

2018-07-15 Tokyo.R#71



A guide to spatial data analysis with the tidyverse

Shinya Uryu

 **@u_ribo**

 **@uribo**



A guide to spatial data analysis with the tidyverse

Overview

- 1. About the spatial data in R**
- 2. r-spatial + tidyverse**

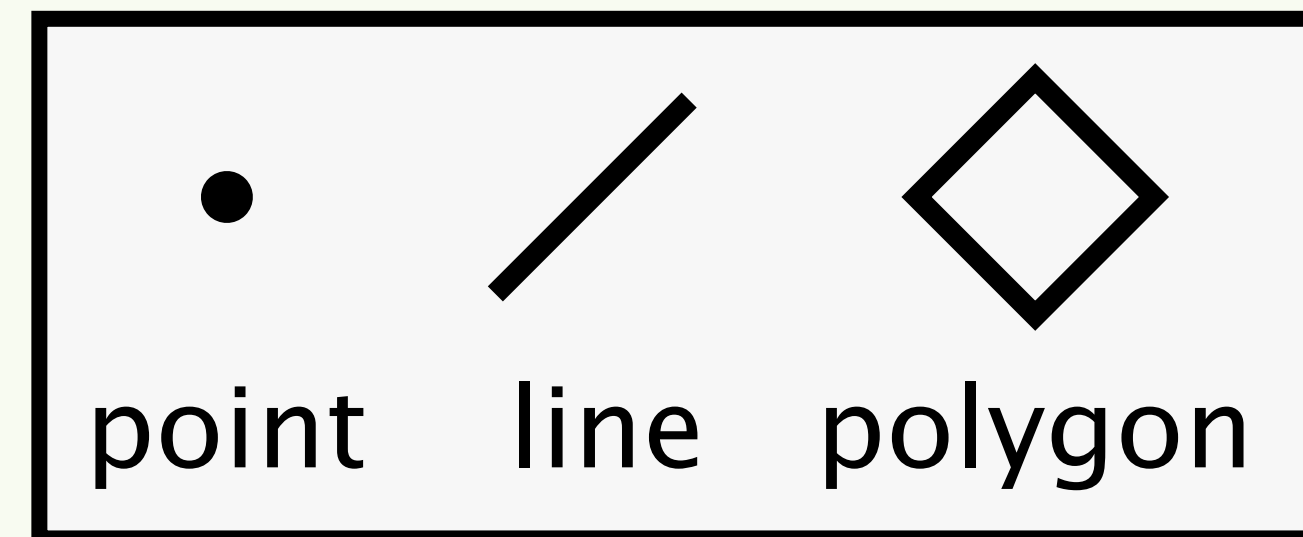
Case Study: Flood and rain disaster in western Japan

Brief history of spatial data in

2005

sp package ^{rdgal}

- Classes and Methods for Spatial Data
- S4 methods
- *Spatial** class (vector)
- lattice based graphics



2010

raster package

ggplot2::geom_raster(),
ggplot2::geom_map() etc.,

maptools

rasterVis package
leaflet package
tmap package

2016

sf package

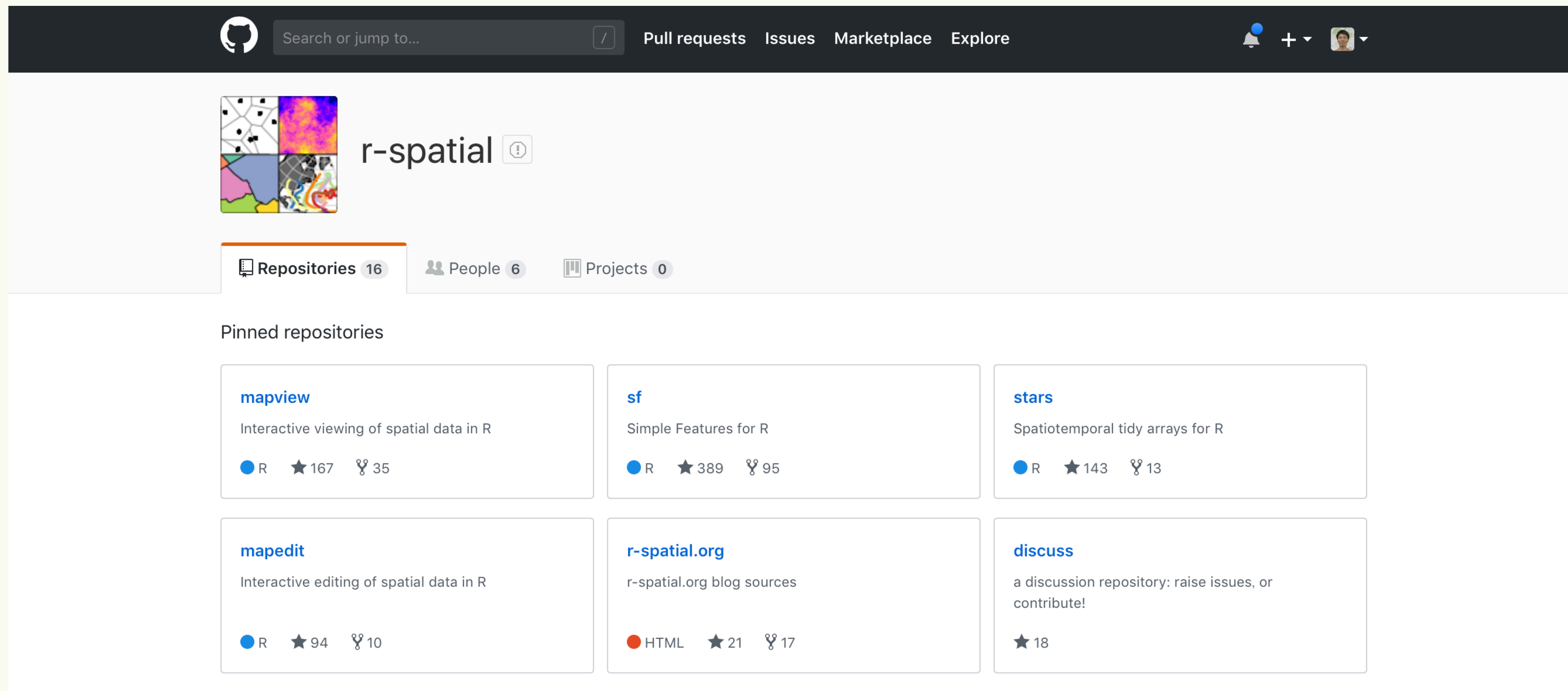
BIG BANG

mapview package
stars package
(...under development)

- tidy manifest
- list-column data frame
- pipe friendly APIs

ggplot2::geom_sf

r-spatial



The screenshot shows the GitHub profile page for the organization 'r-spatial'. At the top, there is a dark navigation bar with the GitHub logo, a search bar, and links for 'Pull requests', 'Issues', 'Marketplace', and 'Explore'. The profile header includes the organization's name 'r-spatial' and a repository icon. Below this, there are tabs for 'Repositories 16', 'People 6', and 'Projects 0'. The 'Pinned repositories' section displays six repositories in a grid:

Repository Name	Description	Language	Stars	Forks
mapview	Interactive viewing of spatial data in R	R	167	35
sf	Simple Features for R	R	389	95
stars	Spatiotemporal tidy arrays for R	R	143	13
mapedit	Interactive editing of spatial data in R	R	94	10
r-spatial.org	r-spatial.org blog sources	HTML	21	17
discuss	a discussion repository: raise issues, or contribute!		18	

<https://github.com/r-spatial>

sf

> **library(sf) # version 0.6-3**

> **Linking to GEOS 3.6.1, GDAL 2.1.3,
proj.4 4.9.3**

Simple feature

To storage and access
model of most geometry types.

In `sf`, represents
simple features as R objects.

```
st_point(c(1, 2)) # X, Y Coordinates
#> POINT (1 2)
st_point(c(1, 2, 3)) # Added Z dimensions
#> POINT Z (1 2 3)

st_linestring(matrix(1:4, ncol = 2))
#> LINESTRING (1 3, 2 4)
```

```
st_polygon(list(
  rbind(
    st_point(c(1, 1)),
    st_point(c(2, 1)),
    st_point(c(2, 2)),
    st_point(c(1, 2)),
    st_point(c(1, 1)))
))
#> POLYGON ((1 1, 2 1, 2 2, 1 2, 1 1))
```

all functions
start with the prefix
“st_”
(spatial and
temporal)

3 types of the sf object

```
library(jpndistrict)
#> Loading required package: jpmesh
#> This package provide map data is based on the Digital Map 25000
#> (Map Image) published by Geospatial Information Authority of Japan
#> (Approval No.603FY2017 information usage <http://www.gsi.go.jp>)
(sf_pref33 <- jpn_pref(33))
#> Simple feature collection with 30 features and 4 fields
#> geometry type: GEOMETRY
#> dimens.
#> bbox:
#> epsg (SRID): 4326
#> proj4st: +no_defs
#> # A tibble
#>   pref_code prefecture city_code city geometry
#>   <chr>      <chr>      <chr>  <chr> <GEOMETRY [°]>
#> 1 33 岡山県 33101 岡山市 北区 POLYGON ((133.9098 34.948, ...|
#> 2 33 岡山県 33102 岡山市 中区 MULTIPOLYGON (((133.9747, ...|
#> 3 33 岡山県 33103 岡山市 南区 MULTIPOLYGON (((133.9958, ...|
#> 4 33 岡山県 33104 岡山市 東区 MULTIPOLYGON (((133.9109, ...|
#> 5 33 岡山県 33202 倉敷市 MULTIPOLYGON (((133.6414, ...|
```

sfc: Simple feature geometry list-column

sf: Simple feature

sfg: Simple feature geometry

3 types of the sf object

sf > sfc > sfg

```
class(sf_pref33)
#> [1] "sf"          "tbl_df"
      "tbl"          "data.frame"
class(sf_pref33$geometry)
#> [1] "sfc_GEOMETRY" "sfc"
class(sf_pref33$geometry[[1]])
#> [1] "XY"          "POLYGON" "sfg"
```

