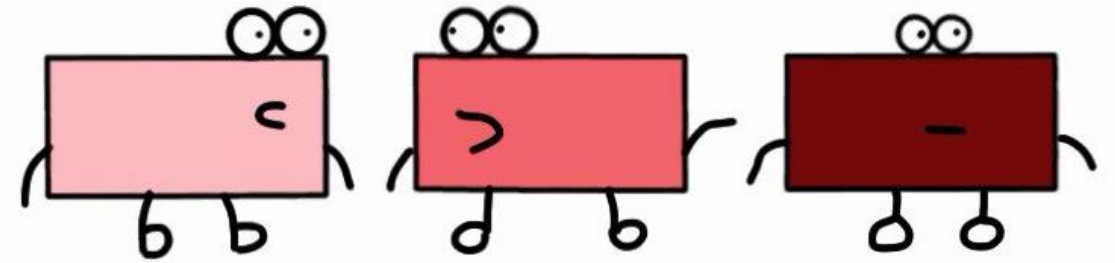


You're pretty hot      You should see  
the cell next to me



# Análisis espacial en R

José Luis Texcalac Sangrador

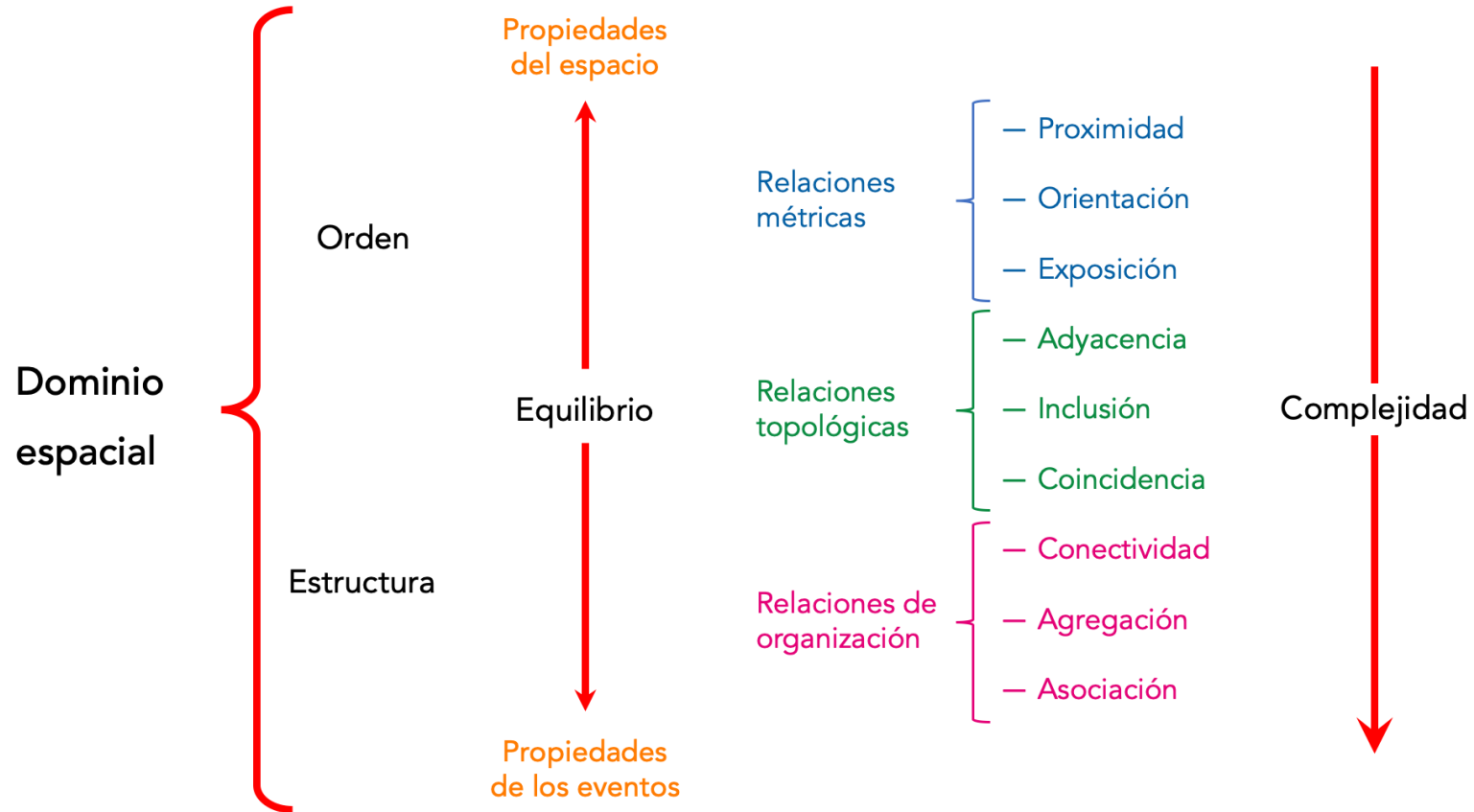
Procesamiento y visualización de datos espaciales en R

