

R Spatial Basics Agenda

Follow-along example with NJ Bus Stop data

1. Loading data from file
 - a. CSV format
 - b. Shapefile format
2. Geographic data basics
3. Basic maps
4. Gridded aggregations



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The University of Texas at Austin

R Spatial Basics

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With thanks to David Walling and Chris Ramos for contributing materials to these lessons

Data download

njgin NJGIN Open Data

Bus Stops of NJ Transit

Private Member
NJ Transit

Summary

Bus stops from the October 2021 service change. Each record indicates an active bus stop during this service change.

[View Full Details](#)

- Dataset**
Feature Layer
- October 1, 2021**
Info Updated
- Quarterly**
Data Updated: October 6, 2021
- October 1, 2021**
Published Date
- 30,499 Records**
[View data table](#)
- Public**
Anyone can see this content
- Custom License**
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30,499 records

[View Table](#)

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Download Shapefile and CSV file

The screenshot displays the NJGIN Open Data portal interface. On the left, under 'Download Options' for 'Bus Stops of NJ Transit', there are four data format options: CSV, KML, Shapefile, and GeoJSON. Each option shows the file creation date (Oct 24, 2021, 11:40) and file size. The CSV file is 1.2 MB, KML is 1.9 MB, Shapefile is 1.7 MB, and GeoJSON is 1.8 MB. Each option has a 'Download' button. Two red arrows point to the 'Download' buttons for the CSV and Shapefile formats. On the right, a map of the New York City area shows the bus stop locations as blue dots. A 'View Table' button is located in the top right corner of the map area. The bottom of the page includes a footer with 'Esri, HERE, Garmin, USGS, EPA, NPS | Esri, HERE, NPS' and 'Powered by Esri'.

nigin NJGIN Open Data

Download Options
Bus Stops of NJ Transit

Records: 30,499
Toggle Filters: ☐

CSV
File created: Oct 24, 2021, 11:40
File size: 1.2 MB
[Download](#)

KML
File created: Oct 24, 2021, 11:40
File size: 1.9 MB
[Download](#)

Shapefile
File created: Oct 24, 2021, 11:40
File size: 1.7 MB
[Download](#)

GeoJSON
File created: Oct 24, 2021, 11:40
File size: 1.8 MB
[Download](#)

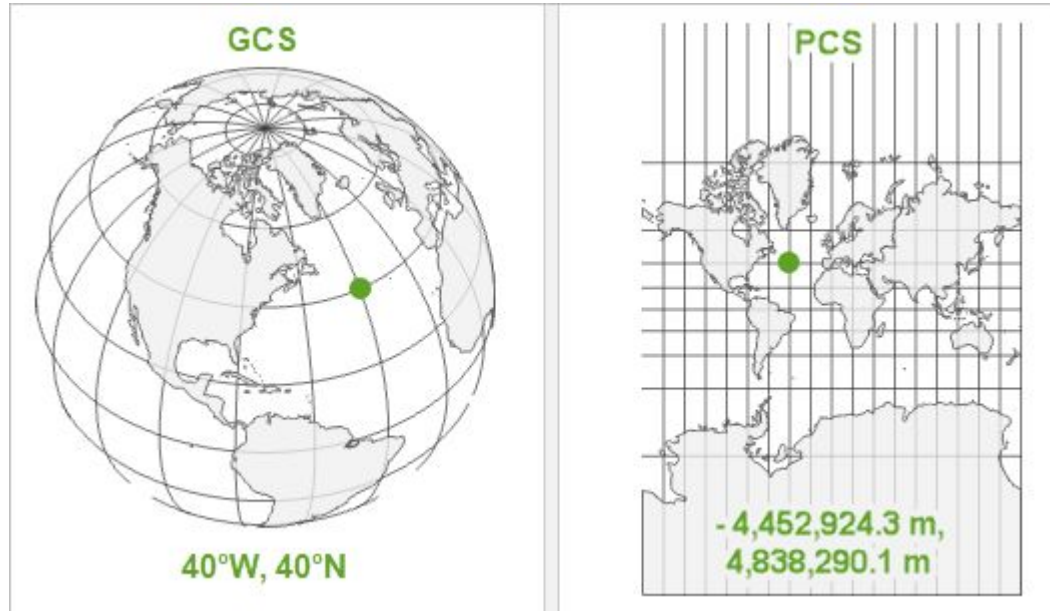
30,499 records

[View Table](#)