Seamlessly convert
each sf objects.

```
(x <- st_point(c(1, 2)))
#> POINT (1 2)
x %>%
  st_sfc()
#> Geometry set for 1 feature
#> geometry type: POINT
#> dimension: XY
#> bbox: xmin: 1 ymin: 2 xmax: 1 ymax: 2
#> epsg (SRID): NA
#> proj4string: NA
#> POINT (1 2)
x %>%
  st_sfc() %>%
  st_sf()
#> Simple feature collection with 1 feature and 0 fields
#> geometry type: POINT
#> dimension: XY
#> bbox: xmin: 1 ymin: 2 xmax: 1 ymax: 2
#> epsg (SRID): NA
#> proj4string: NA
#> geometry
#> 1 POINT (1 2)
```

I/O

Standard GIS file formats

- shapefile
- geojson (as strings)
- kml

```
st_read(system.file("shape/nc.shp",  
                    package = "sf"))  
  
st_write(nc, "nc.shp")
```

Relational Database

- PostgreSQL

well known-text (WKT),

well known-binary (WKB) formats

Geo-processing functions

Provided like a **PostGIS** functions.

- *st_distance()*, *st_area()*, *st_make_gird()* etc.,

```
st_area(sf_pref33)
#> Units: m^2
#> [1] 451746760 51433590 161417813 133400415 357919550 507973617 107320002
#> [8] 136991748 245082627 212789693 548694329 794535530 260097992 127276525
#> [15] 210361376 830459441 430381734 67080736 144833382 7786478 12264588
#> [22] 91311276 67191543 420647698 54742098 70131416 58399305 79252153
#> [29] 232806322 269530873
st_bbox(sf_pref33)
#> xmin ymin xmax ymax
#> 133.26669 34.29839 134.41322 35.35286 # My Hometown (Tsukuba)
st_distance(st_sfc(st_point(c(140.10, 36.08))), crs = 4326),
            st_sfc(st_point(c(139.74, 35.68))), crs = 4326) # Here
#> Units: m
#> [,1]
#> [1,] 55014.41
```

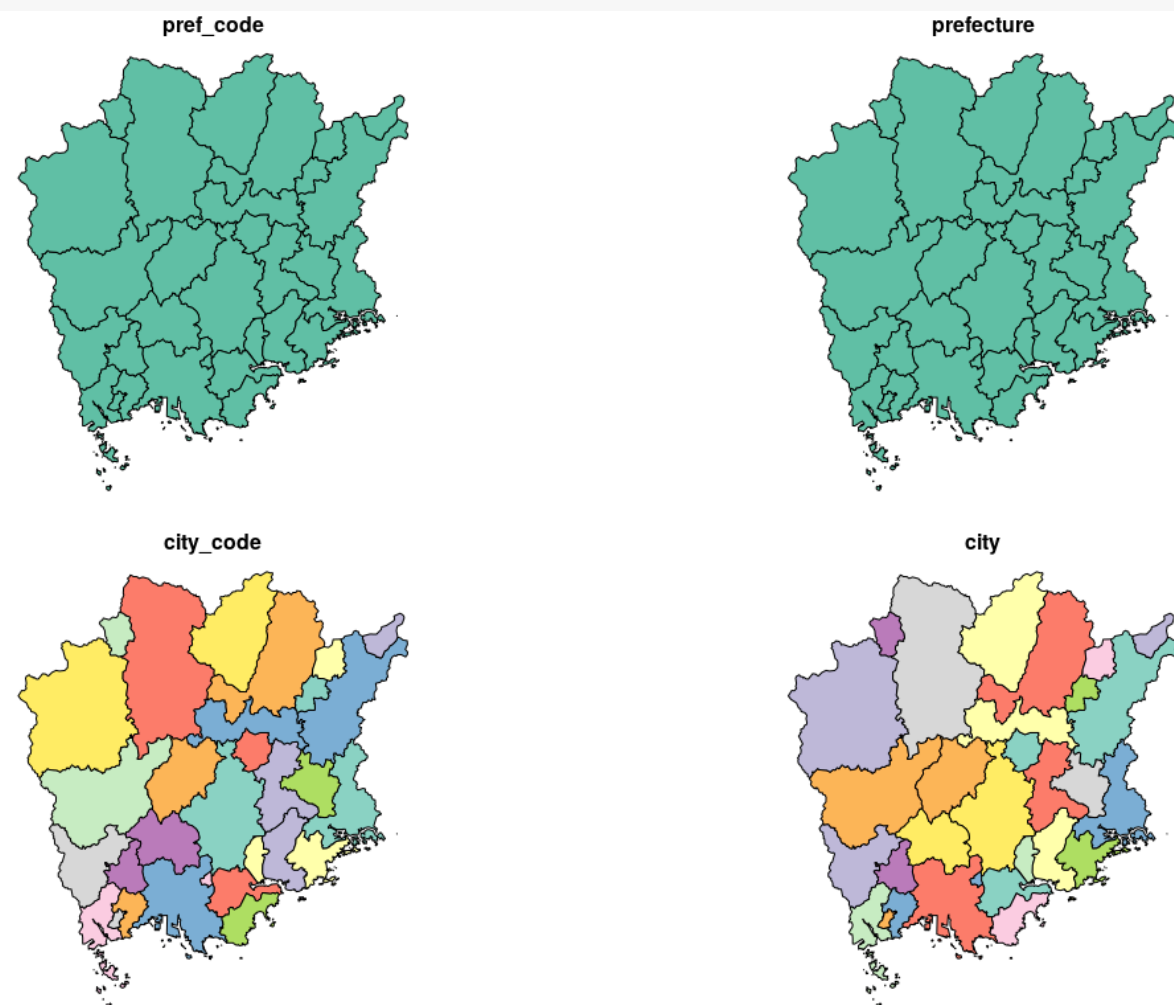
Another support functions found on **lwgeom** pkgs.

mapping & visualization

plot.sf*(): S3 method for sf

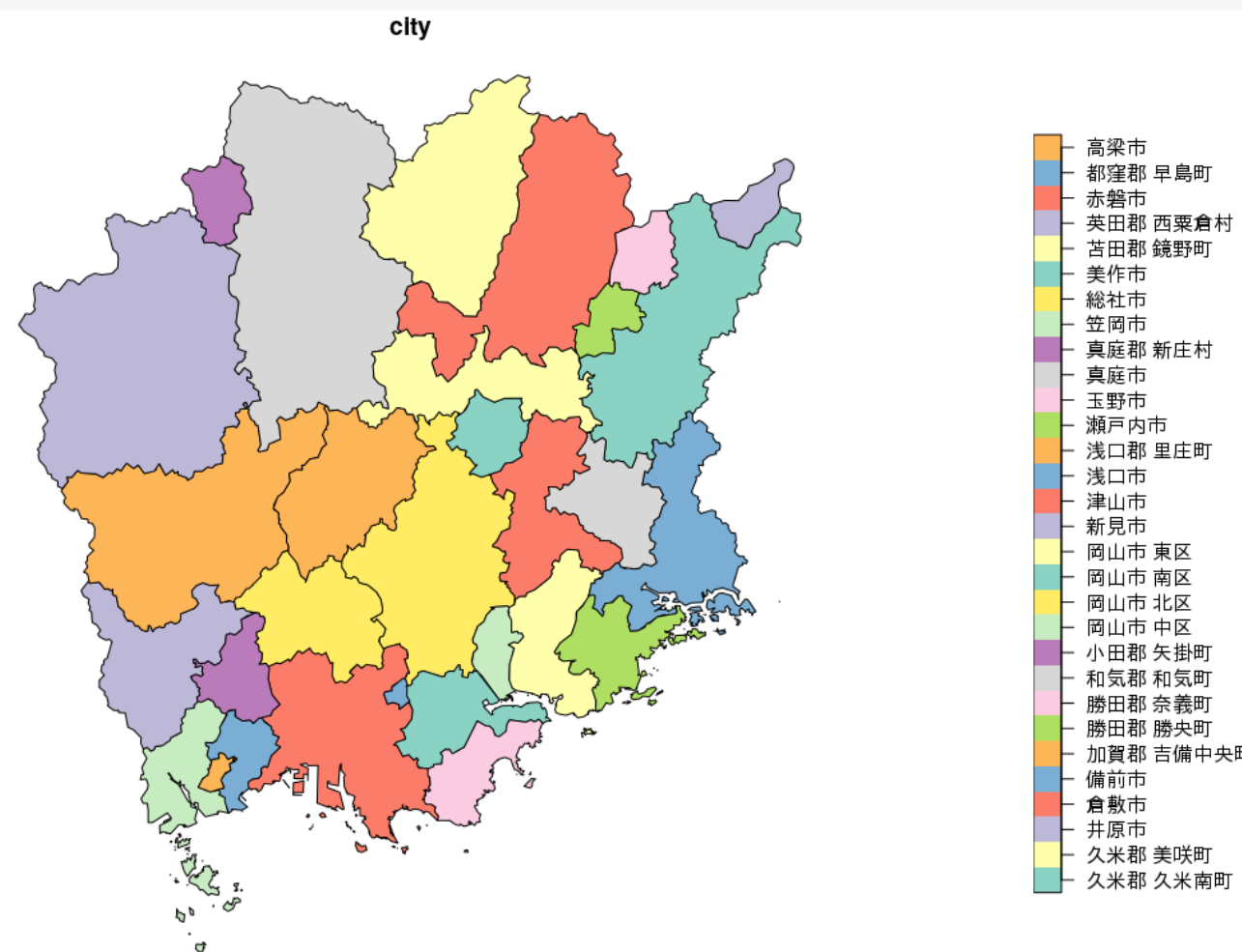
ALL

```
plot(sf_pref33)  
# Drawing the first 10 out  
of all attributes  
# Set by max.plot
```



