINT [m]>
```

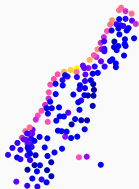
Meuse

```
plot(meuse, pch=16)
```

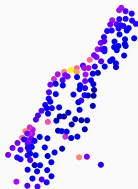
cadmium



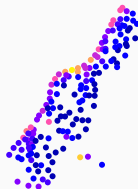
copper



lead



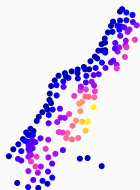
zinc



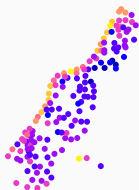
elev



dist



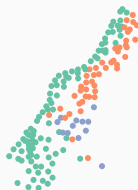
om



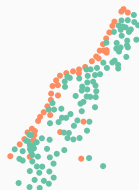
ffreq



soil

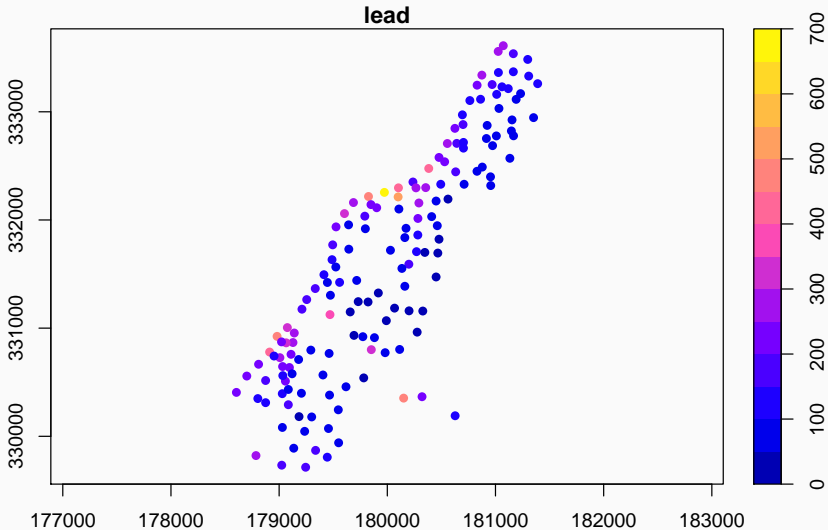


lime



Layering plots

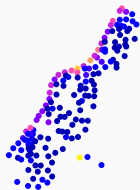
```
plot(meuse[, "lead"], pch=16, axes=TRUE)  
plot(meuse_riv, col=adjustcolor("lightblue", alpha.f=0.5), add=TRUE, border = NA)
```



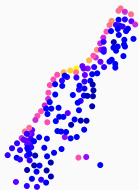
Layering plots (oops)

```
plot(meuse, pch=16)  
plot(meuse_riv, col=adjustcolor("lightblue", alpha.f=0.5), add=TRUE, border = NA)
```

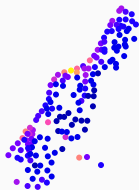
cadmium



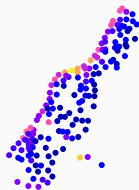
copper



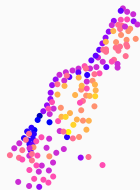
lead



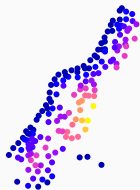
zinc



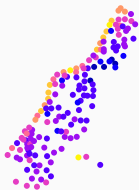
elev



dist



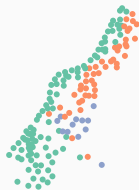
om



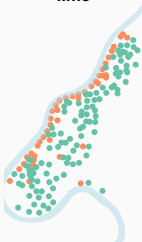
ffreq



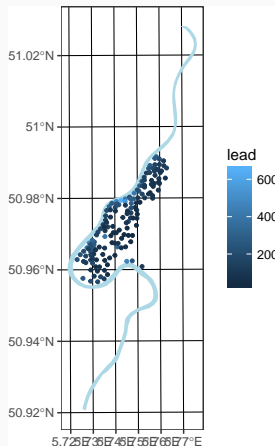
soil



lime



```
ggplot() +  
  geom_sf(data=st_sf(meuse_riv), fill="lightblue", color=NA) +  
  geom_sf(data=meuse, aes(color=lead), size=1)
```



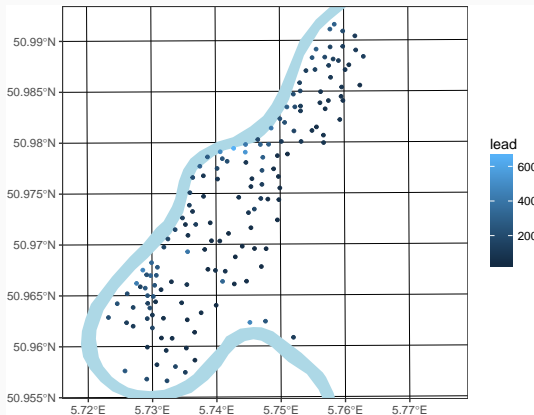
ggplot2 - axis limits

```
ggplot() +  
  geom_sf(data=st_sf(meuse_riv), fill="lightblue", color=NA) +  
  geom_sf(data=meuse, aes(color=lead), size=1) +  
  ylim(50.95, 50.99)
```



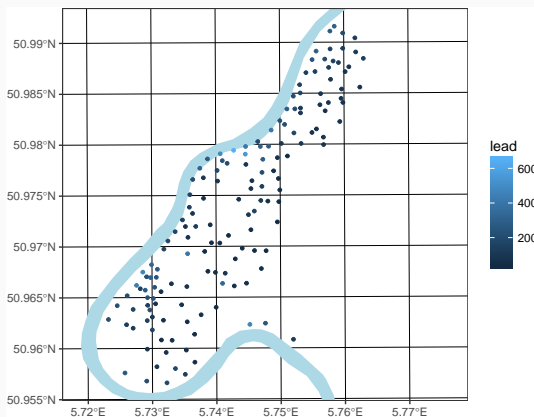
ggplot2 - axis limits