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Geographic data basics

- Geographic coordinate systems (GCS): where on the ellipsoid did this happen?
- Projected coordinate systems (PCS) are flattened-out
- R handles projection math for us



Loading data from file

- comma-separated values
 - single file in text format
 - columns are separated by commas
 - rows are separated by newlines

```
column1,column2
```

```
value1,value2
```

- shapefiles
 - collection of files
 - contains spatial metadata

Creating simple features from a CSV

- “Simple features” refers to a spatial data standard used by ArcGIS, the R `sf` library, and other geospatial software

```
bus_csv <- read.csv('data/Bus_Stops_of_NJ_Transit.csv')  
head(bus_csv)
```

##	FID	COUNTY	DLAT_GIS	DLONG_GIS	LINE	STOP_NUM	STOP_TYPE	STREET_DIR
## 1	30448	Essex	40.72093	-74.22520	37	17819	NS	N
## 2	30449	Essex	40.72093	-74.22520	107	17819	NS	N
## 3	30450	Essex	40.72115	-74.22518	90	17841	NS	S
## 4	30451	Essex	40.79417	-74.23053	97	19442	NS	N
## 5	30452	Essex	40.79419	-74.23067	97	19445	FS	S
## 6	30453	Essex	40.77684	-74.17063	99	18659	NS	E

Creating simple features from a CSV

- After loading the CSV formatted data, we convert to a simple features format with the function `st_as_sf()` from library `sf`
- We don't know the CRS, so we guess a common one: WGS84 (not recommended in real life)

```
library(sf)
```

```
## Linking to GEOS 3.8.1, GDAL 3.2.1, PROJ 7.2.1; sf_use_s2() is TRUE
```

```
bus_sf <- bus_csv %>% st_as_sf(., coords=c("DLONG_GIS", "DLAT_GIS"), crs=WGS84)
```


Creating simple features from a CSV

metadata







```
## Simple feature collection with 6 features and 10 fields
## Geometry type: POINT
## Dimension: XY
## Bounding box: xmin: -74.23067 ymin: 40.72093 xmax: -74.17063 ymax: 40.79419
## Geodetic CRS: WGS 84
```

data

```
##      FID COUNTY LINE STOP_NUM STOP_TYPE STREET_DIR      DESCRIPTION_BSL
## 1 30448  Essex   37    17819      NS      N GROVE ST AT HERPERS ST
## 2 30449  Essex  107    17819      NS      N GROVE ST AT HERPERS ST
## 3 30450  Essex   90    17841      NS      S GROVE ST AT HERPERS ST
## 4 30451  Essex   97    19442      NS      N HARRISON AVE AT ELM ST
## 5 30452  Essex   97    19445      FS      S HARRISON AVE AT ELM ST
## 6 30453  Essex   99    18659      NS      E HELLER PKWY AT LAKE ST
##      DIRECTION_OP      MUNICIPALITY      GlobalID
## 1              Ou  IRVINGTON TWP  9dd47d93-3ac8-4167-85bd-20fefa063e33
## 2              Ou  IRVINGTON TWP  f3cde248-5286-4a0d-8710-94c38b3bafd8
## 3              Ou  IRVINGTON TWP  8fc8919f-8a25-4eec-aa65-f5c9d6d793dd
## 4              In  WEST ORANGE TWP  65a3bde8-d8f0-475d-9f49-ff86a81d387f
## 5              Ou  WEST ORANGE TWP  4a3fa65f-a13a-4f07-bfcd-977f7562c5c4
## 6              In  NEWARK          70298ad9-9b33-419d-b883-1d2434264126
##
##      geometry
## 1 POINT (-74.2252 40.72093)
## 2 POINT (-74.2252 40.72093)
## 3 POINT (-74.22518 40.72115)
## 4 POINT (-74.23053 40.79417)
## 5 POINT (-74.23067 40.79419)
## 6 POINT (-74.17063 40.77684)
```