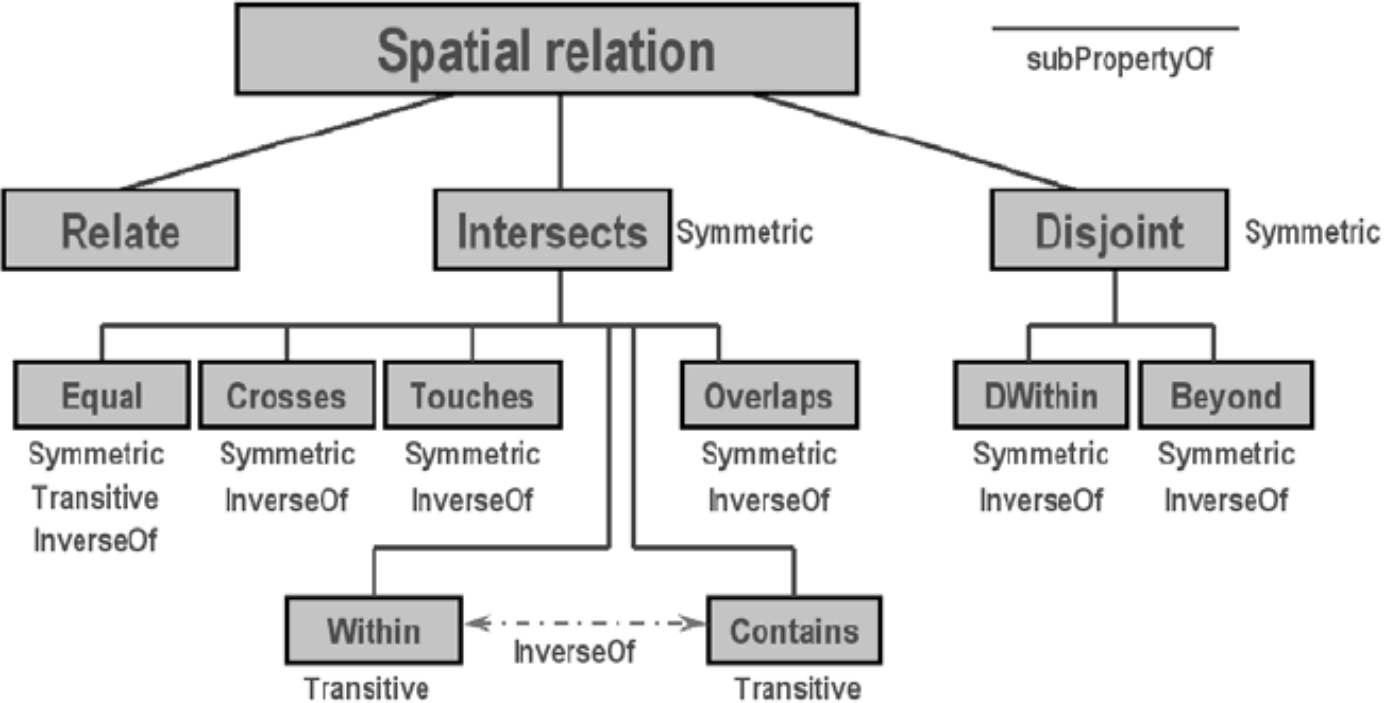



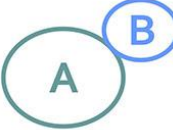
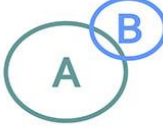

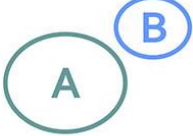


# Relaciones espaciales

- Son conceptos que surgen de la interacción entre el espacio y los eventos que en él ocurren.
- Se resumen en 9 tipos y tres grandes grupos.
  - Predominio de las propiedades del espacio
  - Equilibrio entre las propiedades del espacio y los eventos que en él ocurren.
  - Patrones espaciales definidos por las propiedades del espacio y los eventos que en él ocurren.

# Relaciones espaciales















<b>Equals</b> A is the same as B	
<b>Touches</b> A touches B	
<b>Overlaps</b> A and B have multiple points in common	
<b>Contains</b> A contains B	
<b>Disjoint</b> A shares nothing with B	
<b>Covers</b> A covers B (or vice versa)	
<b>Crosses</b> A and B have at least one point in common	

# Spatial manipulation with sf: : CHEAT SHEET











The sf package provides a set of tools for working with geospatial vectors, i.e. points, lines, polygons, etc.











