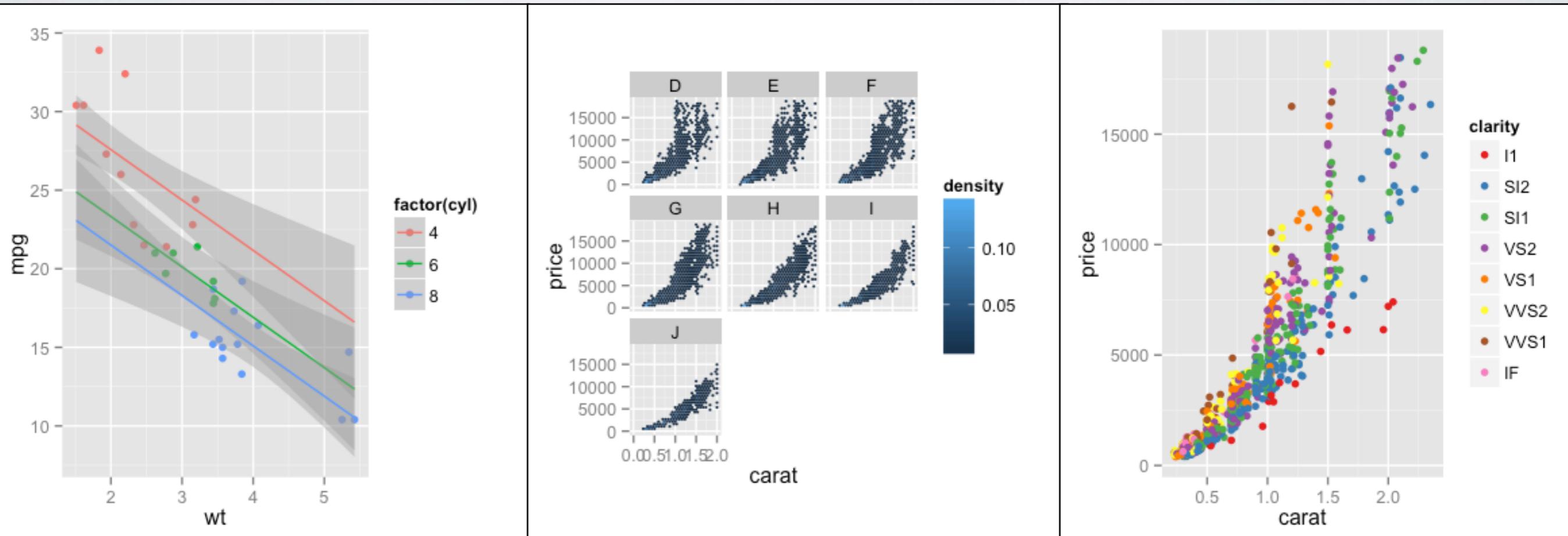


ggplot2

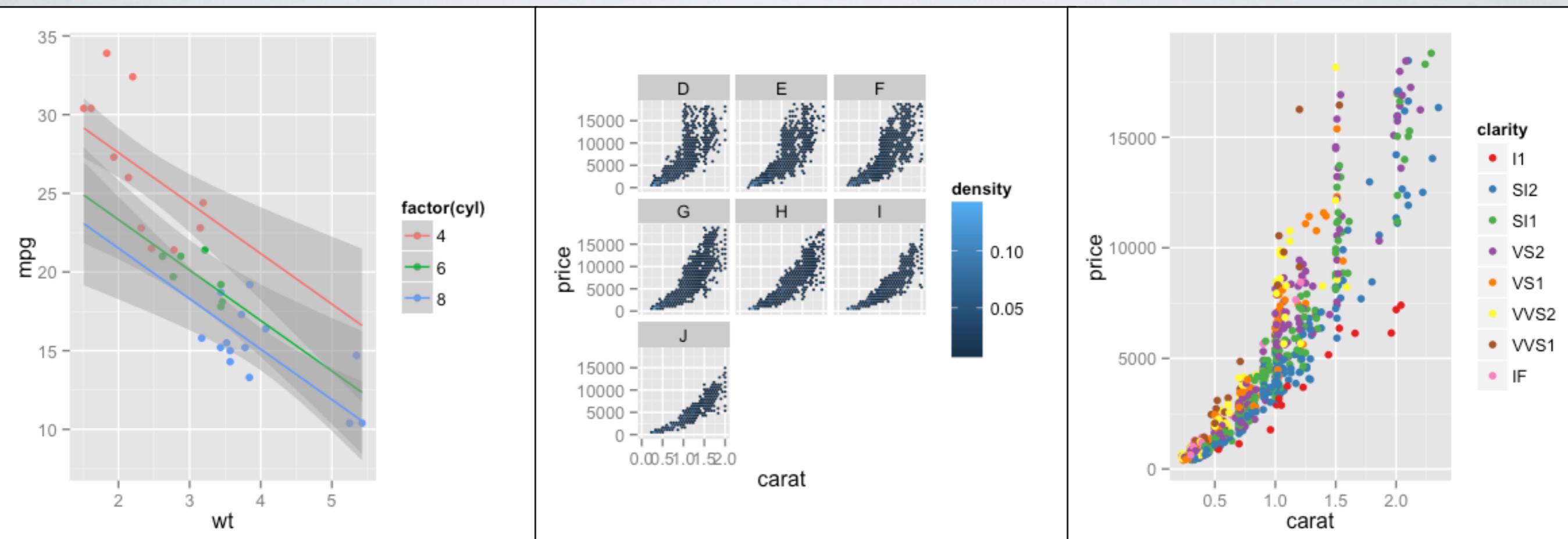
displaying spatial & temporal data



Credit

- ‘White’ slides are taken directly from Dianne Cook’s “IMAGe STATMOS Course on Visualization of Climate Data”
- <http://streaming.stat.iastate.edu/~dicook/NCAR/>
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ggplot2



ggplot2

- “ggplot2 is a **plotting system** for R, based on the **grammar of graphics**, which tries to take the good parts of base and lattice graphics and none of the bad parts. It takes care of many of the fiddly details that make plotting a hassle (like drawing legends) as well as providing a powerful model of graphics that makes it easy to **produce complex multi-layered graphics**.”