```
ggplot() +  
  geom_sf(data=st_sf(meuse_riv), fill="lightblue", color=NA) +  
  geom_sf(data=meuse, aes(color=lead), size=1) +  
  ylim(329714, 333611)
```



ggplot2 - bounding box

```
ggplot() +  
  geom_sf(data=st_sf(meuse_riv), fill="lightblue", color=NA) +  
  geom_sf(data=meuse, aes(color=lead), size=1) +  
  ylim(st_bbox(meuse)["ymin"], st_bbox(meuse)["ymax"])
```



Geometry Manipulation

Casting

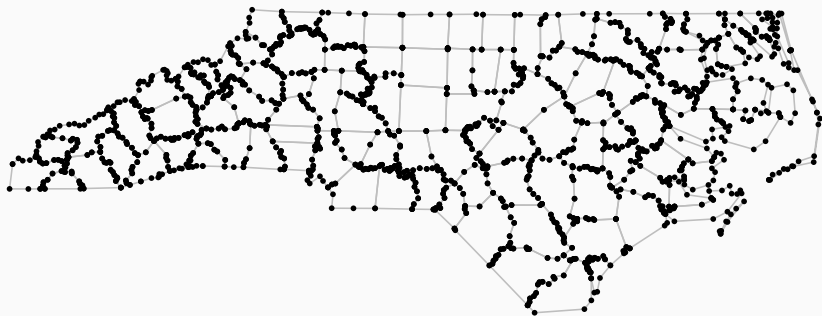
```
nc_pts = st_cast(nc, "MULTIPOINT")
```

```
tbl_df(nc_pts)
```

```
## # A tibble: 100 x 8
```

```
##   NAME  BIR74  SID74  NWBIR74  BIR79  SID79  NWBIR79  geometry
## * <fct> <dbl> <dbl>   <dbl> <dbl> <dbl>   <dbl>   <MULTIPOINT [°]>
## 1 Ashe  1091.    1.     10.  1364.    0.     19. (-81.47276 36.23436, -81~
## 2 Alle~  487.    0.     10.   542.    3.     12. (-81.23989 36.36536, -81~
## 3 Surry 3188.    5.     208. 3616.    6.    260. (-80.45634 36.24256, -80~
## 4 Curr~  508.    1.     123.  830.    2.    145. (-76.00897 36.3196, -76.~
## 5 Nort~ 1421.    9.    1066. 1606.    3.   1197. (-77.21767 36.24098, -77~
## 6 Hert~ 1452.    7.     954. 1838.    5.   1237. (-76.74506 36.23392, -76~
## 7 Camd~  286.    0.     115.  350.    2.    139. (-76.00897 36.3196, -75.~
## 8 Gates  420.    0.     254.  594.    2.    371. (-76.56251 36.34057, -76~
## 9 Warr~  968.    4.     748. 1190.    2.    844. (-78.30876 36.26004, -78~
## 10 Stok~ 1612.    1.     160. 2038.    5.    176. (-80.02567 36.25023, -80~
## # ... with 90 more rows
```

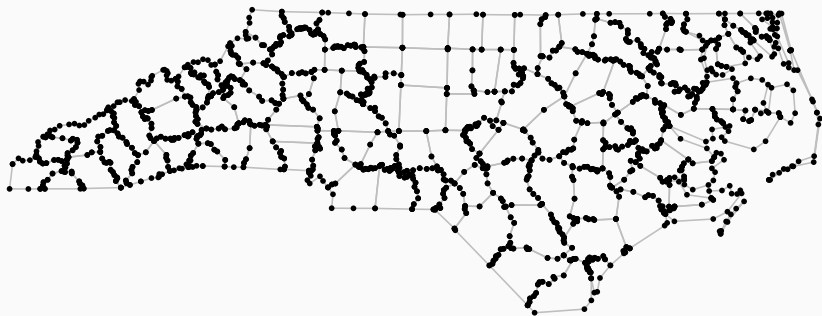
```
plot(st_geometry(nc), border='grey')  
plot(st_geometry(nc_pts), pch=16, cex=0.5, add=TRUE)
```



Casting - POINT