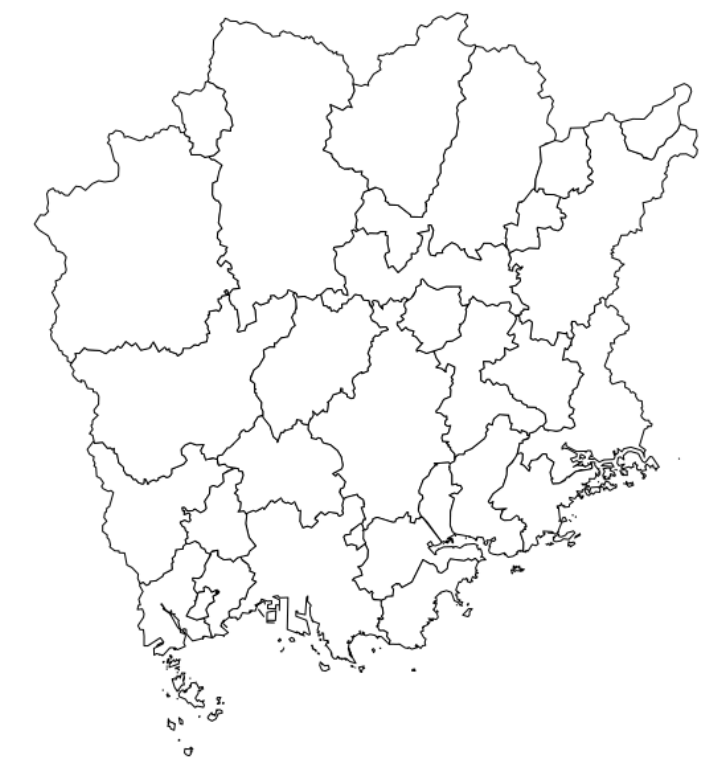
SELECT

```
plot(sf_pref33["city"],  
     key.pos = 4,  
     key.width = lcm(5),  
     key.length = 0.8)
```



GEOMETRY

```
plot(st_geometry(sf_pref33),  
     col = "white")
```

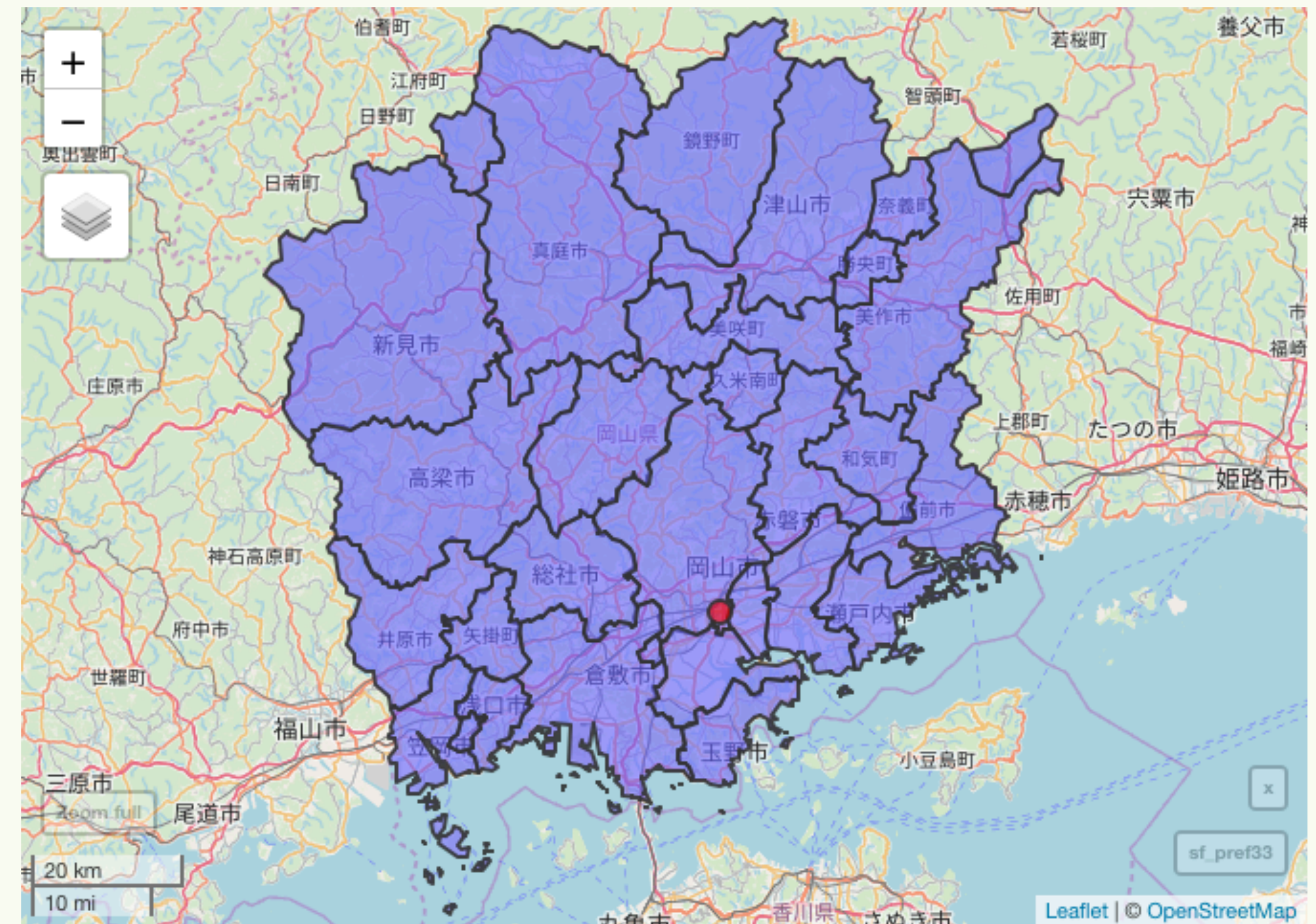


Interactive mapping with mapview

*Raster** (raster), *Spatial** (sp) and sf

```
library(mapview)
#> Okayama City Administration
st_sfc(
  st_point(c(133.9196,
            34.65511)),
  crs = 4326)

mapview(sf_pref33) +
  mapview(x,
    col.regions = "red")
```



r-spatial meets

tidyverse

```
> library(tidyverse) # version 1.2.1
```

```
— Attaching packages —
```

```
tidyverse 1.2.1 —
```

```
✓ ggplot2 3.0.0    ✓ purrr 0.2.5
```

```
✓ tibble 1.4.2    ✓ dplyr 0.7.6
```

```
✓ tidyr 0.8.1    ✓ stringr 1.3.1
```

```
✓ readr 1.1.1    ✓ forcats 0.3.0
```

```
— Conflicts —
```

```
tidyverse_conflicts() —
```

```
✗ dplyr::filter() masks stats::filter()
```

```
✗ dplyr::lag() masks stats::lag()
```


Case Study: Flood and rain disaster in western Japan

The Heavy Rain Event on July 2018 (平成30年7月豪雨).

A total of 11 prefectures that emergency heavy rain warnings areas.

As of 14 July, 197 were dead in various rain-related incidents.