Shapefile basics

- Shapefiles are really collections of files

 Bus_Stops_of_NJ_Transit.dbf	dBASE table file
 Bus_Stops_of_NJ_Transit.shp	Main file
 Bus_Stops_of_NJ_Transit.shx	Index file
 Bus_Stops_of_NJ_Transit.xml	Metadata file
 Bus_Stops_of_NJ_Transit.cpg	Optional codepage file (identifies character set to use)
 Bus_Stops_of_NJ_Transit.prj	Projections definition file

Creating simple features from a shapefile

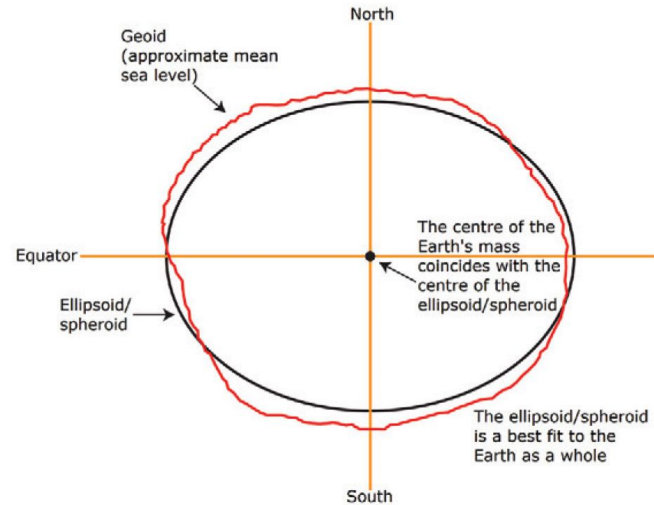
- We can load shapefiles directly with `st_read()`
- The CRS will be read from the shapefile `.prj` file

```
bus <- st_read('data/Bus_Stops_of_NJ_Transit.shp')
```

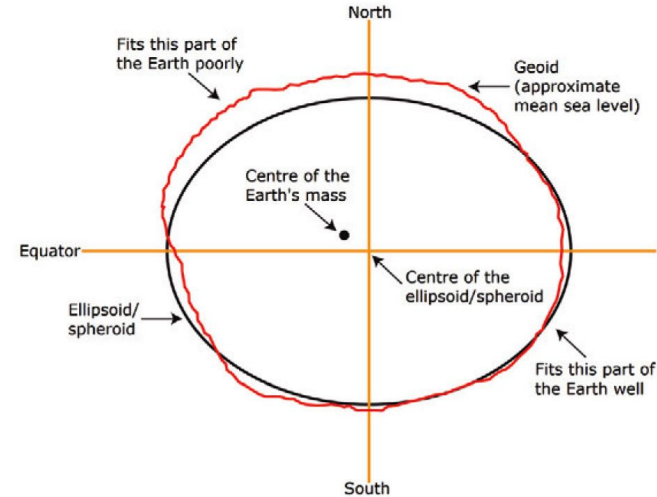
```
## Reading layer 'Bus_Stops_of_NJ_Transit' from data source
##   '/Users/kpierce/data_trainings/PAP-TACC-2022/data/Bus_Stops_of_NJ_Transit.shp'
##   using driver 'ESRI Shapefile'
## Simple feature collection with 30499 features and 12 fields
## Geometry type: MULTIPOINT
## Dimension:      XY
## Bounding box:   xmin: -8406962 ymin: 4712207 xmax: -8230860 ymax: 5050000
## Projected CRS: WGS 84 / Pseudo-Mercator
```