```
st_cast(nc, "POINT")
## Simple feature collection with 2529 features and 7 fields
## geometry type: POINT
## dimension: XY
## bbox: xmin: -84.32385 ymin: 33.88199 xmax: -75.45698 ymax: 36.58965
## epsg (SRID): 4267
## proj4string: +proj=longlat +datum=NAD27 +no_defs
## First 10 features:
##      NAME BIR74 SID74 NWBIR74 BIR79 SID79 NWBIR79 geometry
## 1 Ashe 1091 1 10 1364 0 19 POINT (-81.47276 36.23436)
## 2 Ashe 1091 1 10 1364 0 19 POINT (-81.54084 36.27251)
## 3 Ashe 1091 1 10 1364 0 19 POINT (-81.56198 36.27359)
## 4 Ashe 1091 1 10 1364 0 19 POINT (-81.63306 36.34069)
## 5 Ashe 1091 1 10 1364 0 19 POINT (-81.74107 36.39178)
## 6 Ashe 1091 1 10 1364 0 19 POINT (-81.69828 36.47178)
## 7 Ashe 1091 1 10 1364 0 19 POINT (-81.7028 36.51934)
## 8 Ashe 1091 1 10 1364 0 19 POINT (-81.67 36.58965)
## 9 Ashe 1091 1 10 1364 0 19 POINT (-81.3453 36.57286)
## 10 Ashe 1091 1 10 1364 0 19 POINT (-81.34754 36.53791)
```

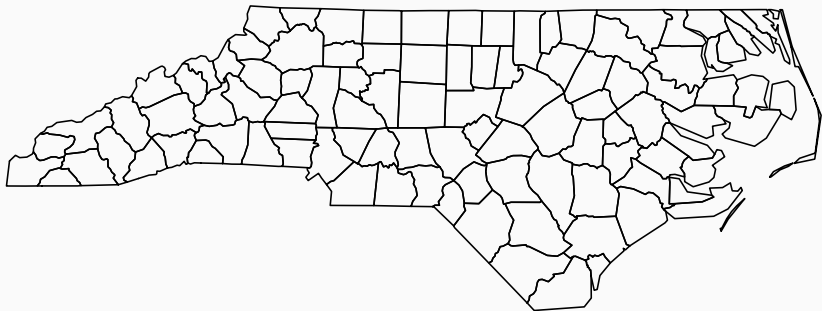
```
plot(st_geometry(nc), border='grey')  
plot(st_geometry(st_cast(nc, "POINT")), pch=16, cex=0.5, add=TRUE)
```



Casting - LINESTRING

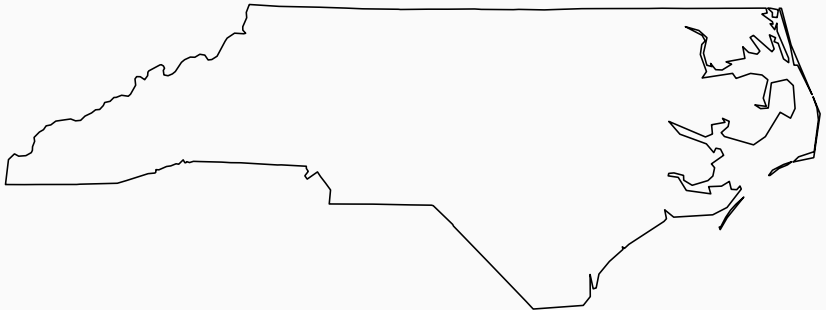
```
st_cast(nc, "MULTILINESTRING") %>% as_tibble()
## # A tibble: 100 x 8
##   NAME BIR74 SID74 NWBIR74 BIR79 SID79 NWBIR79 geometry
## * <fct> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <MULTILINESTRING [°]>
## 1 Ashe 1091. 1. 10. 1364. 0. 19. ((-81.47276 36.23436, -8~
## 2 Alle~ 487. 0. 10. 542. 3. 12. ((-81.23989 36.36536, -8~
## 3 Surry 3188. 5. 208. 3616. 6. 260. ((-80.45634 36.24256, -8~
## 4 Curr~ 508. 1. 123. 830. 2. 145. ((-76.00897 36.3196, -76~
## 5 Nort~ 1421. 9. 1066. 1606. 3. 1197. ((-77.21767 36.24098, -7~
## 6 Hert~ 1452. 7. 954. 1838. 5. 1237. ((-76.74506 36.23392, -7~
## 7 Camd~ 286. 0. 115. 350. 2. 139. ((-76.00897 36.3196, -75~
## 8 Gates 420. 0. 254. 594. 2. 371. ((-76.56251 36.34057, -7~
## 9 Warr~ 968. 4. 748. 1190. 2. 844. ((-78.30876 36.26004, -7~
## 10 Stok~ 1612. 1. 160. 2038. 5. 176. ((-80.02567 36.25023, -8~
## # ... with 90 more rows
```

```
st_cast(nc, "MULTILINESTRING") %>% st_geometry() %>% plot()
```



Grouping Features

```
nc_state = st_union(nc)
plot(nc_state)
```



```
nc_state
## Geometry set for 1 feature
## geometry type: MULTIPOLYGON
## dimension: XY
## bbox: xmin: -84.32385 ymin: 33.88199 xmax: -75.45698 ymax: 36.58965
## epsg (SRID): 4267
## proj4string: +proj=longlat +datum=NAD27 +no_defs
## MULTIPOLYGON (((-76.54427 34.58783, -76.55515 3...
```

More Grouping

```
nc_cut = nc %>%  
  mutate(X = st_centroid(nc) %>% st_coordinates() %>% .[,1]) %>%  
  mutate(region = cut(X, breaks = 5))
```

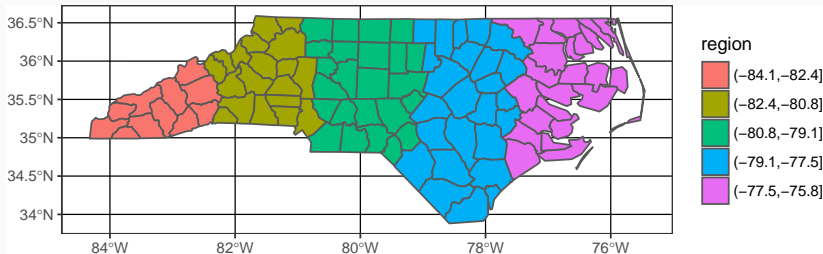
```
nc_cut  
## Simple feature collection with 100 features and 9 fields  
## geometry type: MULTIPOLYGON  
## dimension: XY  
## bbox: xmin: -84.32385 ymin: 33.88199 xmax: -75.45698 ymax: 36.58965  
## epsg (SRID): 4267  
## proj4string: +proj=longlat +datum=NAD27 +no_defs  
## First 10 features:  
##
```

| ## | NAME | BIR74 | SID74 | NWBIR74 | BIR79 | SID79 | NWBIR79 | X |
|-------|-------------|-------|-------|---------|-------|-------|---------|-----------|
| ## 1 | Ashe | 1091 | 1 | 10 | 1364 | 0 | 19 | -81.49826 |
| ## 2 | Alleghany | 487 | 0 | 10 | 542 | 3 | 12 | -81.12515 |
| ## 3 | Surry | 3188 | 5 | 208 | 3616 | 6 | 260 | -80.68575 |
| ## 4 | Currituck | 508 | 1 | 123 | 830 | 2 | 145 | -76.02750 |
| ## 5 | Northampton | 1421 | 9 | 1066 | 1606 | 3 | 1197 | -77.41056 |
| ## 6 | Hertford | 1452 | 7 | 954 | 1838 | 5 | 1237 | -76.99478 |
| ## 7 | Camden | 286 | 0 | 115 | 350 | 2 | 139 | -76.23435 |
| ## 8 | Gates | 420 | 0 | 254 | 594 | 2 | 371 | -76.70448 |
| ## 9 | Warren | 968 | 4 | 748 | 1190 | 2 | 844 | -78.11043 |
| ## 10 | Stokes | 1612 | 1 | 160 | 2038 | 5 | 176 | -80.23428 |