## Geometric confirmation

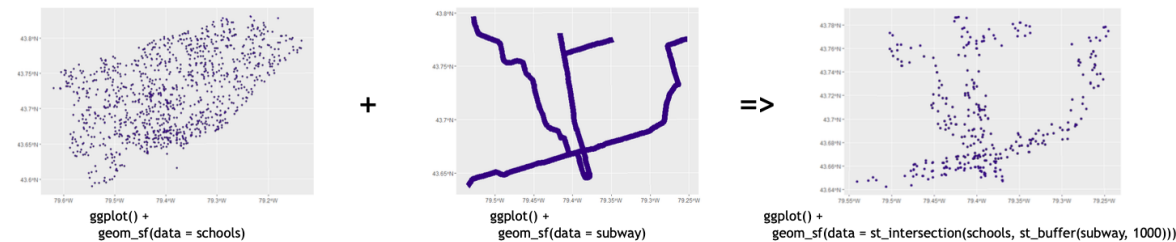
-  `st_contains(x, y, ...)` Identifies if y is within x (i.e. point within polygon)
-  `st_covered_by(x, y, ...)` Identifies if x is completely within y (i.e. polygon completely within polygon)
-  `st_covers(x, y, ...)` Identifies if any point from x is outside of y (i.e. polygon outside polygon)
-  `st_crosses(x, y, ...)` Identifies if any geometry of x have commonalities with y
-  `st_disjoint(x, y, ...)` Identifies when geometries from x do not share space with y
-  `st_equals(x, y, ...)` Identifies if x and y share the same geometry
-  `st_intersects(x, y, ...)` Identifies if x and y geometry share any space
-  `st_overlaps(x, y, ...)` Identifies if geometries of x and y share space, are of the same dimension, but are not completely contained by each other
-  `st_touches(x, y, ...)` Identifies if geometries of x and y share a common point but their interiors do not intersect
-  `st_within(x, y, ...)` Identifies if x is in a specified distance to y

## Geometric operations

-  `st_boundary(x)` Creates a polygon that encompasses the full extent of the geometry
-  `st_buffer(x, dist, nQuadSegs)` Creates a polygon covering all points of the geometry within a given distance
-  `st_centroid(x, ..., of_largest_polygon)` Creates a point at the geometric centre of the geometry
-  `st_convex_hull(x)` Creates geometry that represents the minimum convex geometry of x
-  `st_line_merge(x)` Creates linestring geometry from sewing multi linestring geometry together
-  `st_node(x)` Creates nodes on overlapping geometry where nodes do not exist
-  `st_point_on_surface(x)` Creates a point that is guaranteed to fall on the surface of the geometry
-  `st_polygonize(x)` Creates polygon geometry from linestring geometry
-  `st_segmentize(x, dfMaxLength, ...)` Creates linestring geometry from x based on a specified length
-  `st_simplify(x, preserveTopology, dTolerance)` Creates a simplified version of the geometry based on a specified tolerance

## Geometry creation

-  `st_triangulate(x, dTolerance, bOnlyEdges)` Creates polygon geometry as triangles from point geometry
-  `st_voronoi(x, envelope, dTolerance, bOnlyEdges)` Creates polygon geometry covering the envelope of x, with x at the centre of the geometry
-  `st_point(x, c(numeric vector), dim = "XYZ")` Creating point geometry from numeric values
-  `st_multipoint(x = matrix(numeric values in rows), dim = "XYZ")` Creating multi point geometry from numeric values
-  `st_linestring(x = matrix(numeric values in rows), dim = "XYZ")` Creating linestring geometry from numeric values
-  `st_multilinestring(x = list(numeric matrices in rows), dim = "XYZ")` Creating multi linestring geometry from numeric values
-  `st_polygon(x = list(numeric matrices in rows), dim = "XYZ")` Creating polygon geometry from numeric values
-  `st_multipolygon(x = list(numeric matrices in rows), dim = "XYZ")` Creating multi polygon geometry from numeric values










# Spatial manipulation with sf: : CHEAT SHEET

The sf package provides a set of tools for working with geospatial vectors, i.e. points, lines, polygons, etc.