According to the Fire and Disaster Management Agency

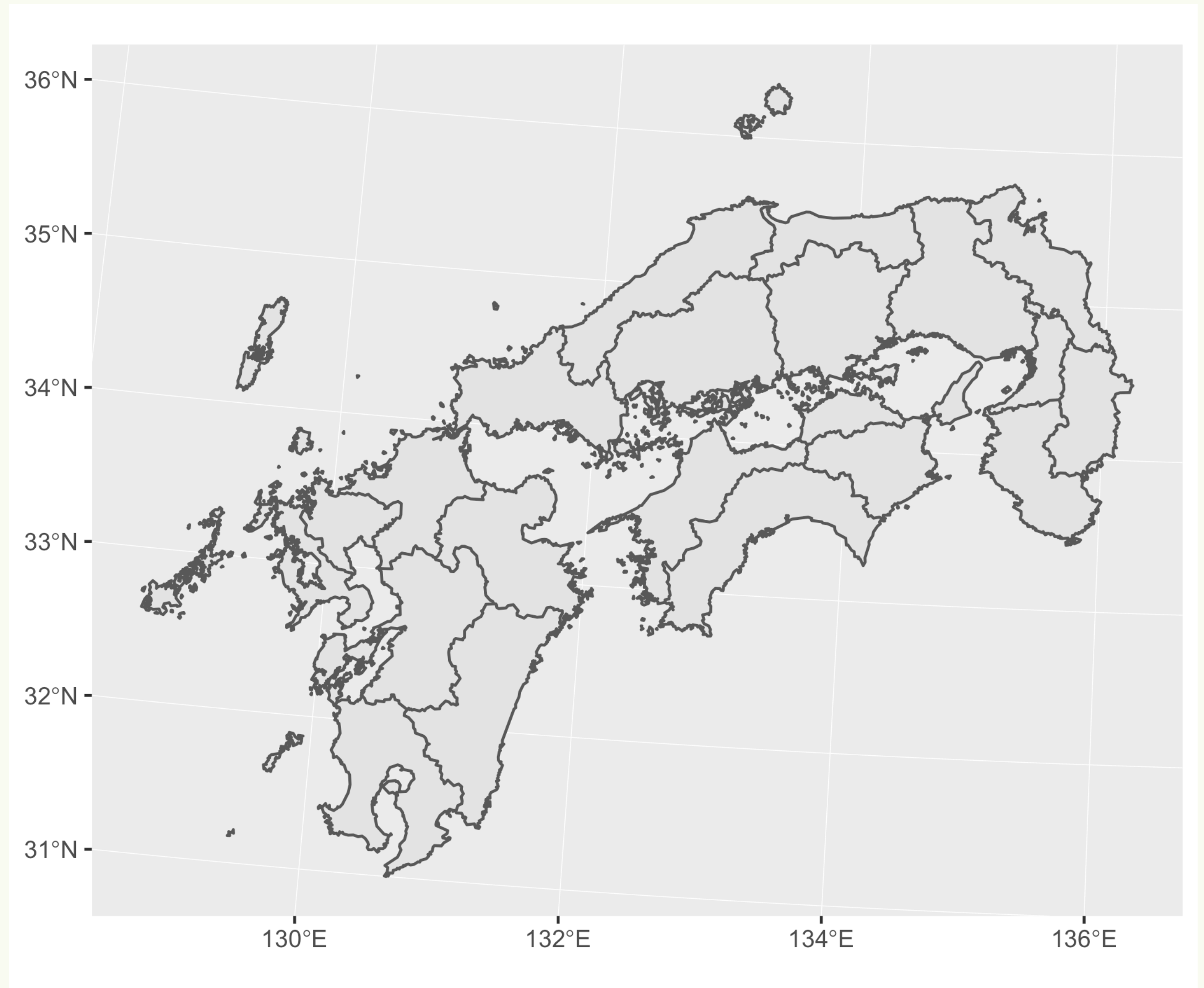
Create base map with purrr

```
# Provided by National Spatial Planning and Regional  
# Policy Bureau, MILT of Japan  
sf_west_japan <-  
  26:46 %>%  
  map(jpn_pref, district = FALSE) %>%  
  # Unused map_dfr() ... bind_rows() not support sf class  
  reduce(rbind)  
  
format(object.size(sf_west_japan), units = "MB")  
# [1] "18.1 Mb"  
  
# Area cropped and simplified polygon  
sf_west_japan <-  
  st_crop(  
    sf_west_japan,  
    st_bbox(c(xmin = 128.5, ymin = 31.0, xmax = 136.5, ymax = 36.5))  
  ) %>%  
  # Reduce object size  
  st_simplify(preserveTopology = TRUE, dTolerance = 0.005)  
  
format(object.size(sf_west_japan), units = "MB")  
# [1] "1 Mb"
```

Mapping by `ggplot2::geom_sf()`

```
sf_west_japan <-  
  sf_west_japan %>%  
  st_transform(  
    crs = "+proj=laea  
          +lat_0=30  
          +lon_0=140")
```

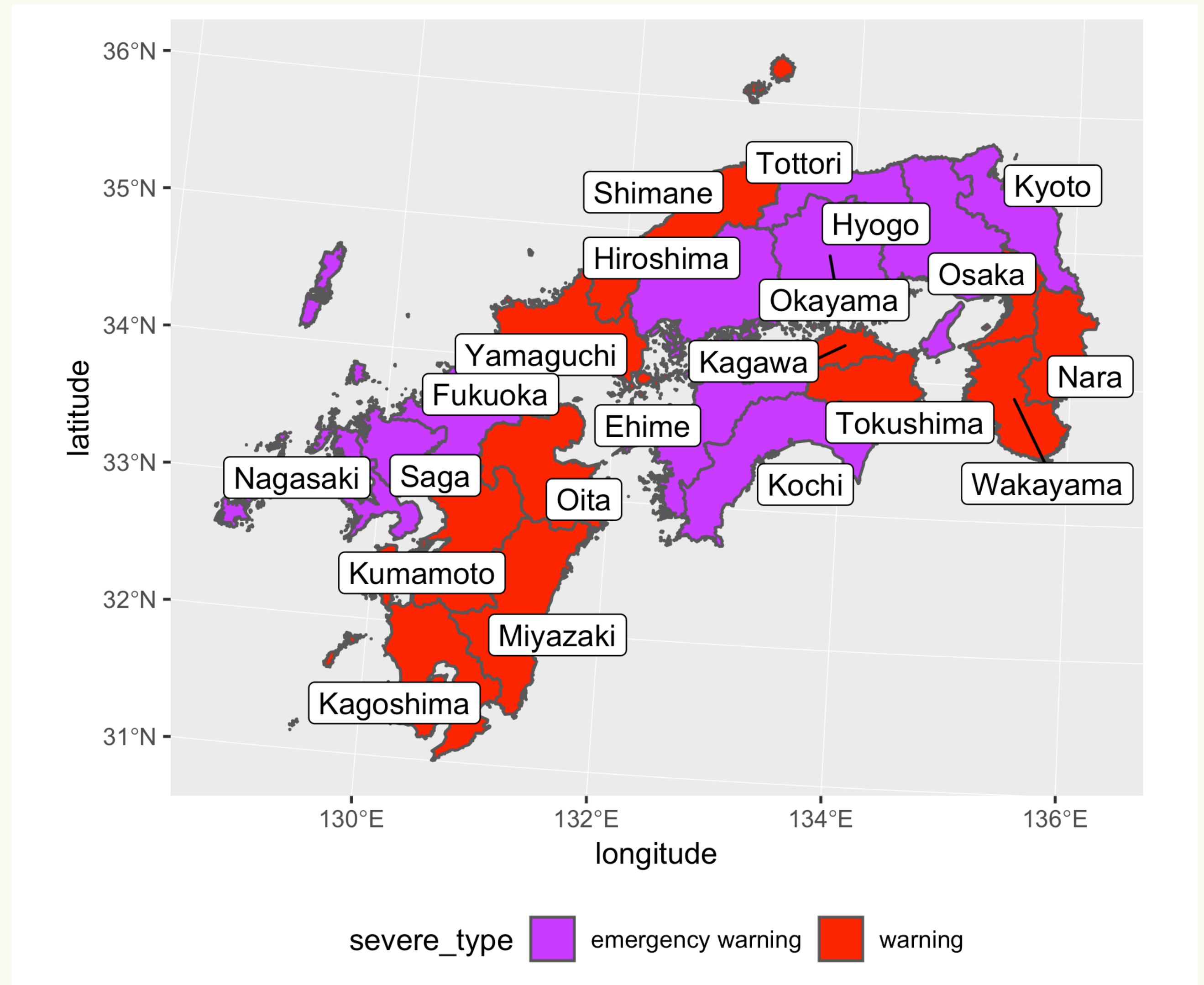
```
base_map <-  
  ggplot(sf_west_japan) +  
    geom_sf()
```



Mapping by ggplot2::geom_sf()

🌈 Brush-up 🌟

```
df_west_japan <-  
  sf_west_japan %>%  
  mutate(  
    longitude =  
  st_coordinates(st_centroid(geometry))[, 1],  
    latitude =  
  st_coordinates(st_centroid(geometry))[, 2]) %>%  
  st_set_geometry(NULL)  
  
base_map +  
  ggrepel::geom_label_repel(  
    data = df_west_japan,  
    aes(x = longitude,  
        y = latitude,  
        label = prefecture)) +  
  coord_sf()
```



Downloading weather data from *JMIA*

Japan Meteorological Agency

```
> remotes::install_git("https://gitlab.com/uribo/jmastats")
```

```
> library(jmastats) # ⚠ Under Development 🚧
```


Access to Japan Meteorological Agency Data

Not provided API 🥵

We can extract contents with rvest package.

The screenshot shows the JMA website's search page for historical data. It includes a search bar, navigation tabs for 'Home', 'Disaster Information', 'Various Data & Materials', 'Knowledge & Explanations', 'About JMA', and 'Inquiries & Applications'. The main content area is titled '過去の気象データ検索' (Search for Past Weather Data) and offers options to search by location and date. A 'Data Type' section lists various options like 'Yearly values', '3-month values', 'Monthly values', etc. A 'New Information' section at the bottom provides updates on observation site changes and data corrections.

The screenshot shows a detailed hourly weather data table for '2018年7月6日 (1時間ごとの値)'. The table includes columns for time, precipitation (mm), temperature (°C), wind speed and direction (m/s), sunshine duration (h), and snow (cm). The data is presented in a clear, structured format.