<http://ggplot2.org/>

ggplot2

- “ease of use” vs. “customization”
 - user’s time is more important than customization
 - grammar rules reduce amount of small decisions
- made for **fast** iterations

Grammar

- Underlying ggplot2 is a formal structure for defining a data plot
- Provides enormous flexibility in producing data plots, how different plots are related
- Elegant nature of plots is due to defaults based on good cognitive principles.
- Based initially on Wilkinson (2001)'s grammar of graphics - “gg” stands for **grammar of graphics**

geom

- “Geoms, short for geometric objects, describe the type of plot you will produce”
- 37 documented geoms.

- [geom_abline](#)
Line specified by slope and intercept.
- [geom_area](#)
Area plot.
- [geom_bar](#)
Bars, rectangles with bases on x-axis
- [geom_bin2d](#)
Add heatmap of 2d bin counts.
- [geom_blank](#)
Blank, draws nothing.
- [geom_boxplot](#)
Box and whiskers plot.
- [geom_contour](#)
Display contours of a 3d surface in 2d.
- [geom_crossbar](#)
Hollow bar with middle indicated by horizontal line.
- [geom_density](#)
Display a smooth density estimate.
- [geom_density2d](#)
Contours from a 2d density estimate.
- [geom_dotplot](#)
Dot plot
- [geom_errorbar](#)
Error bars.
- [geom_errorbarh](#)
Horizontal error bars



geom statistics

- statistical transformations
- most common: identity
- common geoms: bin, boxplot, qq, quantile, smooth

- `stat_bin`
Bin data.
- `stat_bin2d`
Count number of observation in rectangular bins.
- `stat_bindot`
Bin data for dot plot.
- `stat_binhex`
Bin 2d plane into hexagons.
- `stat_boxplot`
Calculate components of box and whisker plot.
- `stat_contour`
Calculate contours of 3d data.
- `stat_density`
1d kernel density estimate.
- `stat_density2d`
2d density estimation.
- `stat_ecdf`
Empirical Cumulative Density Function
- `stat_function`
Superimpose a function.
- `stat_identity`
Identity statistic.
- `stat_qq`
Calculation for quantile-quantile plot.
- `stat_quantile`
Continuous quantiles.



$$f(x) = x$$

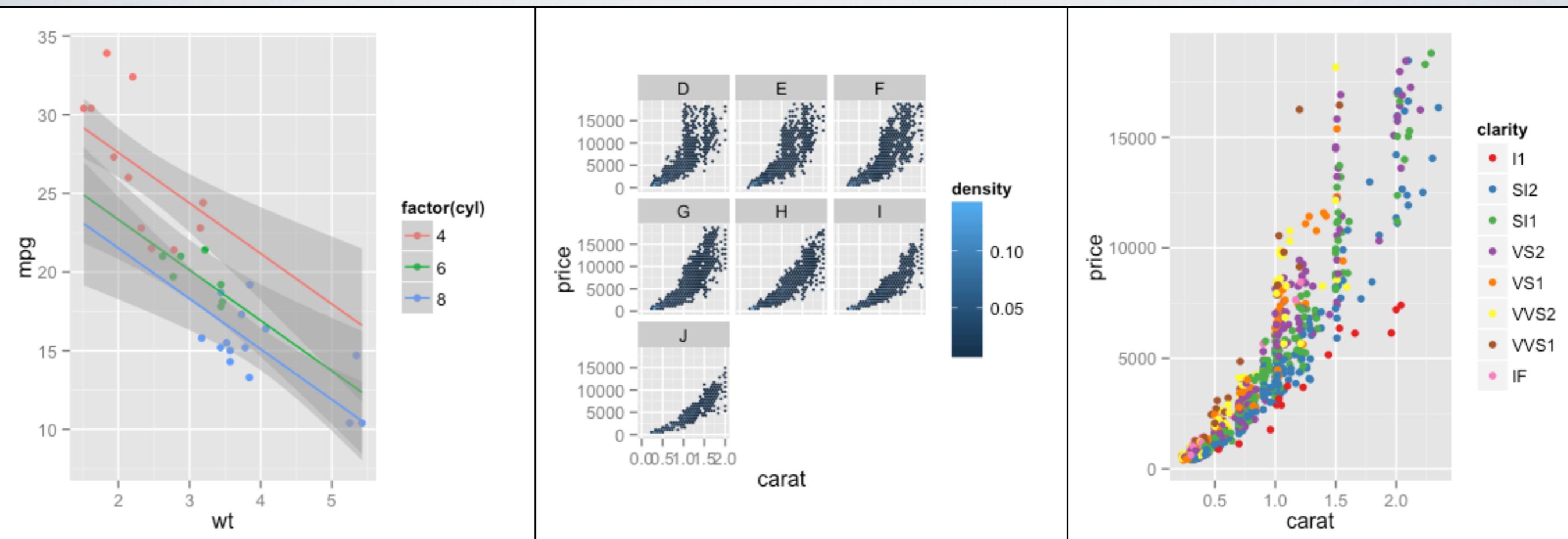


geom layer(s)

- Parts:
 - data and aesthetic mapping,
 - a statistical transformation (stat)
 - a geometric object (geom)
 - a position adjustment
- typically display other columns within the same data
- can display completely new data