Reference frames

Geocentric (WGS84)



Regional (New Jersey state planar)



Change coordinate reference systems

- Coordinate reference systems (both geographic and projected) are described by codes
- ESRI maintains a database of codes at <https://spatialreference.org/ref/esri/>
- We'll define two CRS codes as variables so we can reference them by name, making our script easier-to-read

```
WGS84 = 4326
```

```
NJ_PLANAR = 'ESRI:102311'
```

- WGS84 is our geocentric geographic reference system
- NJ_PLANAR is our regional projected reference system

Change coordinate reference systems

```
bus_wgs84 <- st_transform(bus, crs=WGS84)
```

```
head(bus_wgs84)
```

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

```
## Geometry type: MULTIPOINT
```

```
## Dimension: XY
```

```
## Bounding box: xmin: -74.23071 ymin: 40.72092 xmax: -74.17066 ymax: 40.79424
```

```
## Geodetic CRS: WGS 84
```

Change coordinate reference systems

```
bus_nj <- st_transform(bus, crs=NJ_PLANAR)
```

```
head(bus_nj)
```

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

```
## Geometry type: MULTIPOINT
```

```
## Dimension: XY
```

```
## Bounding box: xmin: 172725.2 ymin: 209594.1 xmax: 177799.7 ymax: 217734.3
```


```
## Projected CRS: NAD_1983_HARN_StatePlane_New_Jersey_FIPS_2900
```

Map the bus stops


- Point locations
- Basemaps
- Choropleth maps

Mapping point locations

```
nj_bus_map <- ggplot() +  
  geom_sf(data=bus_wgs84, aes(color=STOP_TYPE), inherit.aes = FALSE)
```

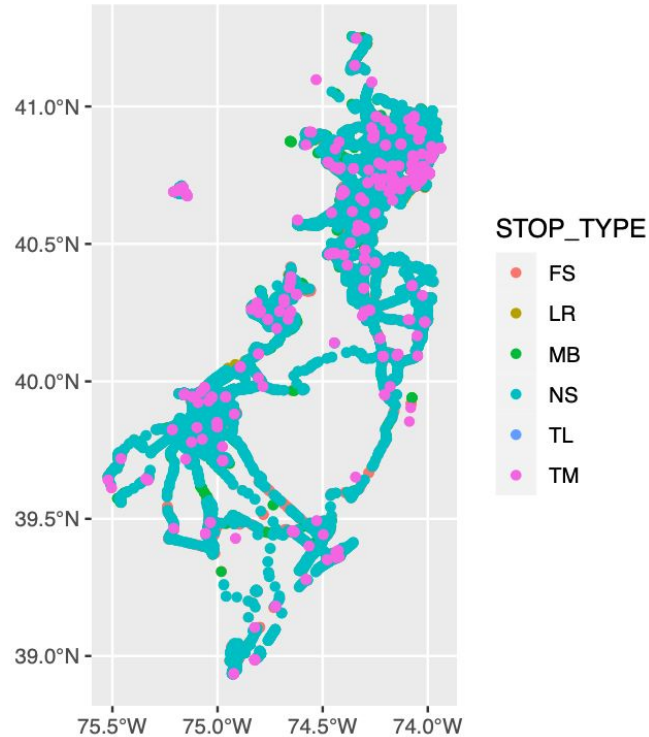


Use the unprojected WGS84 data;
`geom_sf()` will project the data onto the
map plane