## Geometry operations

-  **st\_contains(x, y, ...)** Identifies if y is within x (i.e. point within polygon)
-  **st\_crop(x, y, ..., xmin, ymin, xmax, ymax)** Creates geometry of x that intersects a specified rectangle
-  **st\_difference(x, y)** Creates geometry from x that does not intersect with y
-  **st\_intersection(x, y)** Creates geometry of the shared portion of x and y
-  **st\_sym\_difference(x, y)** Creates geometry representing portions of x and y that do not intersect
-  **st\_snap(x, y, tolerance)** Snap nodes from geometry x to geometry y
-  **st\_union(x, y, ..., by\_feature)** Creates multiple geometries into a single geometry, consisting of all geometry elements

## Geometric measurement

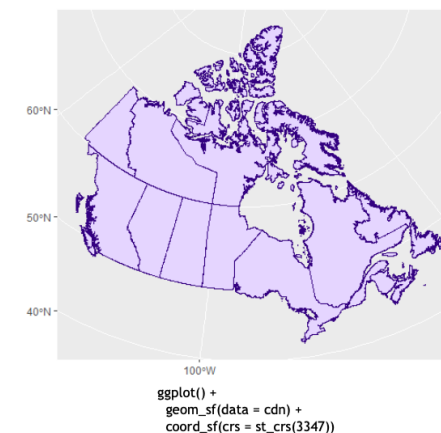
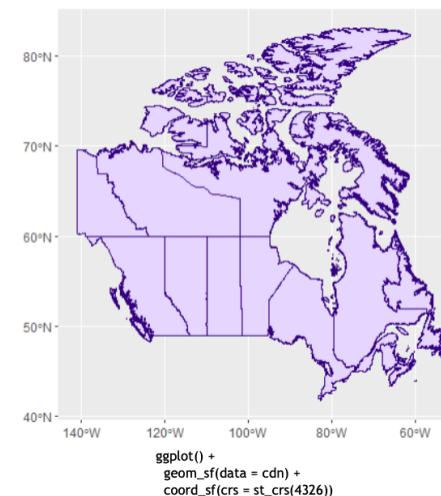
**st\_area(x)** Calculate the surface area of a polygon geometry based on the current coordinate reference system

**st\_distance(x, y, ..., dist\_fun, by\_element, which)**  
Calculates the 2D distance between x and y based on the current coordinate system

**st\_length(x)** Calculates the 2D length of a geometry based on the current coordinate system

## Misc operations

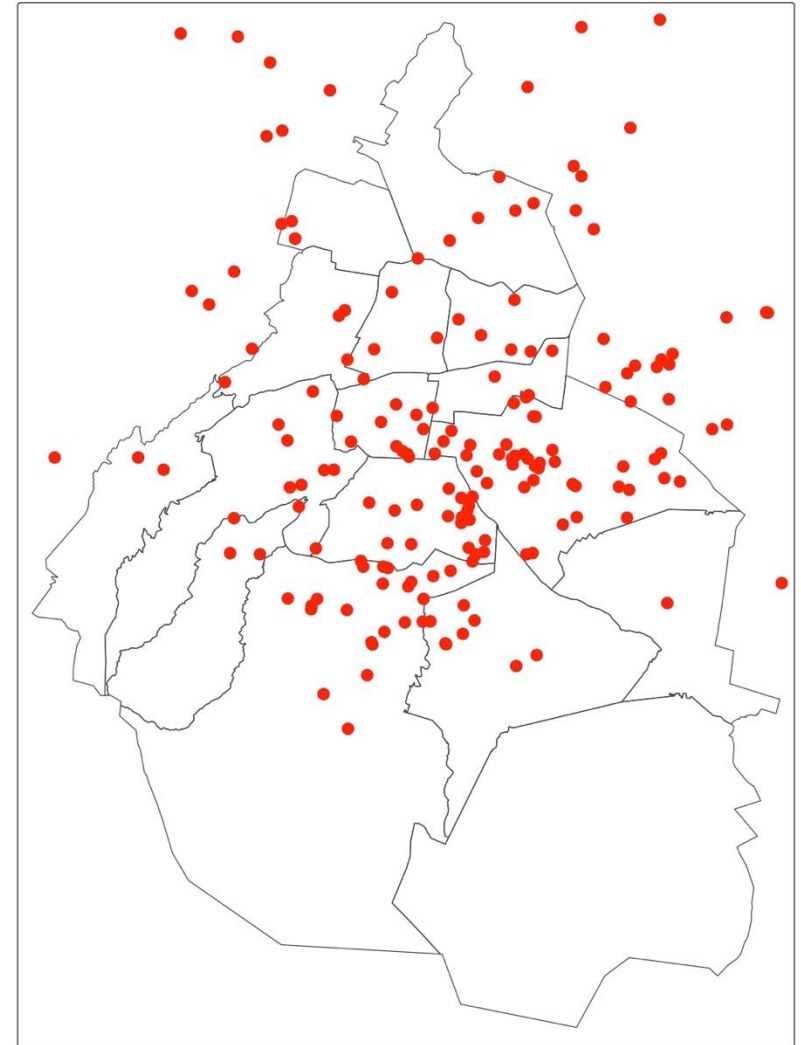
- st\_as\_sf(x, ...)** Create a sf object from a non-geospatial tabular data frame
- st\_cast(x, to, ...)** Change x geometry to a different geometry type
- st\_coordinates(x, ...)** Creates a matrix of coordinate values from x
- st\_crs(x, ...)** Identifies the coordinate reference system of x
- st\_join(x, y, join, FUN, suffix, ...)** Performs a spatial left or inner join between x and y
- st\_make\_grid(x, cellsize, offset, n, crs, what)** Creates rectangular grid geometry over the bounding box of x
- st\_nearest\_feature(x, y)** Creates an index of the closest feature between x and y
- st\_nearest\_points(x, y, ...)** Returns the closest point between x and y
- st\_read(dsn, layer, ...)** Read file or database vector dataset as a sf object
- st\_transform(x, crs, ...)** Convert coordinates of x to a different coordinate reference system