<http://vita.had.co.nz/papers/layered-grammar.pdf>

layer examples



ggplot2 objects

- ggplot2 plots are fully defined R objects
- have a special print method
- objects may be altered many times before printing

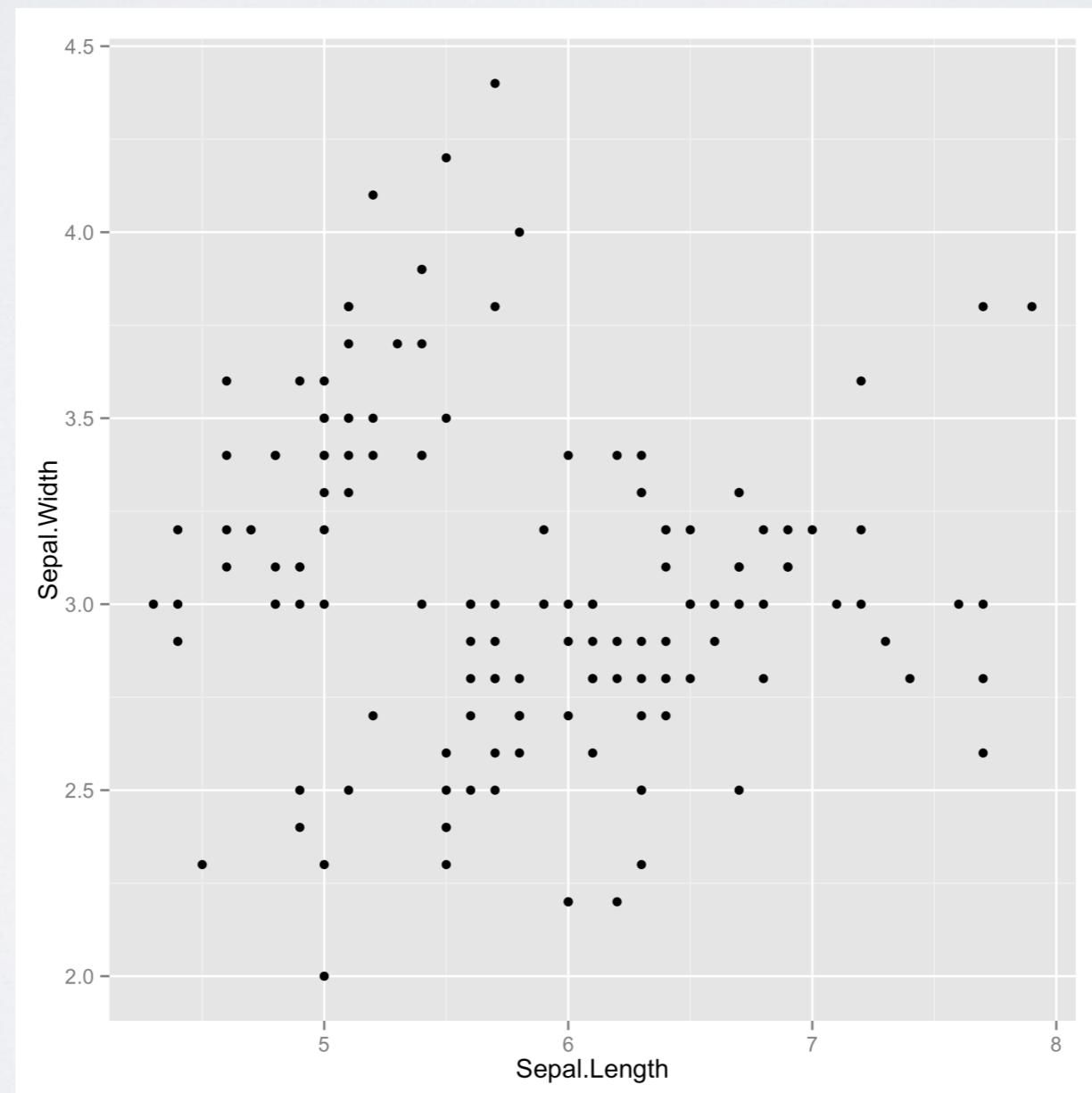
‘qplot’ function

- `qplot(`
`vars, # ‘x’ and/or ‘y’. Depends on geom`
`data,`
`[geom = “point”,`
`[other options]]`
`) + [more layers]`

ggplot2 object example

- ```
p <- qplot(Sepal.Length, Sepal.Width, data = iris)
```

  
`p`



```
• > str(p)
List of 9
$ data :'data.frame': 150 obs. of 5 variables:
..$ Sepal.Length: num [1:150] 5.1 4.9 4.7 4.6 5 5.4 4.6 5 4.4 4.9 ...
..$ Sepal.Width : num [1:150] 3.5 3 3.2 3.1 3.6 3.9 3.4 3.4 2.9 3.1 ...
..$ Petal.Length: num [1:150] 1.4 1.4 1.3 1.5 1.4 1.7 1.4 1.5 1.4 1.5 ...
..$ Petal.Width : num [1:150] 0.2 0.2 0.2 0.2 0.2 0.4 0.3 0.2 0.2 0.1 ...
..$ Species : Factor w/ 3 levels "setosa","versicolor",...: 1 1 1 1 1 ...
$ layers :List of 1
..$:Classes 'proto', 'environment' <environment: 0x7fa9d48e8b48>
$ scales :Reference class 'Scales' [package "ggplot2"] with 1 fields
..$ scales: list()
..and 21 methods, of which 9 are possibly relevant:
.. add, clone, find, get_scales, has_scale, initialize, input, n,
.. non_position_scales
$ mapping :List of 2
..$ x: symbol Sepal.Length
..$ y: symbol Sepal.Width
$ theme : list()
$ coordinates:List of 1
..$ limits:List of 2
.. . .$ x: NULL
.. . .$ y: NULL
..- attr(*, "class")= chr [1:2] "cartesian" "coord"
$ facet :List of 1
..$ shrink: logi TRUE
..- attr(*, "class")= chr [1:2] "null" "facet"
$ plot_env :<environment: R_GlobalEnv>
$ labels :List of 2
..$ x: chr "Sepal.Length"
..$ y: chr "Sepal.Width"
- attr(*, "class")= chr [1:2] "gg" "ggplot"
```