時	降水量 (mm)	気温 (°C)	風速・風向(m/s)		日照時間 (h)	雪(cm)	
			風速	風向		降雪	積雪
1	2.0	20.9	0.2	静穏		///	///
2	2.0	21.0	0.0	静穏		///	///
3	3.5	21.2	1.4	南西		///	///
4	8.0	21.1	0.0	静穏		///	///
5	22.5	21.8	0.6	北東		///	///
6	12.5	21.7	0.9	西北西	0.0	///	///
7	9.0	21.5	0.5	北北東	0.0	///	///
8	6.5	21.3	0.3	西北西	0.0	///	///
9	8.0	22.0	0.9	南西	0.0	///	///
10	6.5	22.1	0.7	西南西	0.0	///	///
11	9.5	22.6	0.6	北東	0.0	///	///
12	30.5	22.7	1.2	北東	0.0	///	///
13	17.5	23.4	1.8	北	0.0	///	///
14	36.5	24.5	2.8	西南西	0.0	///	///
15	16.0	23.6	0.7	北西	0.0	///	///
16	25.5	23.6	1.9	南東	0.0	///	///
17	45.5	23.3	1.5	東	0.0	///	///
18	23.0	23.2	1.4	東北東	0.0	///	///
19	28.0	22.7	1.9	東北東	0.0	///	///
20	42.5	23.9	2.3	北北東	0.0	///	///
21	29.5	23.8	2.4	西		///	///
22	76.0	23.8	2.2	南		///	///
23	21.5	22.4	0.8	北北東		///	///
24	28.5	23.1	1.4	北北西		///	///

http://www.data.jma.go.jp/obd/stats/etrn/index.php

Collect weather data

```
jma_collect("hourly",
            block_no = tgt_stations$block_no[6], # 舞鶴 (Maiduru, Kyoto)
            year = 2018,
            month = 7,
            day = 5) %>%
  parse_unit()
# A tibble: 24 x 17
  time atmosphere_land_... atmosphere_surf... precipitation_mm temperature dew_point
<int> <S3: units>          <S3: units>          <S3: units>          <S3: units> <S3: uni>
1     1 1003                1003.5                0                25.7        23.2
2     2 1003.1              1003.6                0                25.4        23.5
3     3 1003.1              1003.6                0                25.3        23.4
4     4 1003.4              1003.9                0                25.1        23.5
5     5 1003.9              1004.4                0                25          23.4
# ... with 19 more rows, and 11 more variables: vapor_h_pa <S3: units>,
# humidity_percent <S3: units>, wind_speed_m_s <S3: units>,
# wind_direction_m_s <chr>, dailight_h <S3: units>,
# solar_irradiance_mj_m_2 <chr>, snow_fall_moment_cm <chr>,
# snow_fall_period_cm <chr>, weather <chr>, cloud_covering <chr>,
# visibility_km <S3: units>
```

Collect weather data

1. CRS transformed (To match polygons)
2. Convert MULTIPOINT to (single) POINT
3. Applied dplyr's verbs
 1. Check: Whether points are included in the area?

```
tgt_stations <-  
  stations %>%  
  st_transform(crs = "+proj=laea +lat_0=30 +lon_0=140") %>%  
  st_cast("POINT") %>%  
  select(area, station_type, station_name, elevation, block_no, pref_code) %>%  
  distinct(block_no, .keep_all = TRUE) %>%  
  filter(pref_code %in% 26:46) %>%  
  mutate(in_area = purrr::pmap_lgl(., ~  
                                     as.logical(sum(st_within(  
                                       ..7,  
                                       sf_west_japan,  
                                       sparse = FALSE)))))) %>%  
  filter(in_area == TRUE)
```

Collect weather data

```
df_weather <-  
  list(block_no = rep(tgt_stations$block_no, each = 3),  
        year = 2018,  
        month = 7,  
        day = rep(5:7, times = nrow(tgt_stations))) %>%  
  pmap(~ jma_collect(item = "hourly",  
                    block_no = ..1,  
                    year = ..2,  
                    month = ..3,  
                    day = ..4) %>%  
    select(time, `precipitation_(mm)`) %>%  
    parse_unit() %>%  
    transmute(block_no = c(..1),  
              date = lubridate::make_datetime(..2, ..3, ..4, hour = time),  
              precipitation_mm) %>%  
  reduce(rbind) # keep units attributes
```


Collect weather data

```
df_weather
# A tibble: 26,136 x 3
  block_no date                precipitation_mm
  <chr>     <dtm>                       <S3: units>
1 1578     2018-07-05 01:00:00 0
2 1578     2018-07-05 02:00:00 1.5
3 1578     2018-07-05 03:00:00 1
# ... with 26,133 more rows
```

```
df_precipitation <-
  df_weather %>%
  group_by(block_no) %>%
  summarise(precipitation = sum(precipitation_mm))
# A tibble: 363 x 2
  block_no precipitation
  <chr>     <S3: units>
1 0588     355
2 0589     466
3 0593     439.5
# ... with 360 more rows
```

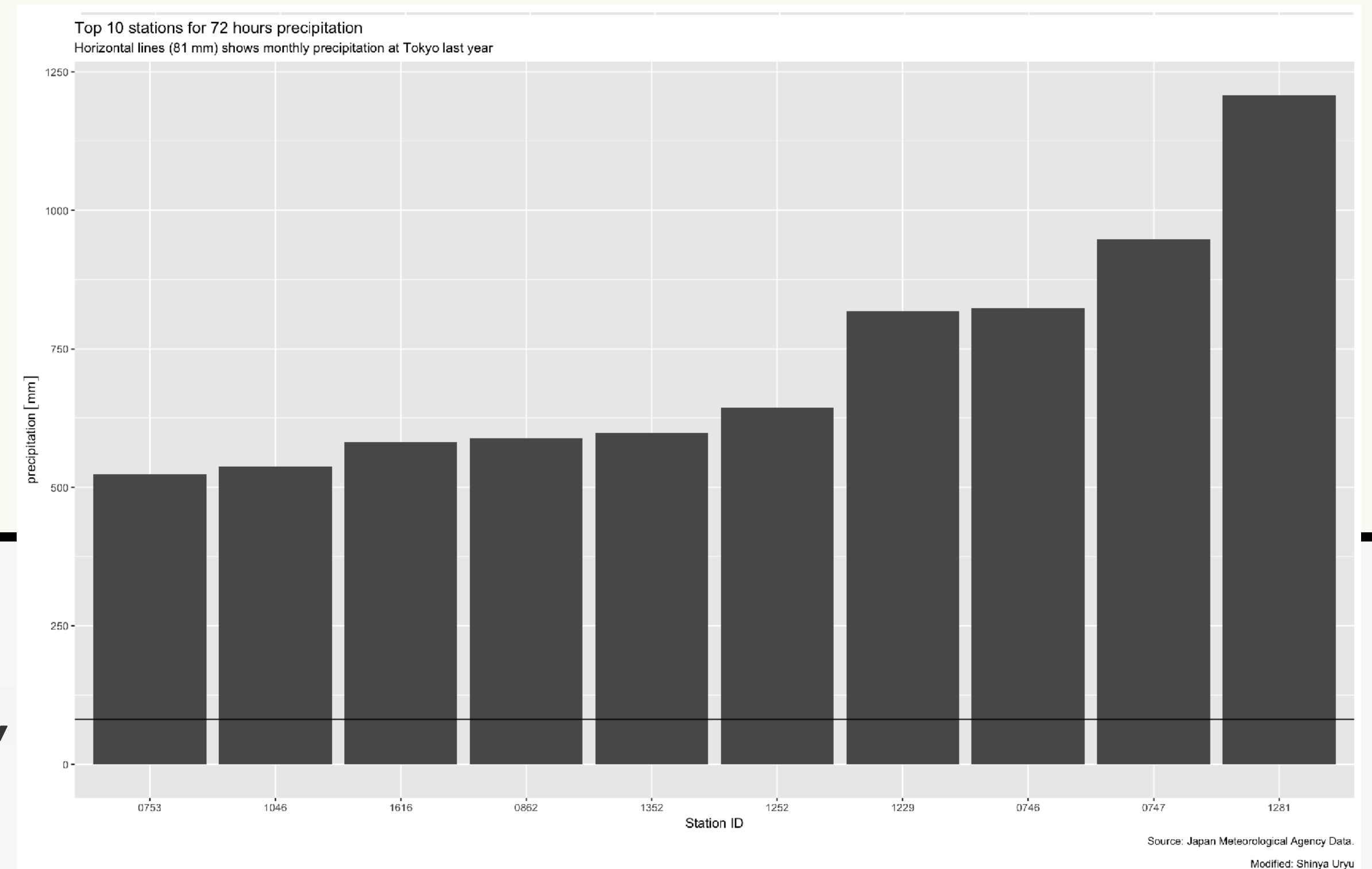
Top 10 stations for 72 hours precipitation

```
df_precipitation_top10 <-  
  df_precipitation %>%  
  top_n(10, wt = precipitation)
```



```
library(ggforce) # For display "units"
```