# ¿Qué folios están dentro de CDMX?

```
tm_shape(cdmx) +  
  tm_borders() +  
  tm_shape(sitios) +  
  tm_dots(fill = "red")
```

```
sitios_cdmx <-  
  st_filter(sitios, cdmx) %>%  
  print()
```

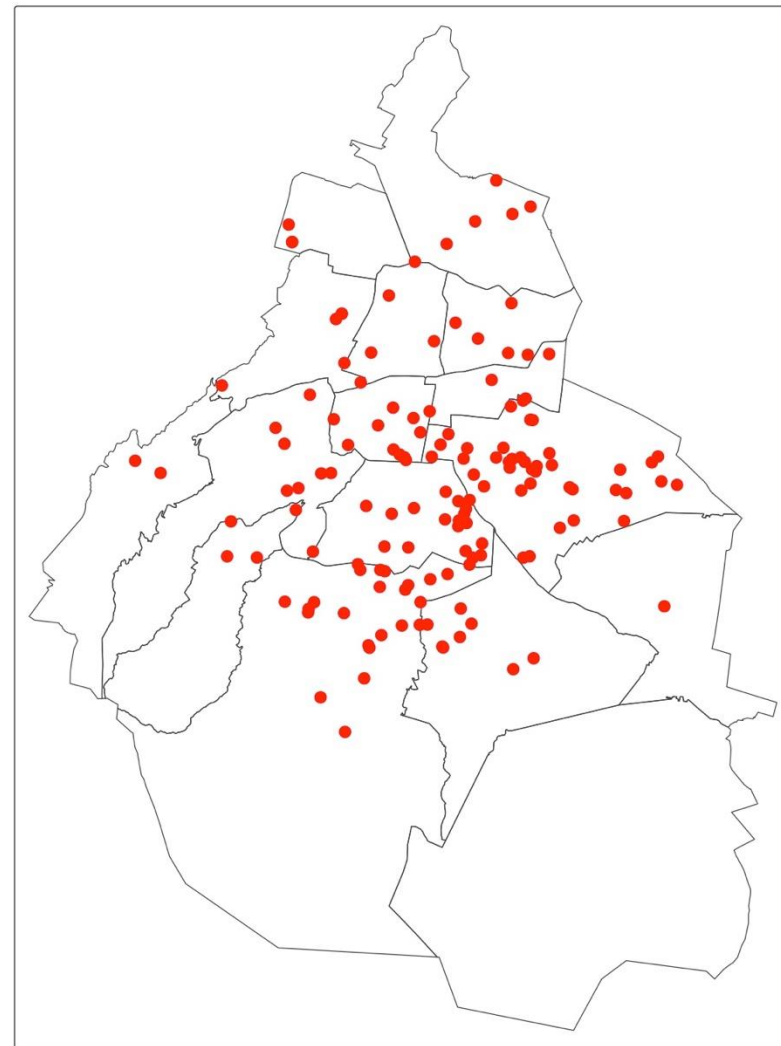




# ¿Qué folios están dentro de CDMX?

```
tm_shape(cdmx) +  
  tm_borders() +  
  tm_shape(sitios_cdmx) +  
  tm_dots(fill = "red")
```