- > str(p)  
List of 9  
...  
\$ layers :List of 1  
..\$ :Classes 'proto', 'environment'  
<environment: 0x7fa9d48e8b48>  
...
- > p\$layers  
[[1]]  
geom\_point:  
stat\_identity:  
position\_identity: (width = NULL, height = NULL)

# print plot: base vs. ggplot2

- `dt <- dataBeingUsed`
- `## base`  
**# start graphics device**  
`plot( x, y, data=dt)`  
`points(x2, y2, data=dt)`  
`lines( x, y, data=dt)`  
`lines( x2, y2, data=dt)`  
#... more plot procedures  
**# stop graphics device**

- `## ggplot2`  
`p <- qplot(`  
  `x, y, data = dt,`  
  `geom = c("point", "line"))`  
`p <- p +`  
  `geom_point(aes(x=x2,y=y2)) +`  
  `geom_line(aes(x=x2,y=y2))`  
#... more plot procedures  
  
**# start graphics device**  
`p`  
**# stop graphics device**

# ggplot2: spatial & temporal data

# About the NASA data

- ☛ Measurements recorded by NASA using remote sensing on temperature, pressure, ozone, clouds over Central America 1995-2000.
- ☛ For ASA Data Expo 2006

<http://stat-computing.org/dataexpo/2006/>

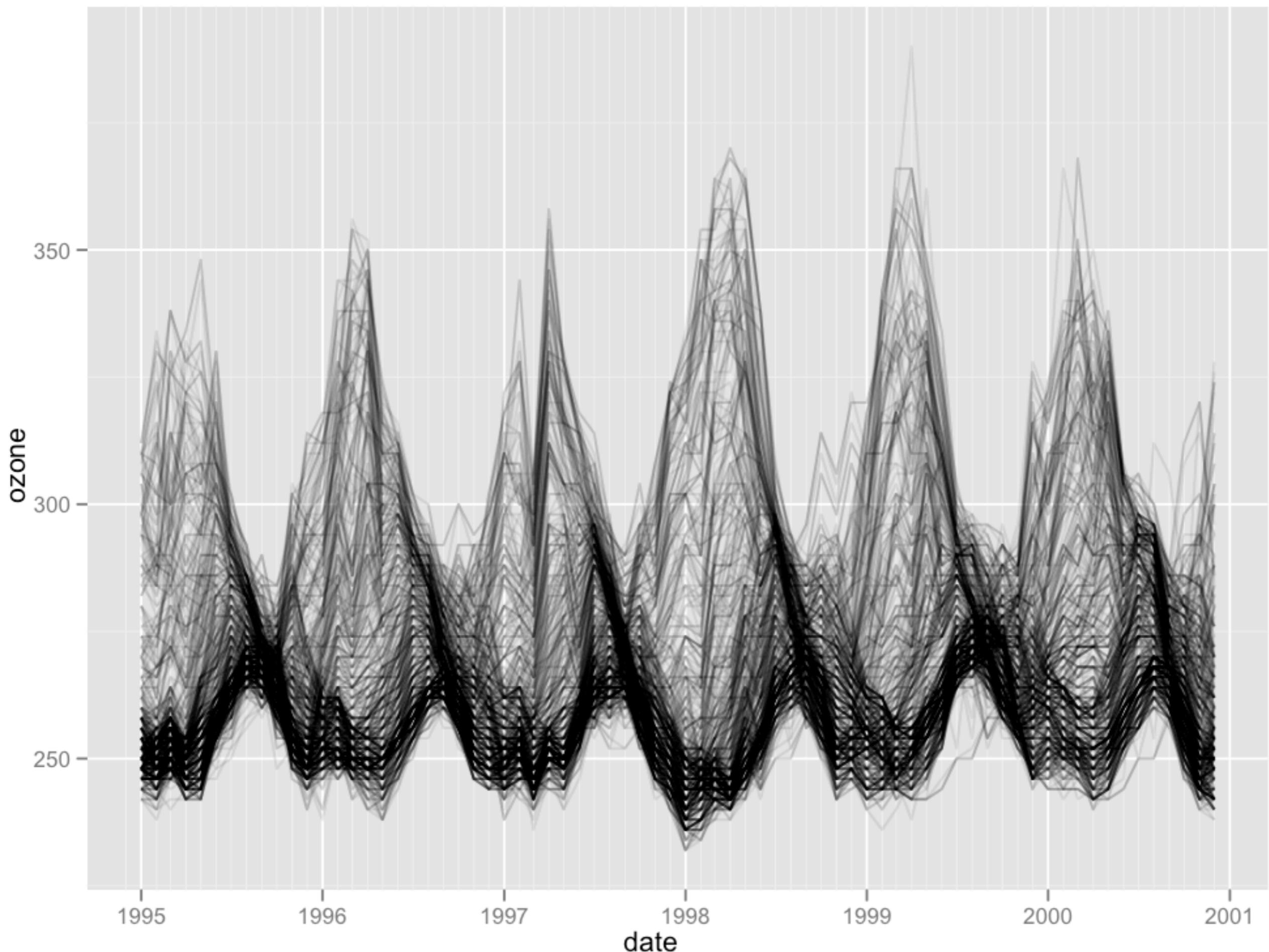
# Checking the data

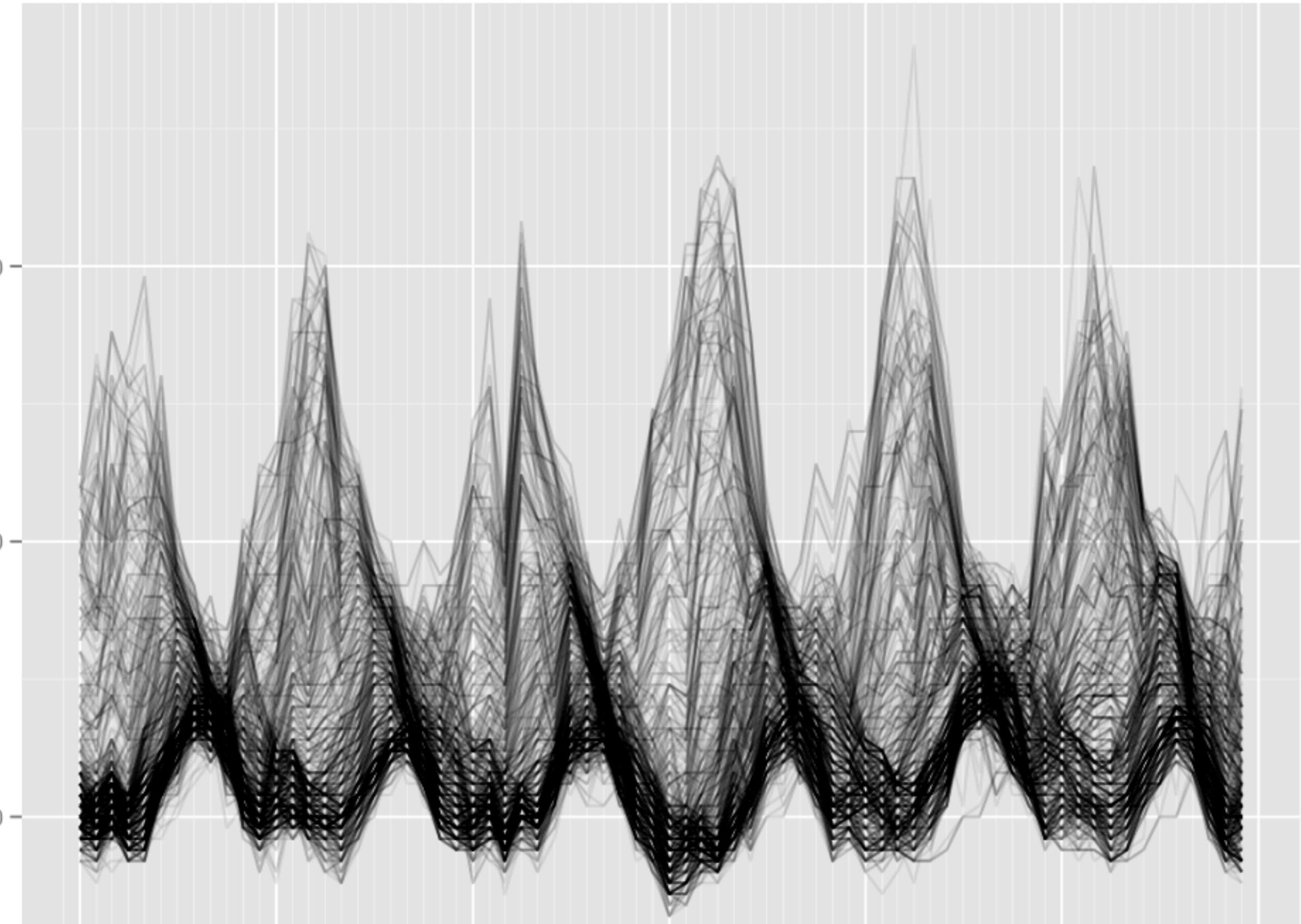