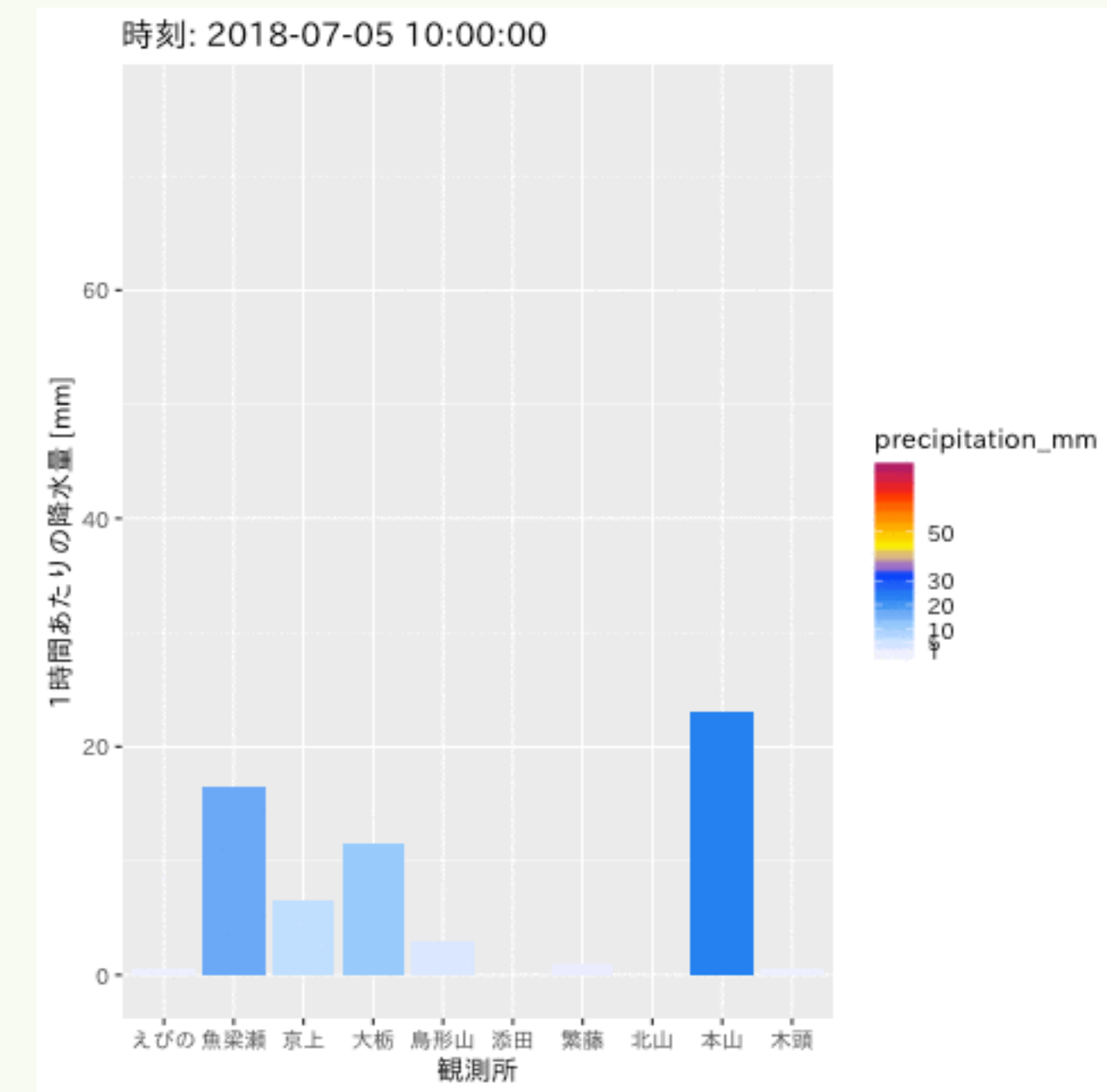
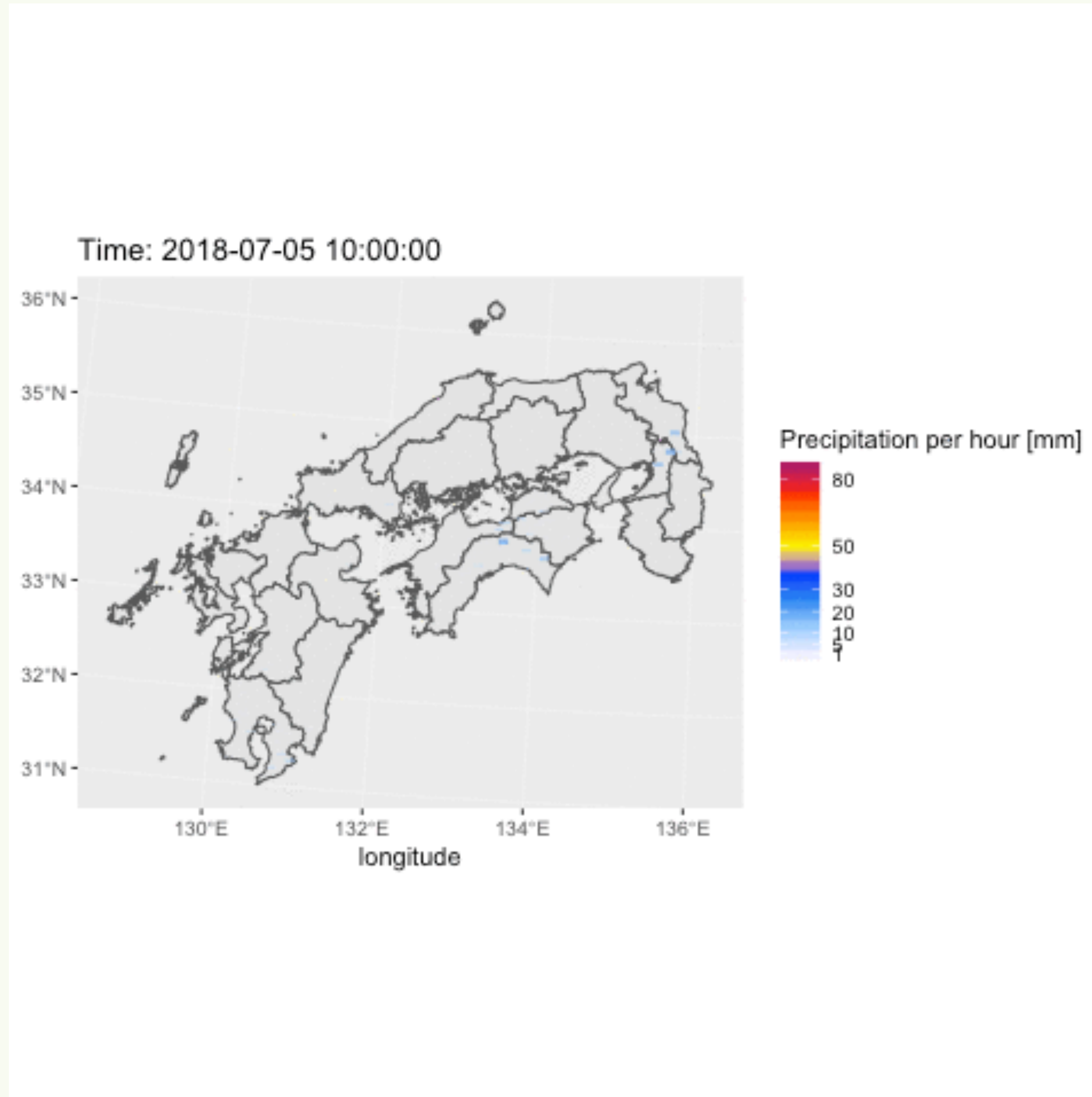
```
ggplot(df_precipitation_top10,  
  aes(forcats::fct_reorder(block_no,  
    units::drop_units(precipitation)),  
    precipitation)) +  
  geom_bar(stat = "identity") +  
  geom_hline(yintercept = 81) +  
  labs(x = "Station ID",  
    title = "Top 10 stations for 72 hours precipitation",  
    subtitle = "Horizontal lines (81 mm) shows monthly precipitation at Tokyo last year",  
    caption = "Source: Japan Meteorological Agency Data.\nModified: Shinya Uryu")
```



mapping plus animation

```
> remotes::install_github("thomasp85/gganimate")  
> library(gganimate) # version 0.9.9.9999
```