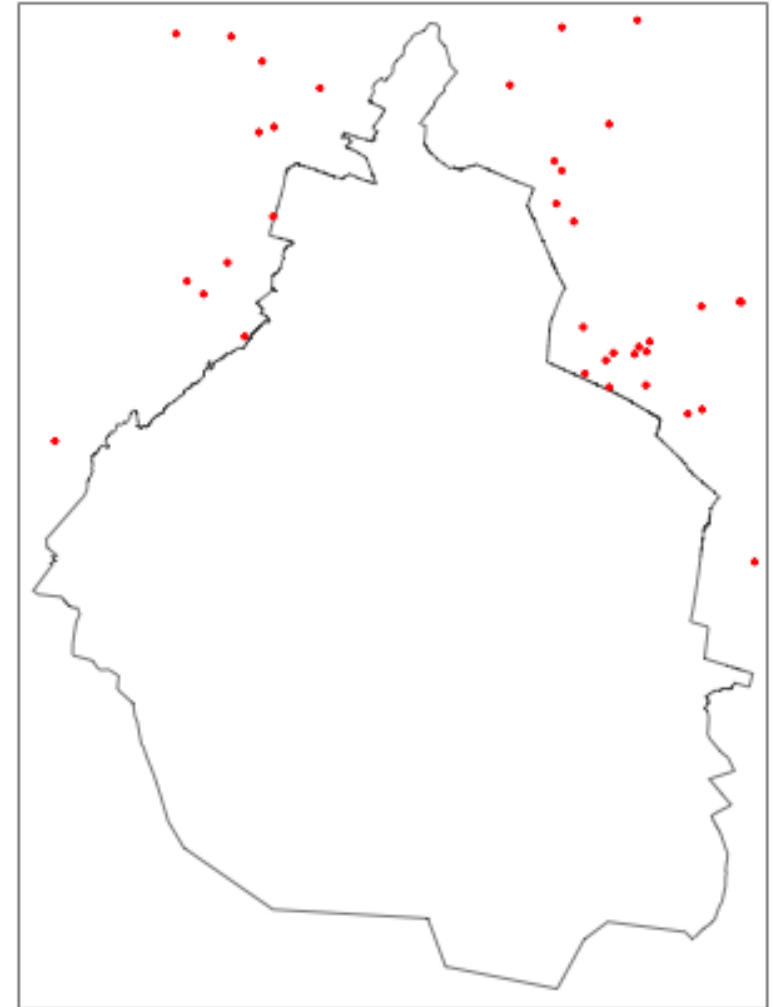
```
tm_shape(cdmx) +  
  tm_borders() +  
  tm_shape(st_filter(sitios, cdmx)) +  
  tm_dots(fill = "red")
```