## ➤ Numerical summaries

```
> summary(nasa)
```

| time           | y             | x             | lat            |
|----------------|---------------|---------------|----------------|
| Min. : 1.00    | Min. : 1.00   | Min. : 1.00   | Min. :-21.20   |
| 1st Qu.:18.75  | 1st Qu.: 6.75 | 1st Qu.: 6.75 | 1st Qu.: -6.85 |
| Median :36.50  | Median :12.50 | Median :12.50 | Median : 7.50  |
| Mean :36.50    | Mean :12.50   | Mean :12.50   | Mean : 7.50    |
| 3rd Qu.:54.25  | 3rd Qu.:18.25 | 3rd Qu.:18.25 | 3rd Qu.: 21.85 |
| Max. :72.00    | Max. :24.00   | Max. :24.00   | Max. : 36.20   |
| long           | date          | cloudfhigh    | cloudlow       |
| Min. :-113.8   | 1995-01-01:   | 576           | Min. : 0.0     |
| 1st Qu.: -99.4 | 1995-02-01:   | 576           | 1st Qu.: 1.5   |
| Median : -85.0 | 1995-03-01:   | 576           | Median : 8.5   |
| Mean : -85.0   | 1995-04-01:   | 576           | Mean : 12.0    |
| 3rd Qu.: -70.6 | 1995-05-01:   | 576           | 3rd Qu.: 18.5  |
| Max. : -56.2   | 1995-06-01:   | 576           | Max. : 62.5    |
|                | (Other) :     | 38016         | NA's : 110.00  |