Mapping on precipitation values

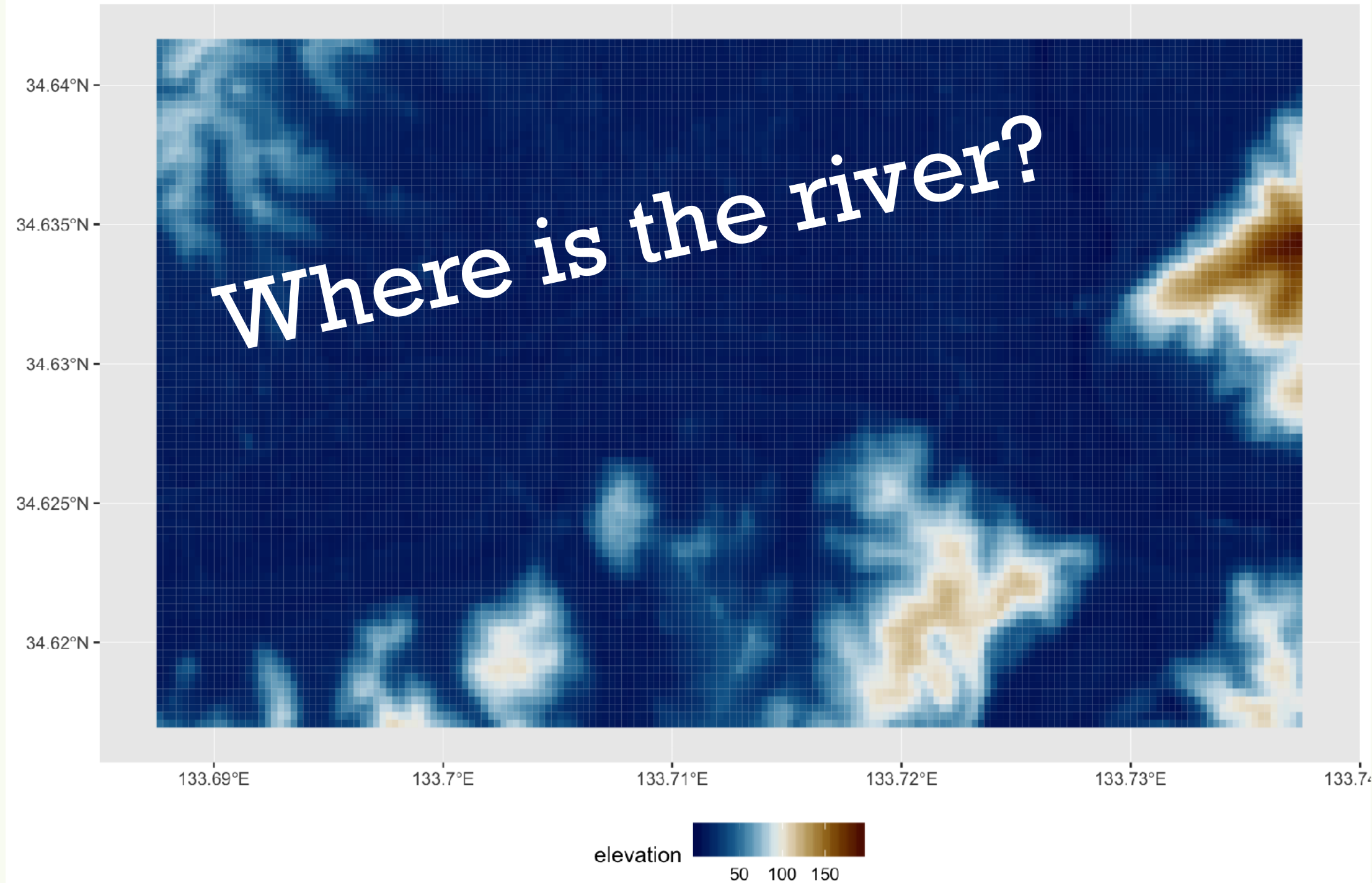


Levee failures in Mabi (真備)

Embankment broke, flooding occurred

Water levels reaching 4.8 m

Height above sea level along the Takahashi River.



Source: ALOS World 3D (AW3D30 Version 2.1) © JAXA

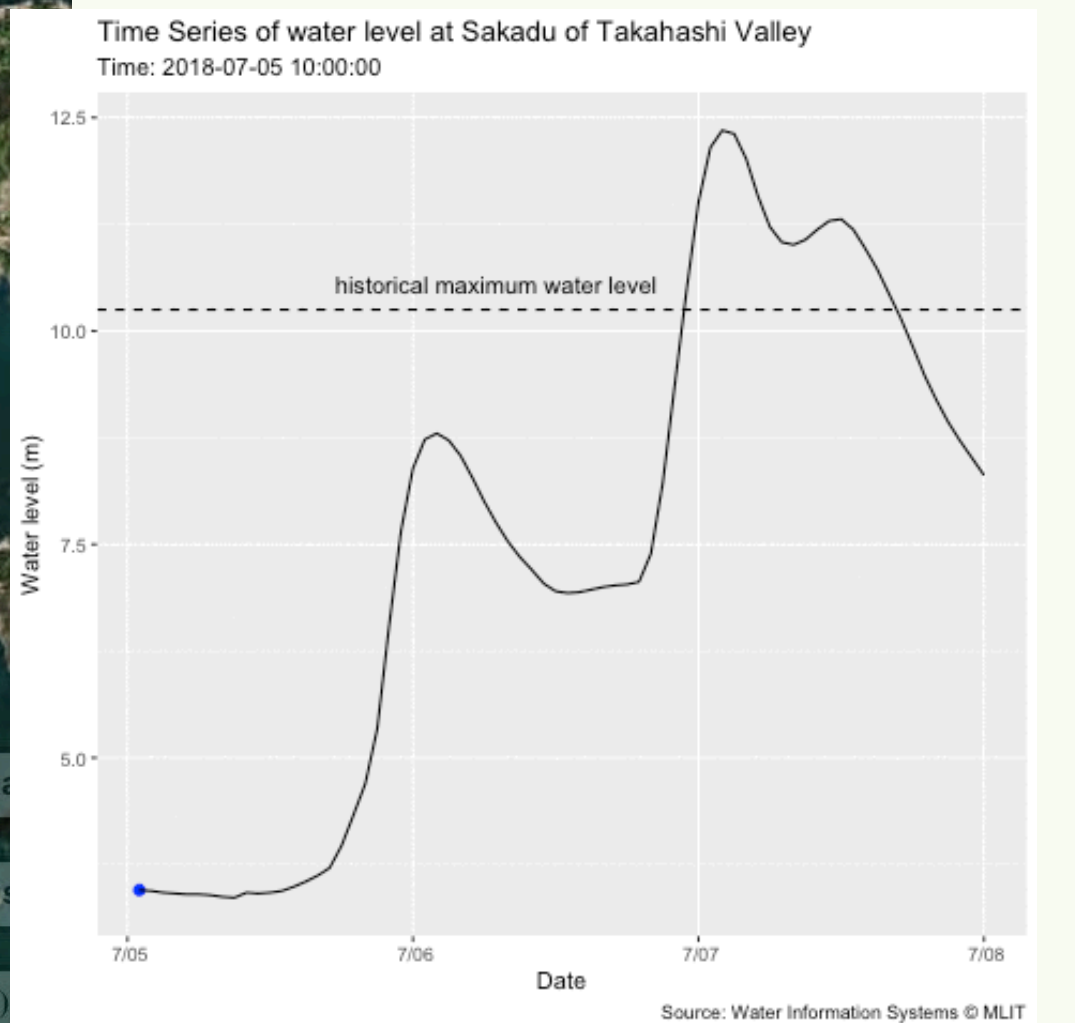
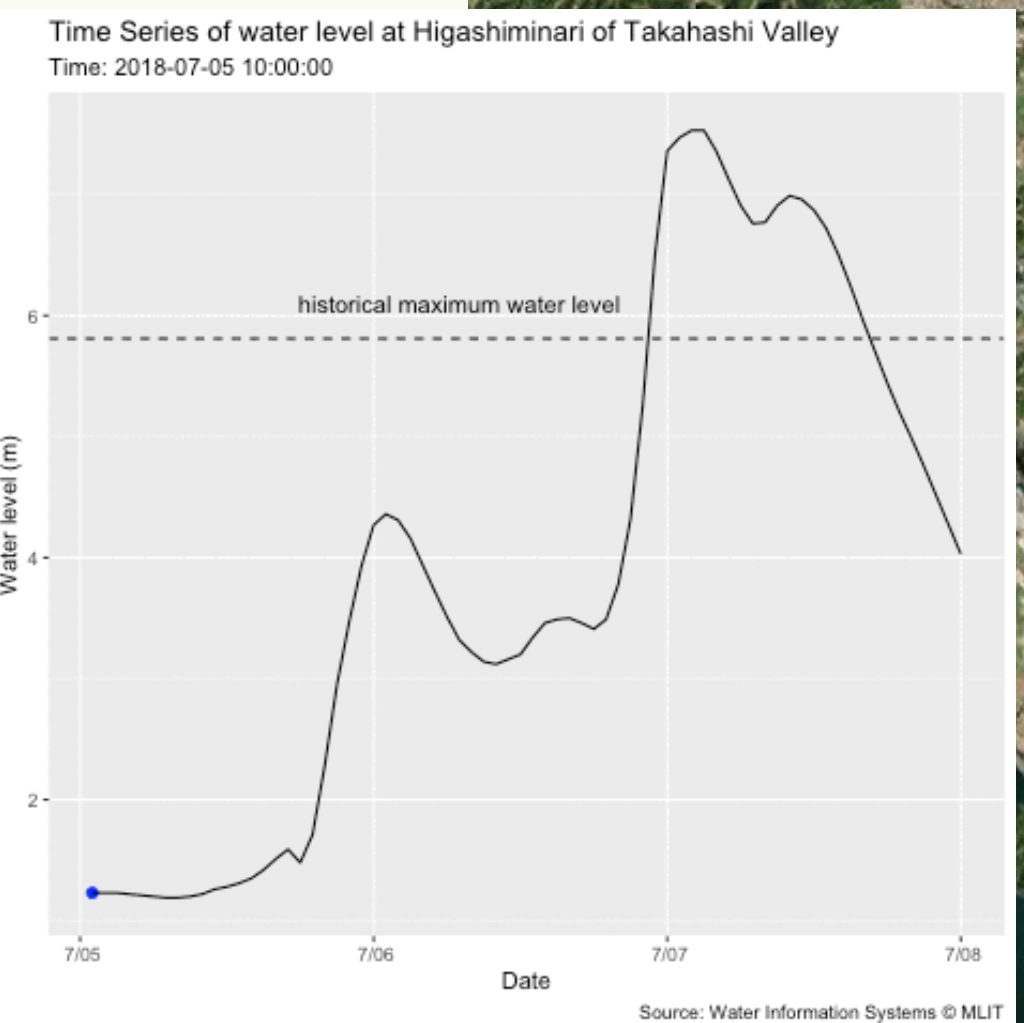
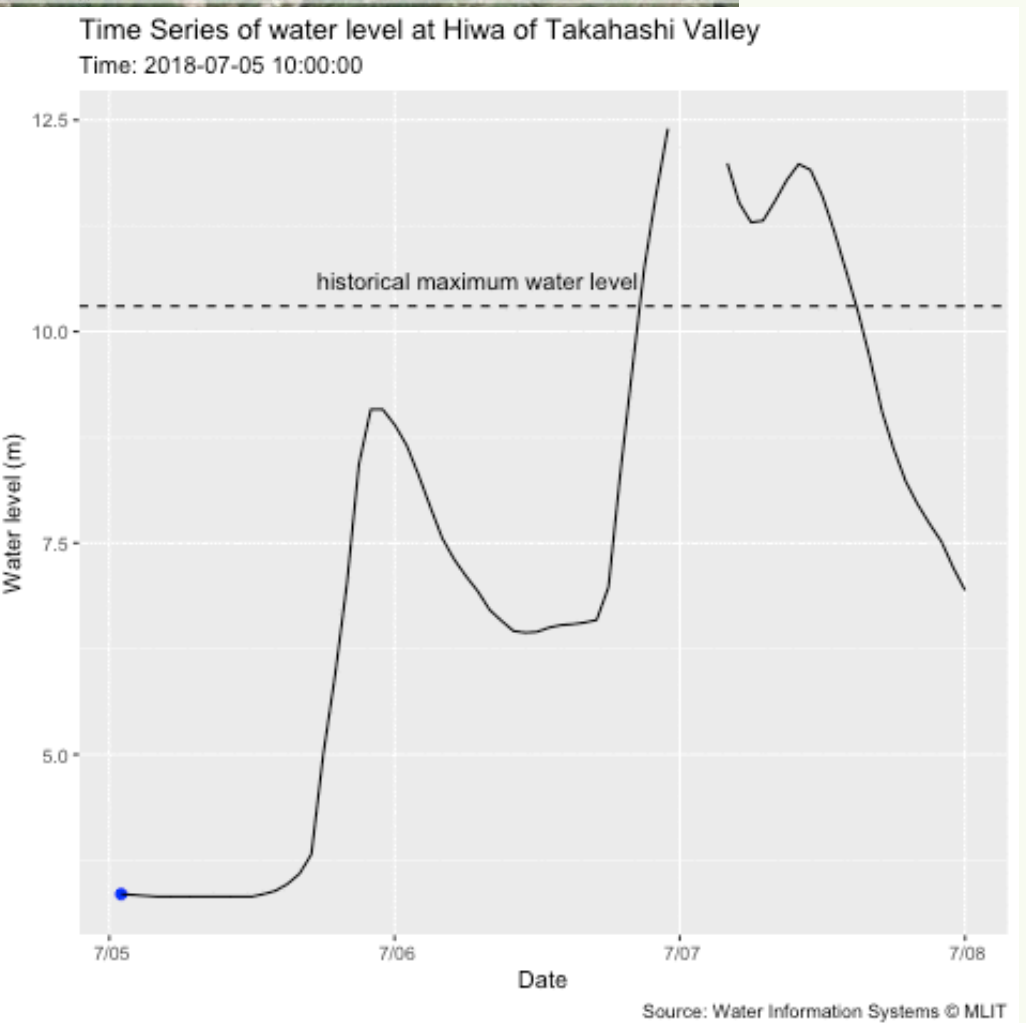
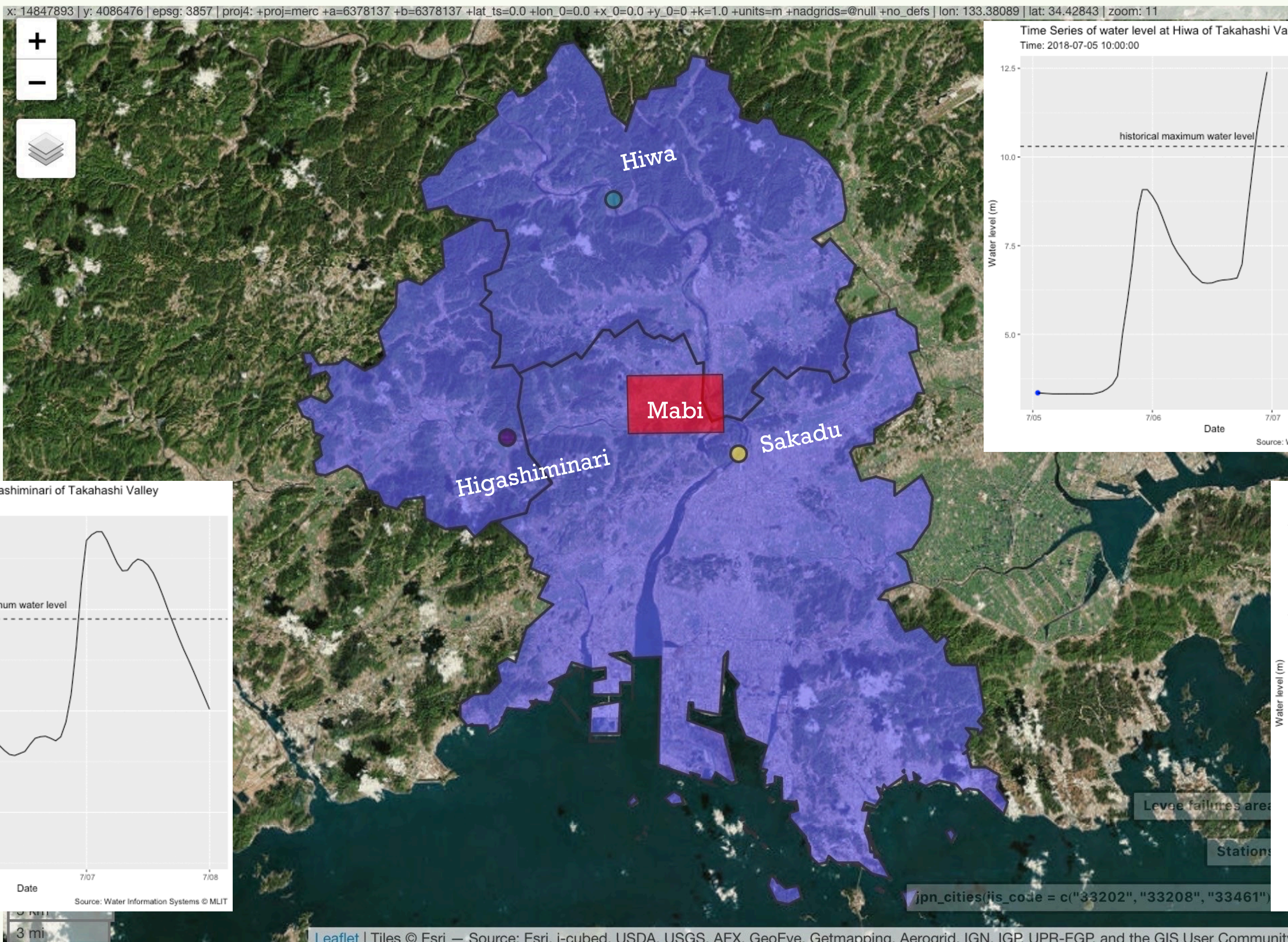