color the points by the value in
column `STOP_TYPE`

Mapping point locations



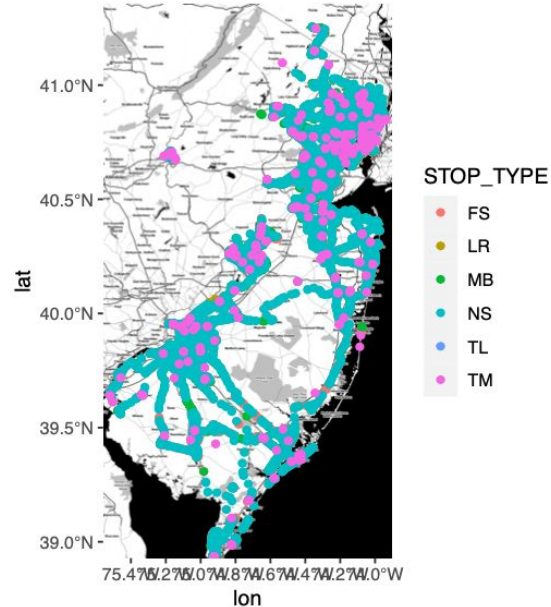
Adding map layers

- Our map needs a background to provide context
- Open Street Maps provides free map tiles
 - download tiles corresponding to bounding box
 - different tile themes available (<http://maps.stamen.com/>)
- Libraries **ggplot** and **ggmap** allow us to build layered maps in R

```
nj <- read_sf(  
  'https://opendata.arcgis.com/datasets/5f45e1ece6e14ef5866974a7b57d3b95_1.geojson'  
)  
nj <- nj %>% st_transform(crs=WGS84)  
nj_bbox <- unname(st_bbox(nj))  
nj_base_map <- get_stamenmap(bbox=nj_bbox, maptype="toner", force=TRUE)
```

Adding map layers

```
library(ggmap)
nj_bus_map <- ggmap(nj_base_map) +
  geom_sf(data=bus_wgs84, aes(color=STOP_TYPE), inherit.aes = FALSE)
```



Choropleth map of 2010 population

The state boundary map we used for the bounding box contained some additional data:

```
## Simple feature collection with 6 features and 22 fields
## Geometry type: MULTIPOLYGON
## Dimension: XY
## Bounding box: xmin: -75.41973 ymin: 38.92852 xmax: -73.90245 ymax: 41.13372
## Geodetic CRS: WGS 84
## # A tibble: 6 x 23
##   OBJECTID COUNTY COUNTY_LABEL CO GNIS_NAME GNIS FIPSSTCO FIPSCO ACRES
##   <int> <chr> <chr> <chr> <chr> <chr> <chr> <chr> <dbl>
## 1 1 ATLANTIC Atlantic Cou~ ATL County o~ 8822~ 34001 1 3.91e5
## 2 2 BERGEN Bergen County BER County o~ 8822~ 34003 3 1.53e5
## 3 3 BURLINGTON Burlington C~ BUR County o~ 8822~ 34005 5 5.25e5
## 4 4 CAMDEN Camden County CAM County o~ 8822~ 34007 7 1.46e5
## 5 5 CAPE MAY Cape May Cou~ CAP County o~ 8822~ 34009 9 1.83e5
## 6 6 CUMBERLAND Cumberland C~ CUM County o~ 8822~ 34011 11 3.21e5
## # ... with 14 more variables: SQ_MILES <dbl>, POP2010 <int>, POP2000 <int>,
## # POP1990 <int>, POP1980 <int>, POPDEN2010 <int>, POPDEN2000 <int>,
## # POPDEN1990 <int>, POPDEN1980 <int>, REGION <chr>, GLOBALID <chr>,
## # Shape_Length <dbl>, Shape_Area <dbl>, geometry <MULTIPOLYGON [°]>
```