• • •

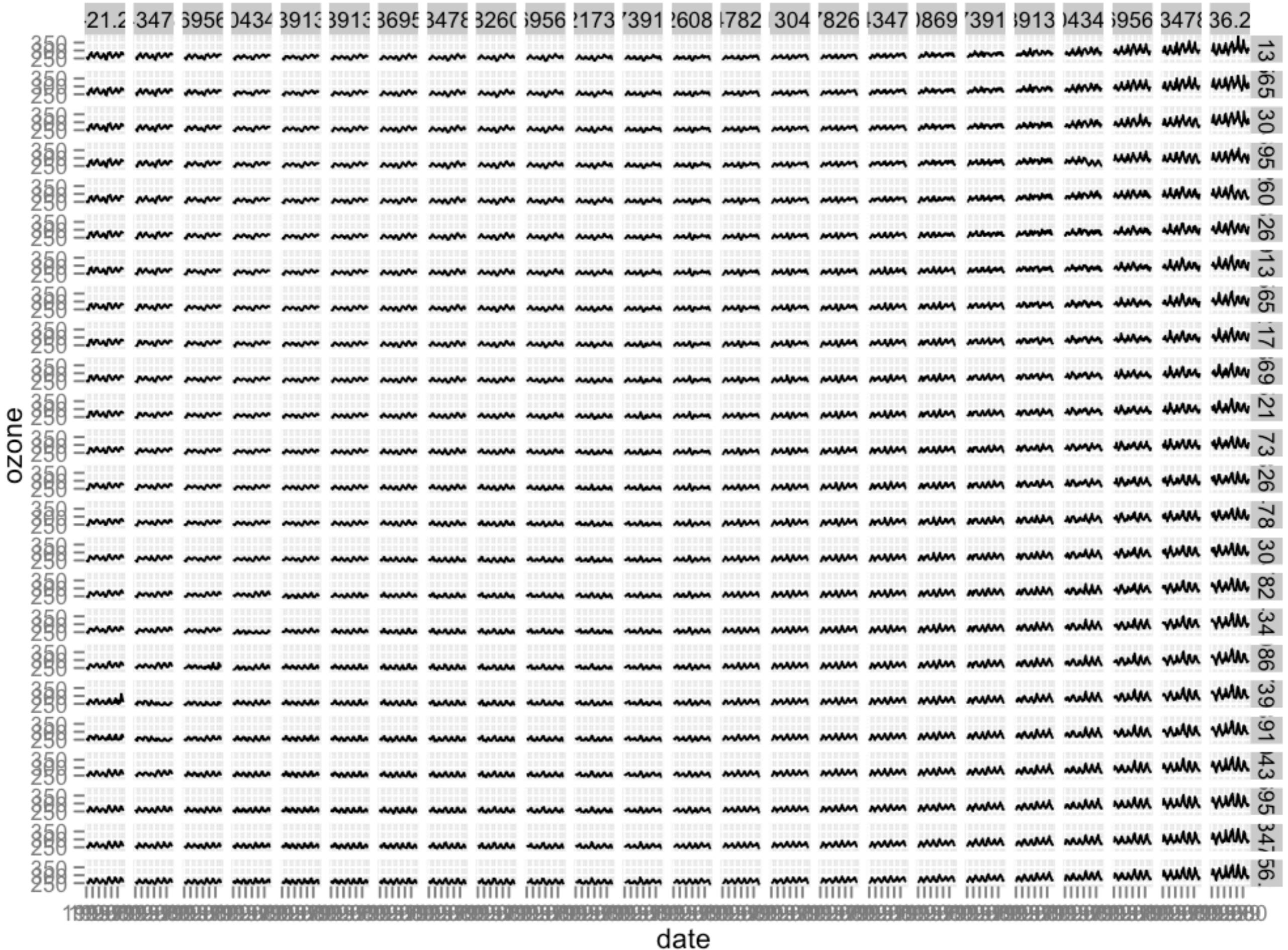


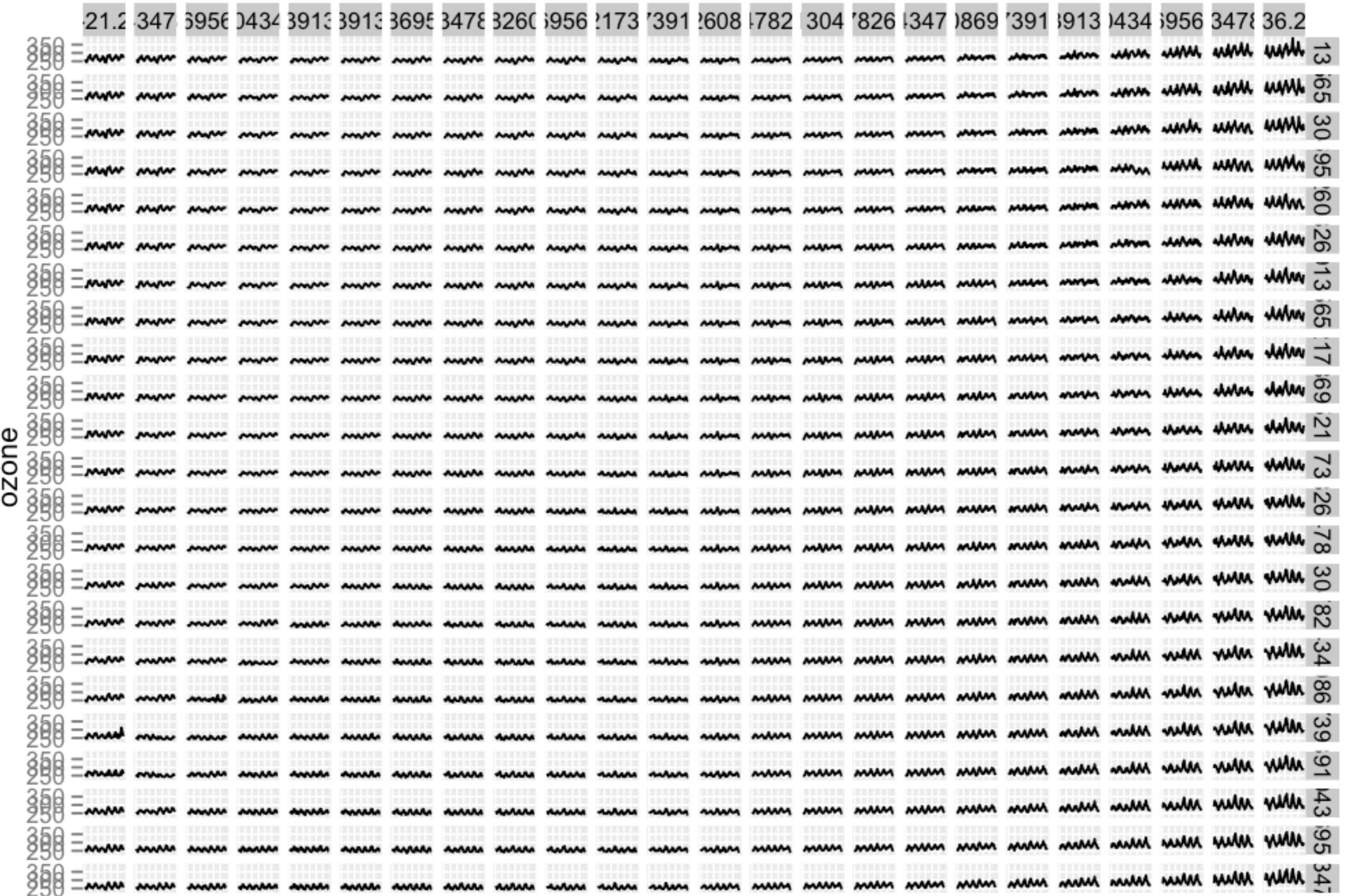


```
qplot(date, ozone, data = nasa, group = id,
geom = "line", alpha = I(0.1))
```