```
##
```

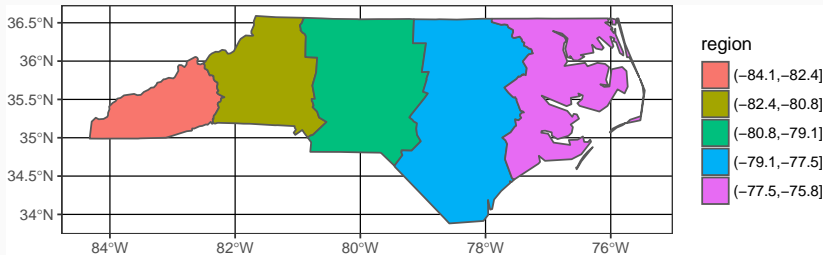
| ## | region | geometry |
|------|---------------|--------------------------------|
| ## 1 | (-82.4,-80.8] | MULTIPOLYGON (((-81.47276 3... |
| ## 2 | (-82.4,-80.8] | MULTIPOLYGON (((-81.23989 3... |
| ## 3 | (-80.8,-79.1] | MULTIPOLYGON (((-80.45634 3... |
| ## 4 | (-77.5,-75.8] | MULTIPOLYGON (((-76.00807 2... |

```
ggplot(nc_cut) +  
  geom_sf(aes(fill=region))
```



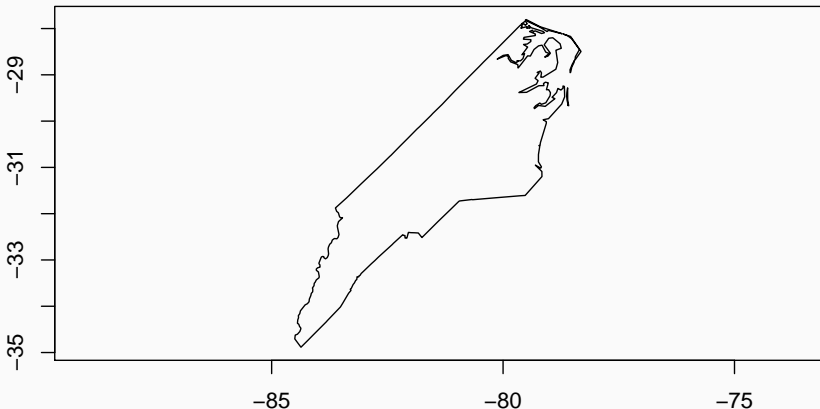
dplyr and sf

```
nc_cut %>%  
  group_by(region) %>%  
  summarize() %>%  
  ggplot() +  
    geom_sf(aes(fill=region))
```



Affine Transformations

```
rotate = function(a) matrix(c(cos(a), sin(a), -sin(a), cos(a)), 2, 2)  
  
ctrd = st_centroid(nc_state)  
state_rotate = lwgeom::st_make_valid( (nc_state) * rotate(-pi/4) )  
plot(state_rotate, axes=TRUE)
```



Scaling Size

```
ctrd = st_centroid(st_geometry(nc))  
area = st_area(nc) %>% strip_attrs()  
  
nc_rot = nc  
st_geometry(nc_rot) = (st_geometry(nc) - ctrd) * rotate(pi/2) * .5 + ctrd  
  
plot(nc_rot[, "SID79"])
```

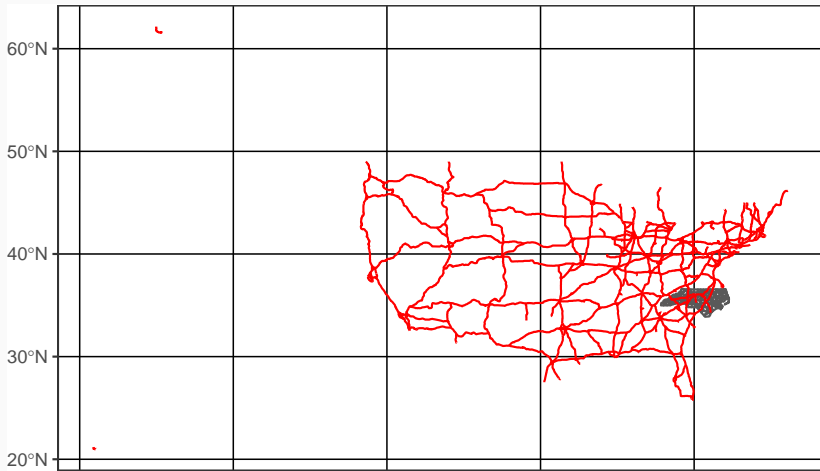
SID79



Highway Example

Highways

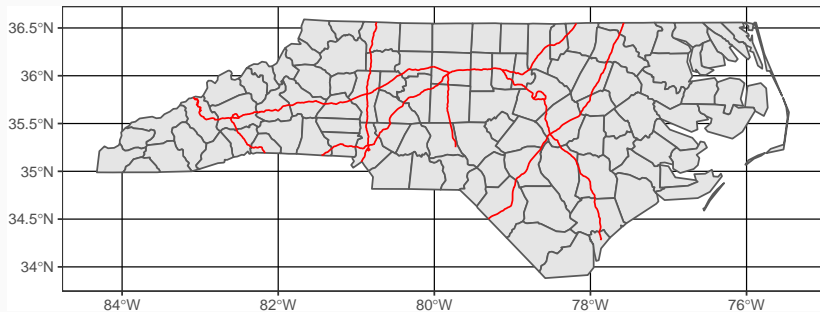
```
hwy = st_read("../data/gis/us_interstates/", quiet=TRUE, stringsAsFactors=FALSE) %>% s  
  