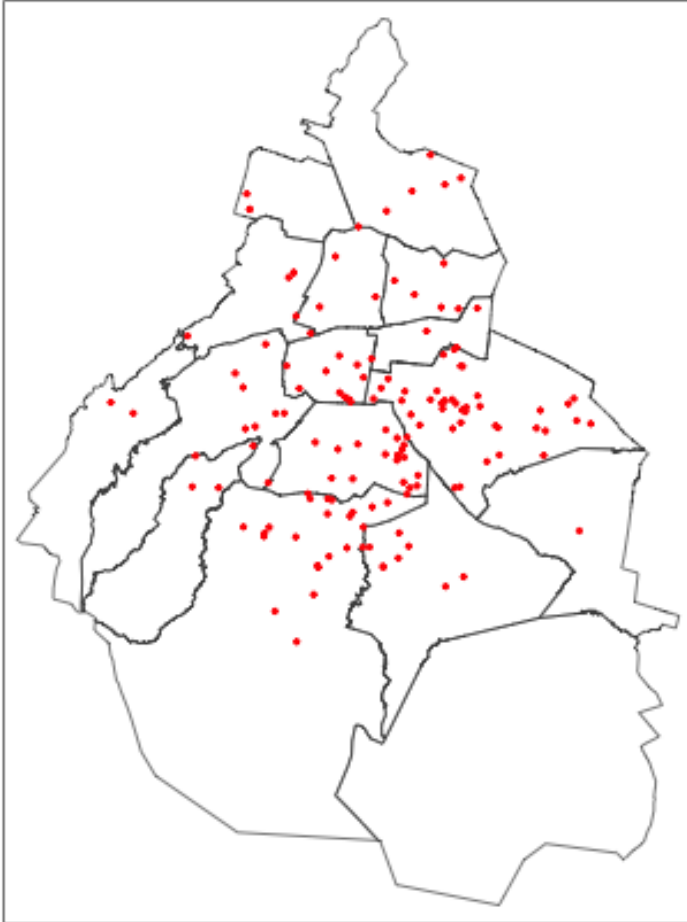


# ¿Qué folios están fuera de CDMX?

```
pts_cdmx <-  
  st_filter(sitios, cdmx) %>%  
  print()
```



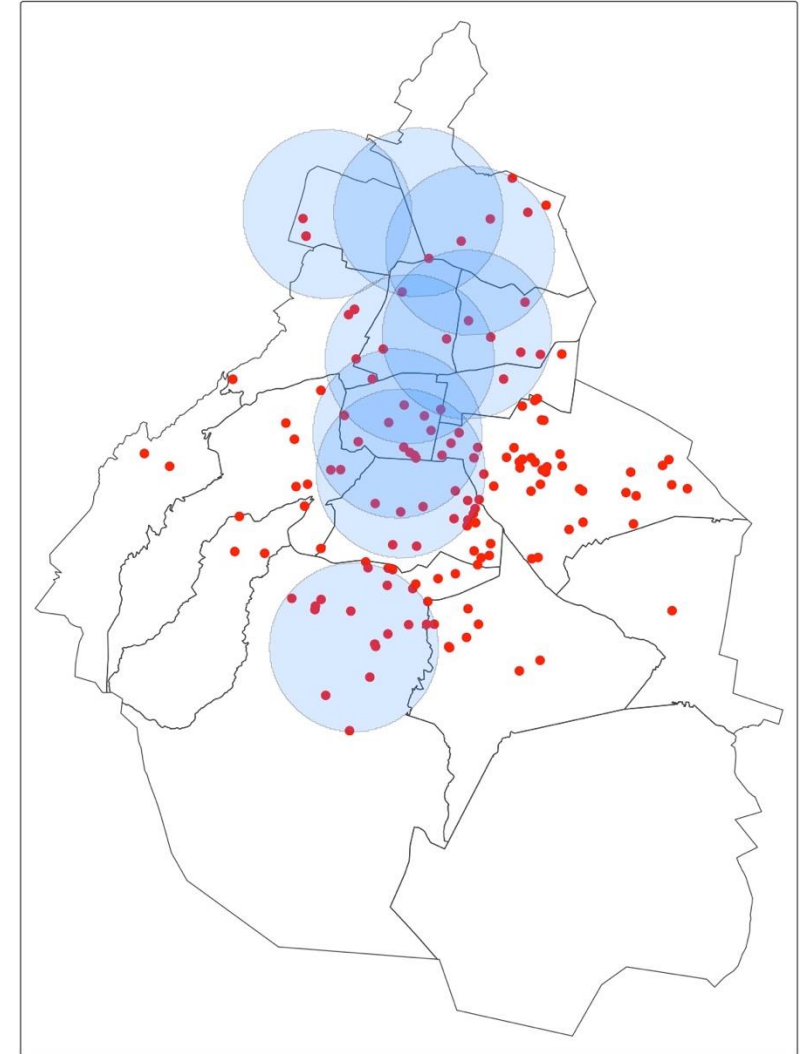
# ¿A qué alcaldía corresponde cada folio?



```
st_join(sitios, cdmx, join = st_within)
```

# Área de influencia de un punto (buffer)

```
buf_monit <-  
  st_buffer(monit, 5000, nQuadSegs = 30) %>%  
  print()
```





# ¿En qué buffer o buffers cae cada folio?

```
st_join(sitios_cdmx,  
        buf_monit)
```

Simple feature collection with 183 features and 2 fields

Geometry type: POINT

Dimension: XY

Bounding box: xmin: 2782545 ymin: 804611.1 xmax: 2814894 ymax: 837532.4

Projected CRS: Mexico ITRF2008 / LCC

First 10 features:

	folio	site	geometry
1	1754	LVI	POINT (2805067 835529.4)
2	2722	<NA>	POINT (2799581 812358.5)
3	8758	COY	POINT (2801880 817228)
4	2192	<NA>	POINT (2806450 820158.9)
5	3161	IMP	POINT (2801141 833745)
5.1	3161	LVI	POINT (2801141 833745)
6	8830	<NA>	POINT (2801194 814034.4)
7	1938	<NA>	POINT (2806145 819439)
8	8606	<NA>	POINT (2804096 820989.6)
9	1967	BJU	POINT (2797862 817634.2)

# ¿Cuál es la distancia entre folios y estaciones de monitoreo?

```
dist <-  
  st_distance(sitios_cdmx, monit) %>%  
  print()
```

El resultado es una matriz



Units: [m]

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]	[,7]	[,8]
[1,]	11916.406	15220.0657	17203.571	11168.206	6499.460	4118.933	8096.5364	27769.131
[2,]	23716.736	10120.7845	7764.506	14413.920	23056.665	20931.504	15984.9149	5166.418
[3,]	19966.993	6634.5660	4865.522	10162.473	18464.174	15957.669	10992.1981	10145.339
[4,]	20065.468	9121.5589	8624.523	10519.264	17151.901	13871.307	9408.8064	15428.959
[5,]	8115.284	12006.8501	14213.861	7620.333	3055.007	777.837	5546.9032	24897.482
[6,]	22629.547	9002.6512	6782.020	13018.107	21519.217	19156.235	14187.6347	7449.255
[7,]	20414.776	9025.2479	8330.349	10755.164	17661.391	14452.289	9888.0949	14716.066
[8,]	17925.016	6644.6396	6358.045	8200.982	15427.603	12431.889	7648.5939	14461.506
[9,]	18173.834	4653.5061	2288.633	9080.574	17772.795	16012.335	11220.4678	8491.929
[10,]	13391.319	2945.5145	4468.799	3516.512	11741.957	9556.685	4695.8396	15015.401