# Time trend

- Ozone is plotted against time (month and year) separately but overlapping for each spatial location
- Seasonality is visible - but there is a double peak. We'd guess that this correspond to northern and southern latitude differences. How can we check?



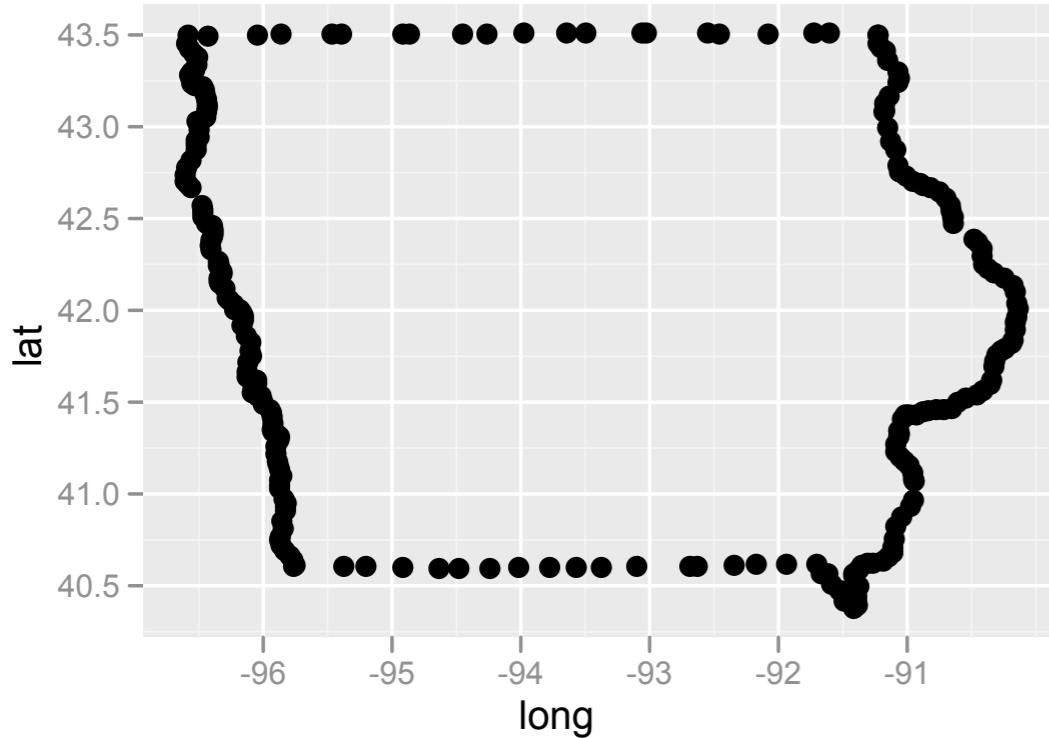


```
qplot(date, ozone, data = nasa, geom = "line") +
 facet_grid(lat ~ long)
```