ggplot() +  
  geom_sf(data=nc) +  
  geom_sf(data=hwy, col='red')
```



NC Interstate Highways

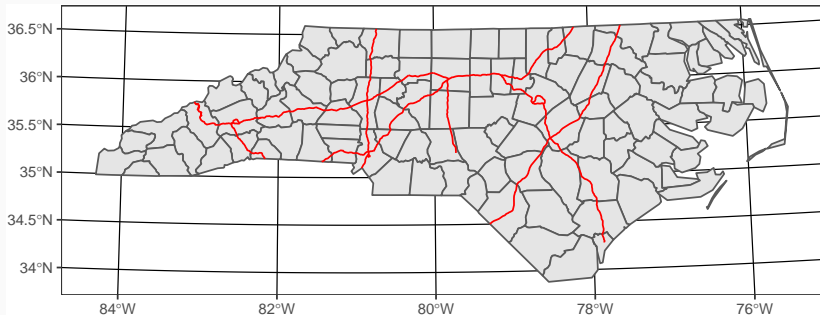
```
hwy_nc = st_intersection(hwy, nc)
## although coordinates are longitude/latitude, st_intersection assumes that they are

ggplot() +
  geom_sf(data=nc) +
  geom_sf(data=hwy_nc, col='red')
```



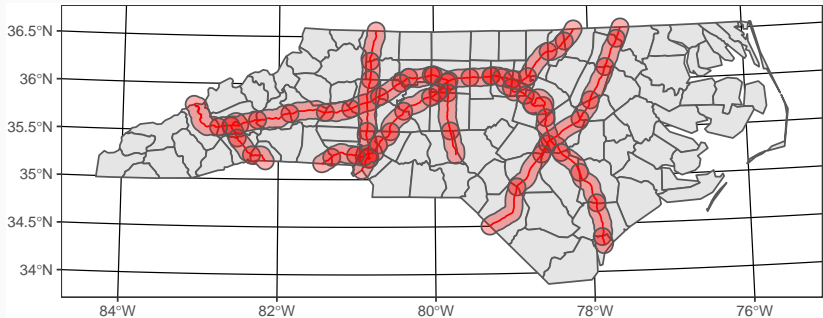
Counties near the interstate (Projection)

```
nc_utm = st_transform(nc, "+proj=utm +zone=17 +datum=NAD83 +units=m +no_defs")  
  
ggplot() +  
  geom_sf(data=nc_utm) +  
  geom_sf(data=hwy_nc, col='red')
```



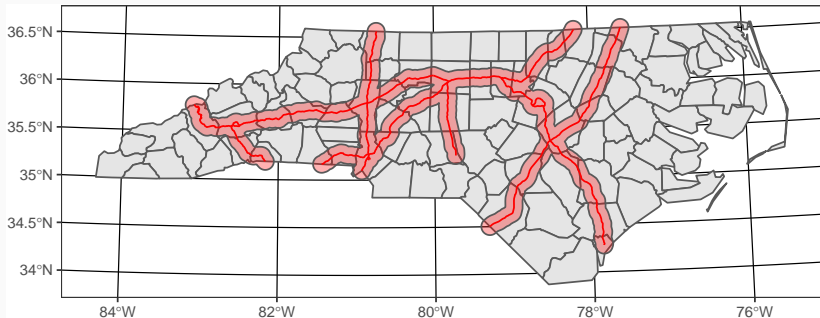
Counties near the interstate (Buffering)

```
hwy_nc_buffer = hwy_nc %>%  
  st_transform("+proj=utm +zone=17 +datum=NAD83 +units=m +no_defs") %>%  
  st_buffer(10000)  
  
ggplot() +  
  geom_sf(data=nc_utm) +  
  geom_sf(data=hwy_nc, color='red') +  
  geom_sf(data=hwy_nc_buffer, fill='red', alpha=0.3)
```



Counties near the interstate (Buffering + Union)

```
hwy_nc_buffer = hwy_nc %>%  
  st_transform("+proj=utm +zone=17 +datum=NAD83 +units=m +no_defs") %>%  
  st_buffer(10000) %>%  
  st_union() %>%  
  st_sf()  
  
ggplot() +  
  geom_sf(data=nc_utm) +  
  geom_sf(data=hwy_nc, color='red') +  
  geom_sf(data=hwy_nc_buffer, fill='red', alpha=0.3)
```



Example

How many counties in North Carolina are within 5, 10, 20, or 50 km of an interstate highway?

Example

How many counties in North Carolina are within 5, 10, 20, or 50 km of an interstate highway?

Gerrymandering Example

2014 NC House Districts

```
nc_house = st_read("../data/nc_districts114.shp", stringsAsFactors = FALSE,  
  select(ID, DISTRICT))
```

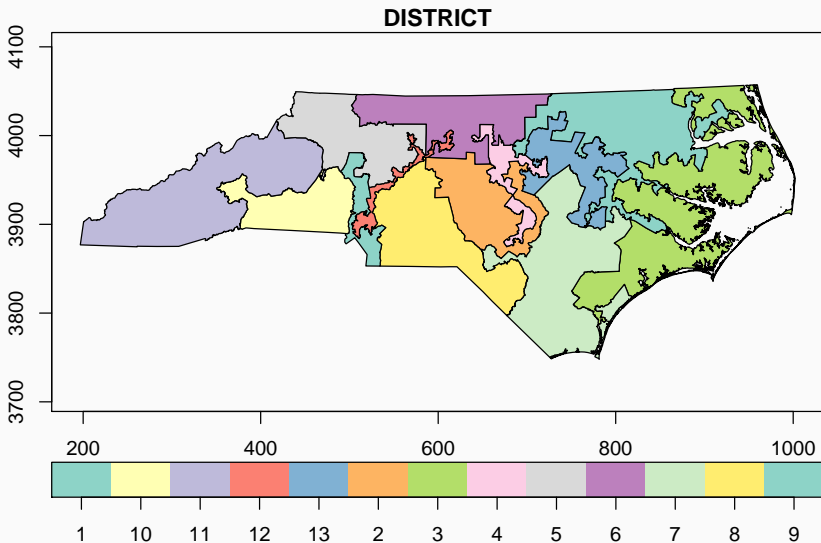
```
tbl_df(nc_house)
```