# ¿Qué nos falta?

- Transformar a tibble
- Nombres de columna
- Recuperar el folio

```
dist <- as_tibble(dist)
```

```
names(dist) <- monit$site
```

```
names(dist) <- monit$site
```



```
st_distance(pts_cdmx, monit) %>%  
  as_tibble() %>%  
  rename_all(list(~monit$site)) %>%  
  bind_cols(pts_cdmx)
```

Simple feature collection with 143 features and 9 fields

Geometry type: POINT

Dimension: XY

Bounding box: xmin: 2782545 ymin: 804611.1 xmax: 2814894 ymax: 837532.4

Projected CRS: Mexico ITRF2008 / LCC

First 10 features:

	folio	AZC	BJU	COY	HGM	IMP	LVI	MER	TPN	geometry
1	1754	11916.406	15220.066	17203.571	11168.206	6499.460	4118.933	8096.536	27769.131	POINT (2805067 835529.4)
2	2722	23716.736	10120.784	7764.506	14413.920	23056.665	20931.504	15984.915	5166.418	POINT (2799581 812358.5)
3	8758	19966.993	6634.566	4865.522	10162.473	18464.174	15957.669	10992.198	10145.339	POINT (2801880 817228)
4	2192	20065.468	9121.559	8624.523	10519.264	17151.901	13871.307	9408.806	15428.959	POINT (2806450 820158.9)
5	3161	8115.284	12006.850	14213.861	7620.333	3055.007	777.837	5546.903	24897.482	POINT (2801141 833745)
6	8830	22629.547	9002.651	6782.020	13018.107	21519.217	19156.235	14187.635	7449.255	POINT (2801194 814034.4)
7	1938	20414.776	9025.248	8330.349	10755.164	17661.391	14452.289	9888.095	14716.066	POINT (2806145 819439)
8	8606	17925.016	6644.640	6358.045	8200.982	15427.603	12431.889	7648.594	14461.506	POINT (2804096 820989.6)
9	1967	18173.834	4653.506	2288.633	9080.574	17772.795	16012.335	11220.468	8491.929	POINT (2797862 817634.2)
10	1913	13391.319	2945.514	4468.799	3516.512	11741.957	9556.685	4695.840	15015.401	POINT (2800127 823754.8)





# ¿Cuál es la distancia entre cada folio y la estación más cercana?

```
dist_monit <-  
  st_set_geometry(dist, NULL) %>%  
  pivot_longer(cols = -folio,  
               names_to = "site",  
               values_to = "distancia") %>%  
  group_by(folio) %>%  
  summarise(distancia = min(distancia, na.rm = TRUE)) %>%  
  print()
```

```
# A tibble: 143 × 2  
  folio distancia  
  <int>      <dbl>  
1  1159    5324.  
2  1182    6900.  
3  1249    6730.  
4  1282   13989.  
5  1296    4703.  
6  1383    5109.  
7  1584    1819.  
8  1754    4119.  
9  1906   13885.  
10 1913    2946.  
# i 133 more rows  
# i Use `print(n = .
```



# ¿Cuál es la distancia entre cada folio y la estación más cercana?

```
pts_cdmx %>%  
  mutate(n_monit = st_nearest_feature(pts_cdmx, monit),  
         distancia = st_distance(pts_cdmx, monit[n_monit, ],  
                                by_element = TRUE))
```

Simple feature collection with 143 features and 3 fields  
Geometry type: POINT  
Dimension: XY  
Bounding box: xmin: 2782545 ymin: 804611.1 xmax: 2814894  
Projected CRS: Mexico ITRF2008 / LCC  
First 10 features:

	folio	n_monit	distancia	geometry
1	1754	6	4118.933 [m]	POINT (2805067 835529.4)
2	2722	8	5166.418 [m]	POINT (2799581 812358.5)
3	8758	3	4865.522 [m]	POINT (2801880 817228)
4	2192	3	8624.523 [m]	POINT (2806450 820158.9)
5	3161	6	777.837 [m]	POINT (2801141 833745)
6	8830	3	6782.020 [m]	POINT (2801194 814034.4)
7	1938	3	8330.349 [m]	POINT (2806145 819439)
8	8606	3	6358.045 [m]	POINT (2804096 820989.6)
9	1967	3	2288.633 [m]	POINT (2797862 817634.2)
10	1913	2	2945.514 [m]	POINT (2800127 823754.8)