Original Images: Geospatial Information Authority of Japan, composed by 軽快 (CC BY 4.0)

<https://commons.wikimedia.org/wiki/File:平成30年7月豪雨による真備地区の被害.jpg>

<https://creativecommons.org/licenses/by/4.0/>

How changes the river's water level?



Session Information

```
  package *      version      date          source
1   abind *      1.4-5 2016-07-21    CRAN (R 3.5.0)
2   base *      3.5.0 2018-04-24      local
3   bindrcpp *   0.2.2 2018-03-29    CRAN (R 3.5.0)
4   datasets *   3.5.0 2018-04-24      local
5   dplyr *      0.7.6 2018-06-29    CRAN (R 3.5.0)
6   forcats *    0.3.0 2018-02-19    CRAN (R 3.5.0)
7   gganimate *  0.9.9.9999 2018-07-14 Github (thomasp85/gganimate@13a9a29)
8   ggforce *    0.1.3 2018-07-07    CRAN (R 3.5.0)
9   ggplot2 *    3.0.0 2018-07-03    CRAN (R 3.5.0)
10  graphics *    3.5.0 2018-04-24      local
11  grDevices *   3.5.0 2018-04-24      local
12  jmastats *   0.0.0.9000 2018-07-13    git (@a90e3a3)
13  jpmesh *     1.1.1.9000 2018-06-26    local (uribo/jpmesh@5054663)
14  jpndistrict * 0.3.2 2018-06-14    CRAN (R 3.5.0)
15  mapview *    2.4.0 2018-04-28    CRAN (R 3.5.0)
16  methods *    3.5.0 2018-04-24      local
17  purrr *      0.2.5 2018-05-29    CRAN (R 3.5.0)
18  raster *     2.6-7 2017-11-13    CRAN (R 3.5.0)
19  readr *      1.1.1 2017-05-16    CRAN (R 3.5.0)
20  sf *         0.6-3 2018-05-17    CRAN (R 3.5.0)
21  sp *         1.3-1 2018-06-05    CRAN (R 3.5.0)
22  stars *      0.1-1 2018-07-13    Github (r-spatial/stars@c9af832)
23  stats *      3.5.0 2018-04-24      local
24  stringr *    1.3.1 2018-05-10    CRAN (R 3.5.0)
25  tibble *     1.4.2 2018-01-22    CRAN (R 3.5.0)
26  tidyr *      0.8.1 2018-05-18    CRAN (R 3.5.0)
27  tidyverse *  1.2.1 2017-11-14    CRAN (R 3.5.0)
28  utils *      3.5.0 2018-04-24      local
```

```
setting value
version R version 3.5.0 (2018-04-23)
system x86_64, darwin15.6.0
ui      RStudio (1.2.826)
language En
collate ja_JP.UTF-8
tz      Asia/Tokyo
date    2018-07-18
```



ENJOY



Shinya Uryu
@u_ribo
@uribo