```
## # A tibble: 13 x 3
```

```
##   ID          DISTRICT          geometr  
##   <chr>        <chr>          <MULTIPOLYGON [°]  
## 1 037113114002 2      (((-80.05325 35.80178, -80.04671 35.92066, -79.5  
## 2 037113114003 3      (((-75.52398 35.77489, -75.50243 35.74291, -75.4  
## 3 037113114004 4      (((-79.47249 36.11374, -79.46936 36.12507, -79.4  
## 4 037113114001 1      (((-76.68697 36.11117, -76.6848 36.11495, -76.67  
## 5 037113114005 5      (((-81.91805 36.2872, -81.90814 36.30201, -81.89  
## 6 037113114006 6      (((-80.97462 36.45285, -80.96323 36.45917, -80.9  
## 7 037113114007 7      (((-79.37719 34.97479, -79.37112 34.97781, -79.3  
## 8 037113114008 8      (((-80.72606 35.21124, -80.7225 35.21661, -80.72  
## 9 037113114009 9      (((-81.10803 35.77749, -81.10582 35.7819, -81.10  
## 10 037113114010 10     (((-82.6516 35.60073, -82.64091 35.60736, -82.62  
## 11 037113114011 11     (((-84.3218 34.98897, -84.29024 35.22557, -84.28  
## 12 037113114012 12     (((-80.97461 35.24055, -80.97357 35.24584, -80.9  
## 13 037113114013 13     (((-78.87711 35.75273, -78.87338 35.77312, -78.8
```



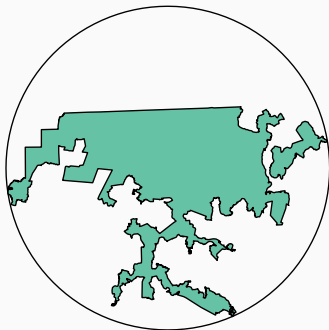
```
nc_house = nc_house %>%  
  st_transform("+proj=utm +zone=17 +datum=NAD83 +units=km +no_defs")  
plot(nc_house[, "DISTRICT"], axes=TRUE)
```



Measuring Compactness - Reock Score

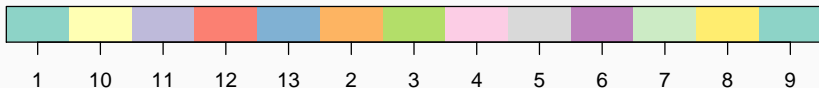
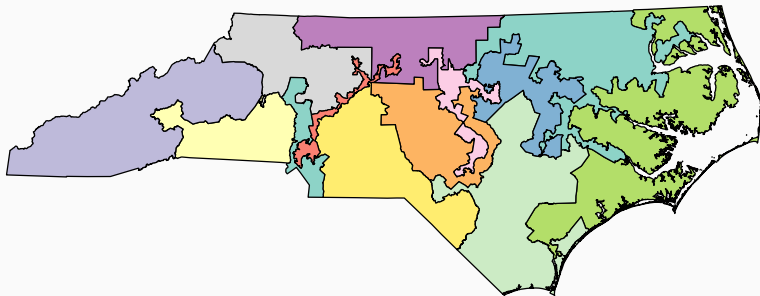
The Reock score is a measure of compactness that is calculated as the ratio of the area of a shape to the area of its minimum bounding circle.

```
circs = nc_house %>% st_geometry() %>% lwgeom::st_minimum_bounding_circle()  
  
sub = nc_house$DISTRICT == 1  
plot(circs[sub])  
plot(nc_house[sub,"DISTRICT"], add=TRUE)
```



```
plot(nc_house[, "DISTRICT"])  
plot(circs, add=TRUE)
```

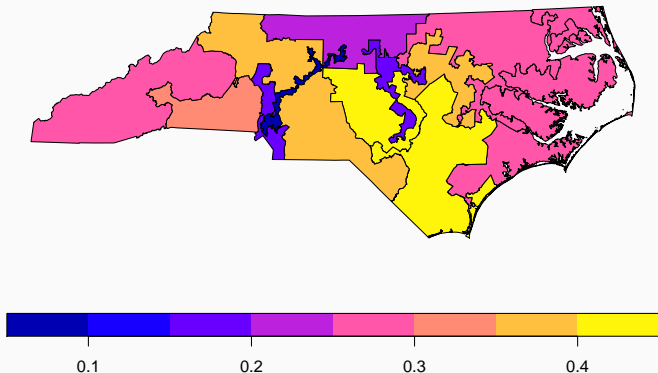
DISTRICT



Calculating Reock

```
nc_house = nc_house %>%  
  mutate(reock = st_area(nc_house) / st_area(circs))  
plot(nc_house[, "reock"])
```

reock [1]



```
tbl_df(nc_house) %>%
  arrange(reock) %>%
  print(n=13)
```

```
## # A tibble: 13 x 4
```

```
##   ID          DISTRICT reock          geometr
##   <chr>      <chr>    <S3: units> <MULTIPOLYGON [km]
## 1 037113114012 12      0.0711997215878126 (((502.31 3899.72, 502.4045 3
## 2 037113114009 9        0.169405525617443 (((490.2361 3959.275, 490.436
## 3 037113114004 4        0.1735809490213   (((637.4776 3997.644, 637.739
## 4 037113114006 6        0.240919191926239 (((502.2744 4034.178, 503.294
## 5 037113114003 3        0.251285019523225 (((995.1797 3972.839, 997.330
## 6 037113114011 11       0.264255107593438 (((196.7812 3876.863, 200.530
## 7 037113114001 1        0.289934134507595 (((888.2895 4004.901, 888.466
## 8 037113114010 10       0.34012606752961  (((350.3919 3940.92, 351.3727
## 9 037113114008 8        0.353232490504049 (((524.9335 3896.503, 525.255
## 10 037113114013 13       0.382195549931454 (((691.9403 3958.602, 692.228
## 11 037113114005 5        0.397082589710882 (((417.5582 4016.195, 418.464
## 12 037113114007 7        0.414888641986656 (((648.136 3871.45, 648.6853
## 13 037113114002 2        0.42590009492903  (((585.5425 3962.377, 586.005
```

Raster Data

Example data - Meuse