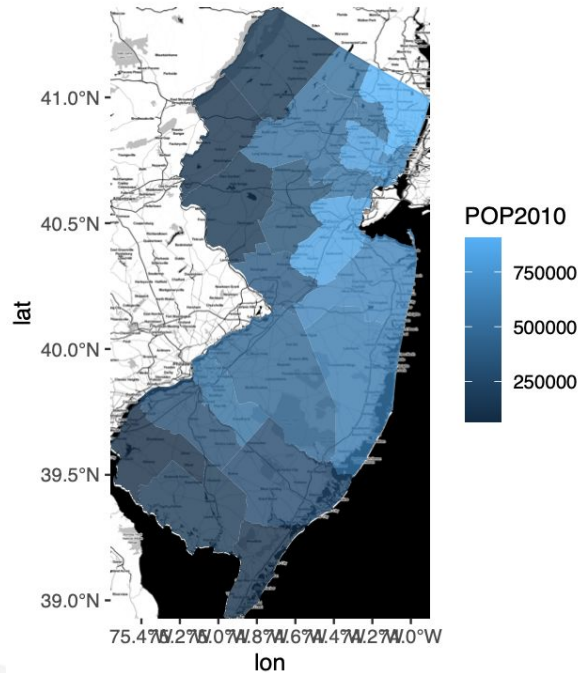
Choropleth map of 2010 population

The state boundary map we used for the bounding box contained some additional data:

```
## Simple feature collection with 6 features and 22 fields
## Geometry type: MULTIPOLYGON
## Dimension: XY
## Bounding box: xmin: -75.41973 ymin: 38.92852 xmax: -73.90245 ymax: 41.13372
## Geodetic CRS: WGS 84
## # A tibble: 6 x 23
##   OBJECTID COUNTY COUNTY_LABEL CO GNIS_NAME GNIS FIPSSTCO FIPSCO ACRES
##   <int> <chr> <chr> <chr> <chr> <chr> <chr> <chr> <dbl>
## 1 1 ATLANTIC Atlantic Cou~ ATL County o~ 8822~ 34001 1 3.91e5
## 2 2 BERGEN Bergen County BER County o~ 8822~ 34003 3 1.53e5
## 3 3 BURLINGTON Burlington C~ BUR County o~ 8822~ 34005 5 5.25e5
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## # ... with 14 more variables: SQ_MILES <dbl>, POP2010 <int>, POP2000 <int>,
## # POP1990 <int>, POP1980 <int>, POPDEN2010 <int>, POPDEN2000 <int>,
## # POPDEN1990 <int>, POPDEN1980 <int>, REGION <chr>, GLOBALID <chr>,
## # Shape_Length <dbl>, Shape_Area <dbl>, geometry <MULTIPOLYGON [°]>
```

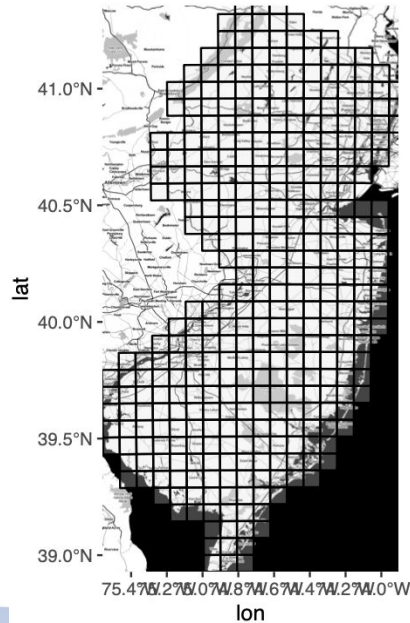
Choropleth map of 2010 population

```
nj_map <- ggmap(nj_base_map) +  
  geom_sf(data=nj, aes(fill=POP2010), inherit.aes = FALSE, color = NA, alpha = 0.8)
```