```
meuse_rast = raster(system.file("external/test.grd", package="raster"))
```

```
meuse_rast
```

```
## class      : RasterLayer
```

```
## dimensions : 115, 80, 9200 (nrow, ncol, ncell)
```

```
## resolution : 40, 40 (x, y)
```

```
## extent     : 178400, 181600, 329400, 334000 (xmin, xmax, ymin, ymax)
```

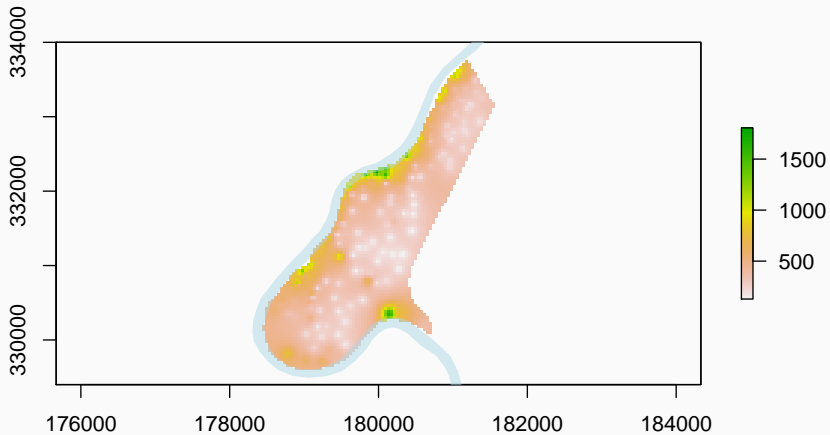
```
## coord. ref.: +init=epsg:28992 +towgs84=565.237,50.0087,465.658,-0.406857,0.350733,
```

```
## data source : /usr/local/lib/R/3.4/site-library/raster/external/test.grd
```

```
## names      : test
```

```
## values     : 128.434, 1805.78 (min, max)
```

```
plot(meuse_rast)  
plot(meuse_riv, add=TRUE, col=adjustcolor("lightblue",alpha.f = 0.5), border=NA)
```



raster class

```
str(meuse_rast)
## Formal class 'RasterLayer' [package "raster"] with 12 slots
## ..@ file      :Formal class '.RasterFile' [package "raster"] with 13 slots
## .. .. ..@ name      : chr "/usr/local/lib/R/3.4/site-library/raster/external/t
## .. .. ..@ datanotation: chr "FLT4S"
## .. .. ..@ byteorder  : Named chr "little"
## .. .. .. ..- attr(*, "names")= chr "value"
## .. .. ..@ nodatavalue : num -3.4e+38
## .. .. ..@ NAchanged   : logi FALSE
## .. .. ..@ nbands     : int 1
## .. .. ..@ bandorder  : Named chr "BIL"
## .. .. .. ..- attr(*, "names")= chr "value"
## .. .. ..@ offset     : int 0
## .. .. ..@ toptobottom: logi TRUE
## .. .. ..@ blockrows  : int 0
## .. .. ..@ blockcols  : int 0
## .. .. ..@ driver     : chr "raster"
## .. .. ..@ open       : logi FALSE
## ..@ data       :Formal class '.SingleLayerData' [package "raster"] with 13 slots
## .. .. ..@ values    : logi(0)
## .. .. ..@ offset    : num 0
## .. .. ..@ gain      : num 1
## .. .. ..@ inmemory  : logi FALSE
## .. .. ..@ fromdisk  : logi TRUE
## .. .. ..@ isfactor  : logi FALSE
## .. .. ..@ attributes: list()
## .. .. ..@ haveminmax: logi TRUE
## .. .. ..@ min       : num 128
```

raster features

```
extent(meuse_rast)
```

```
## class      : Extent  
## xmin       : 178400  
## xmax       : 181600  
## ymin       : 329400  
## ymax       : 334000
```

```
dim(meuse_rast)
```

```
## [1] 115  80  1
```

```
res(meuse_rast)
```

```
## [1] 40 40
```

```
projection(meuse_rast)
```

```
## [1] "+init=epsg:28992 +towgs84=565.237,50.0087,465.658,-0.406857,0.350733,-1.87035,
```

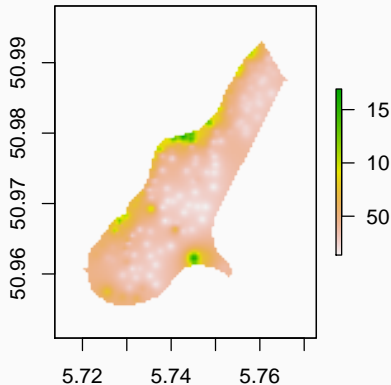
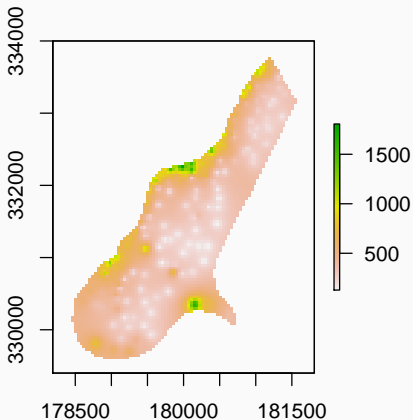
```
meuse_rast[20,]
```

```
## [1]      NA      NA      NA      NA      NA      NA      NA      NA  
## [9]      NA      NA      NA      NA      NA      NA      NA      NA  
## [17]     NA     NA     NA     NA     NA     NA     NA     NA  
## [25]     NA     NA     NA     NA     NA     NA     NA     NA  
## [33]     NA     NA     NA     NA     NA     NA     NA     NA  
## [41]     NA     NA     NA     NA     NA     NA     NA     NA  
## [49]     NA     NA     NA     NA     NA     NA     NA     NA  
## [57]     NA     NA     NA  749.536  895.292  791.145  607.186  511.044  
## [65]  468.404  399.325  350.362  306.180  300.483  310.082  283.940  285.771  
## [73]  304.709  309.690  301.799  308.753  328.357  345.611      NA      NA
```

Rasters and Projections