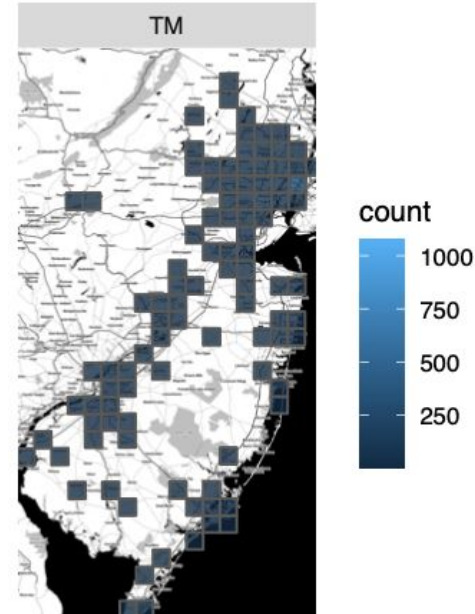


Gridded (“fishnet”) mappings

Overlay grid



Aggregate points into grid cells



Define spatial extent for 5-mi grid

- project the NJ border into the regional planar CRS
- convert 5-mile grid to meters (1,609m/mi)
- remove interior county borders from shape

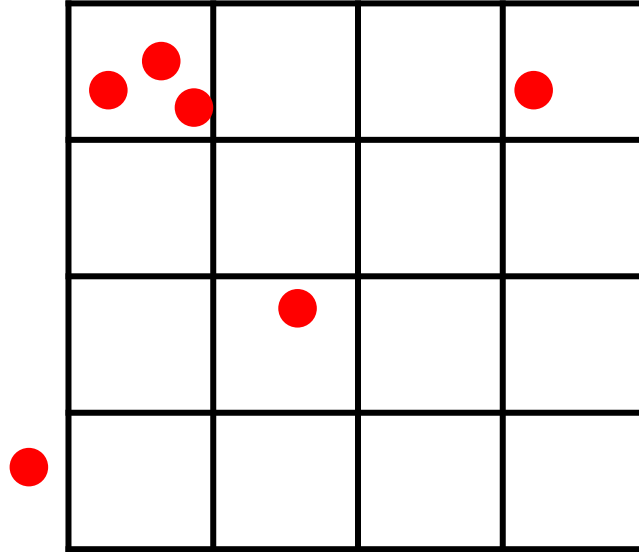
```
nj_flat <- st_transform(nj, crs=NJ_PLANAR)
fishnet_width <- 1609 * 5
```

```
nj_border <- st_make_valid(st_union(nj_flat))
```

Create grid and convert to sf

```
net <- st_make_grid(  
  x=nj_border, cellsize=fishnet_width, what='polygons', square=TRUE, crs=NJ_PLANAR  
)  
net_agg <- st_as_sf(net) %>% tibble::rowid_to_column(., "net_id")  
net_intersect <- st_intersects(nj_border, net_agg)  
fishnet <- net_agg[unique(unlist(net_intersect)),]
```

Point-in-polygon join



Point-in-polygon join

```
bus_net <- st_join(bus_nj, fishnet, join=st_within) %>%  
  st_drop_geometry()
```

- point data is left argument
- polygon data is right argument
- polygon geometry is implicitly dropped by st_join, and only point geometry is retained
- we intentionally drop point geometry to retain only the bus stop ID data and the fishnet ID data

Finalize bus stop fishnet

Aggregate on net_id

```
bus_net_summary <- bus_net %>%  
  group_by(net_id, STOP_TYPE) %>%  
  summarise(count=n())
```

Rejoin fishnet geometry

```
bus_net_final <- st_as_sf(  
  left_join(  
    fishnet,  
    bus_net_summary,  
    by='net_id'  
  ),  
  crs=st_crs(fishnet))
```

Map bus stop counts by type

```
bus_type_map <- ggmap(nj_base_map) +  
  geom_sf(  
    data=st_transform(bus_net_final, crs=WGS84),  
    aes(fill=count),  
    inherit.aes = FALSE, alpha=0.8  
  ) +  
  facet_wrap(facets='STOP_TYPE', nrow=3)  
bus_type_map
```