```
library(rgdal)
meuse_rast_ll = projectRaster(meuse_rast, crs="+proj=longlat +datum=NAD27 +no_defs")

par(mfrow=c(1,2))
plot(meuse_rast)
plot(meuse_rast_ll)
```



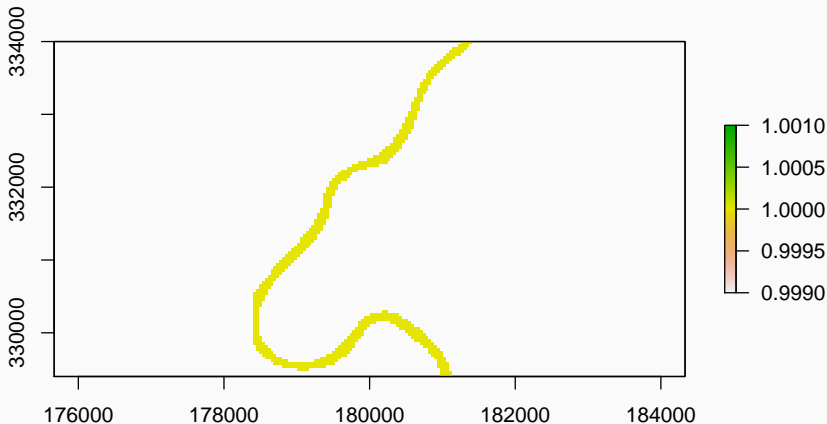
```
meuse_rast
## class      : RasterLayer
## dimensions : 115, 80, 9200 (nrow, ncol, ncell)
## resolution : 40, 40 (x, y)
## extent     : 178400, 181600, 329400, 334000 (xmin, xmax, ymin, ymax)
## coord. ref.: +init=epsg:28992 +towgs84=565.237,50.0087,465.658,-0.406857
## data source: /usr/local/lib/R/3.4/site-library/raster/external/test.grd
## names      : test
## values     : 128.434, 1805.78 (min, max)
```

```
meuse_rast_ll
## class      : RasterLayer
## dimensions : 131, 91, 11921 (nrow, ncol, ncell)
## resolution : 0.000569, 0.00036 (x, y)
## extent     : 5.717362, 5.769141, 50.95089, 50.99805 (xmin, xmax, ymin, ymax)
## coord. ref.: +proj=longlat +datum=NAD27 +no_defs +ellps=clrk66 +nadgrids
## data source: in memory
## names      : test
## values     : 135.647, 1693.578 (min, max)
```

Simple Features \longleftrightarrow Rasters

```
meuse_riv_rast = rasterize(meuse_riv, meuse_rast)
## Error in (function (classes, fdef, mtable) : unable to find an inherited method for

meuse_riv_rast = rasterize(as(meuse_riv, "Spatial"), meuse_rast)
plot(meuse_riv_rast)
```



Rasters and Spatial Models

```
head(meuse)
```

```
## Simple feature collection with 6 features and 12 fields
```

```
## geometry type: POINT
```

```
## dimension: XY
```

```
## bbox: xmin: 181025 ymin: 333260 xmax: 181390 ymax: 333611
```

```
## epsg (SRID): 28992
```

```
## proj4string: +proj=sterea +lat_0=52.15616055555555 +lon_0=5.387638888888889 +k=0
```

```
## cadmium copper lead zinc elev dist om freq soil lime landuse
```

```
## 1 11.7 85 299 1022 7.909 0.00135803 13.6 1 1 1 Ah
```

```
## 2 8.6 81 277 1141 6.983 0.01222430 14.0 1 1 1 Ah
```

```
## 3 6.5 68 199 640 7.800 0.10302900 13.0 1 1 1 Ah
```

```
## 4 2.6 81 116 257 7.655 0.19009400 8.0 1 2 0 Ga
```

```
## 5 2.8 48 117 269 7.480 0.27709000 8.7 1 2 0 Ah
```

```
## 6 3.0 61 137 281 7.791 0.36406700 7.8 1 2 0 Ga
```

```
## dist.m geometry
```

```
## 1 50 POINT (181072 333611)
```

```
## 2 30 POINT (181025 333558)
```

```
## 3 150 POINT (181165 333537)
```

```
## 4 270 POINT (181298 333484)
```

```
## 5 380 POINT (181307 333330)
```

```
## 6 470 POINT (181390 333260)
```

```
head(st_coordinates(meuse))
```

```
## X Y
```

```
## 1 181072 333611
```

```
## 2 181025 333558
```

```
## 3 181165 333537
```

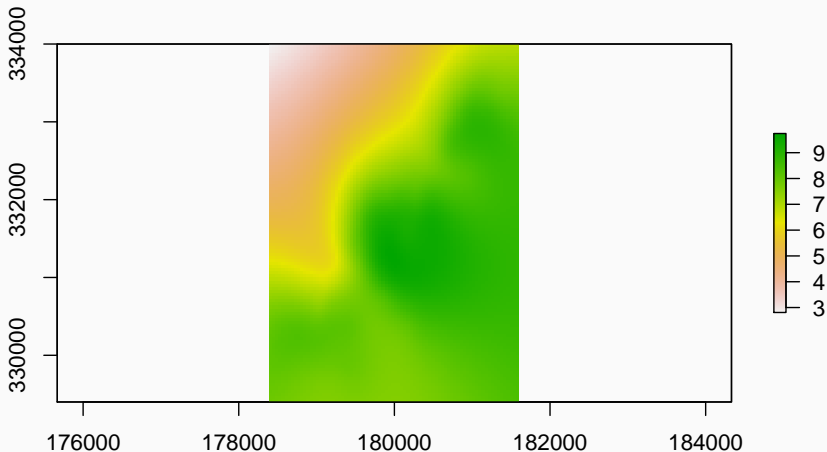
```
## 4 181298 333484
```

```
library(fields)
```

```
tps = Tps(x = st_coordinates(meuse), Y=meuse$elev)  
pred_grid = xyFromCell(meuse_rast, seq_along(meuse_rast))
```

```
meuse_elev_pred = meuse_rast  
meuse_elev_pred[] = predict(tps, pred_grid)
```

```
plot(meuse_elev_pred)
```



ggplot and rasters

```
p = rasterToPolygons(meuse_elev_pred) %>% st_as_sf()  
  
(ggplot() + geom_sf(data=meuse, aes(color=elev), size=1)) +  
(ggplot() + geom_sf(data=p, aes(fill=test), color=NA))
```