# Space-time trend

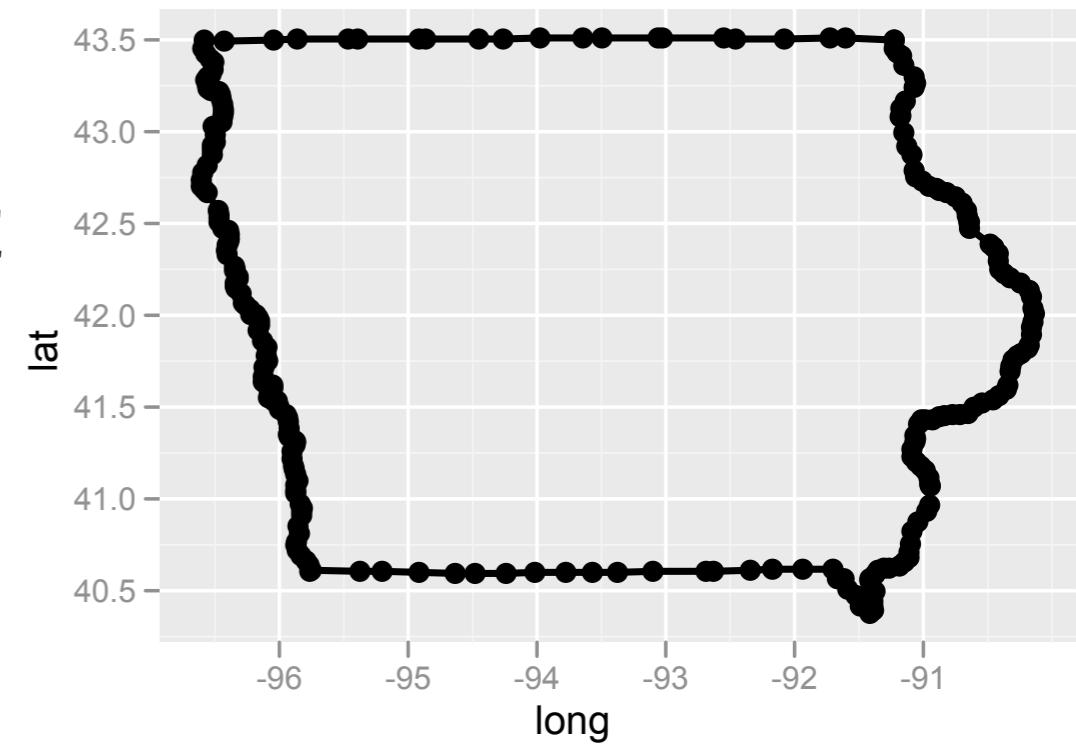
- Ozone is plotted against time (month and year) separately for each spatial location
- Seasonality is visible across the region, more so at the higher latitudes.
- This last plot took a minute to draw!

# What is a map?



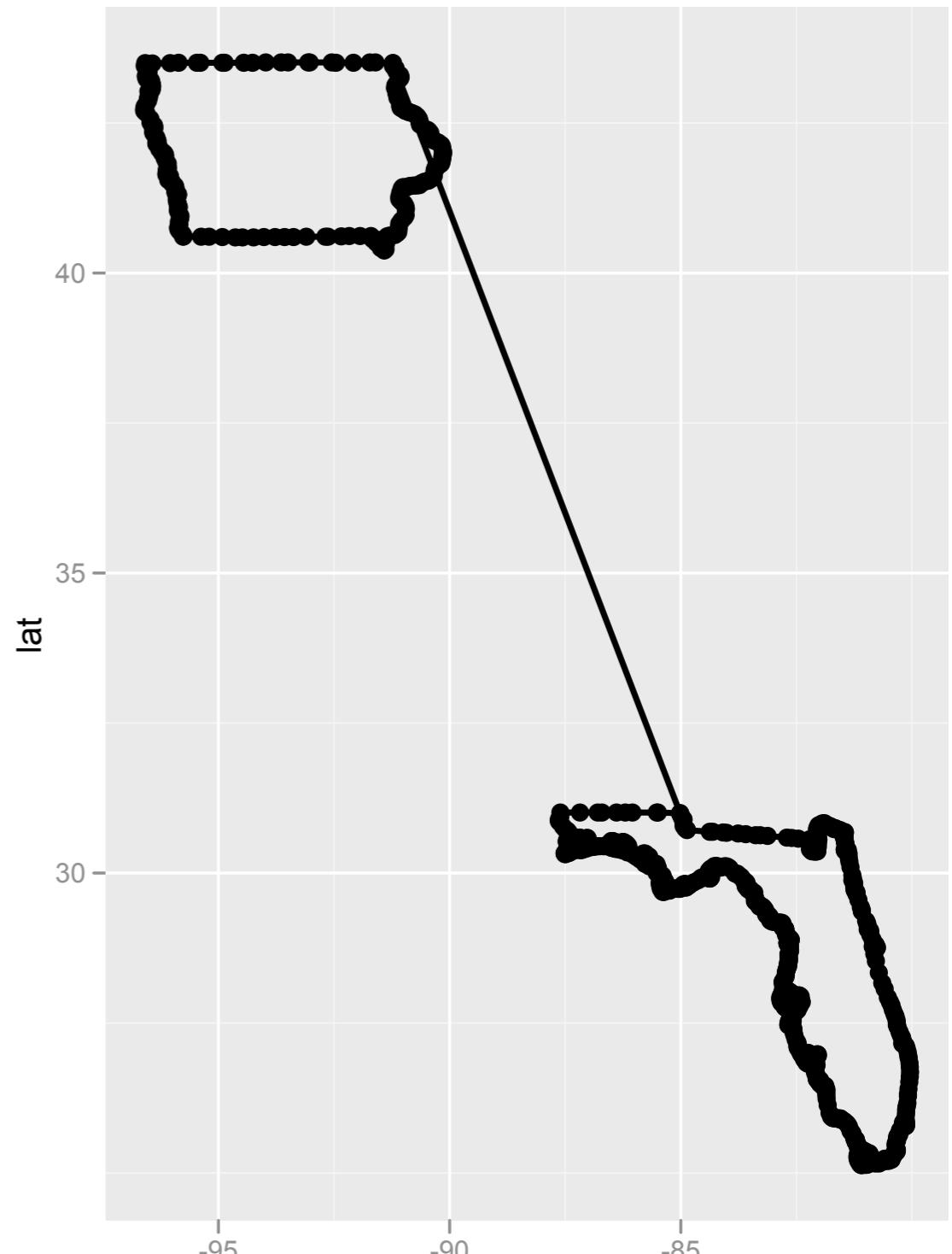
Set of **points** specifying latitude and longitude

**Polygon:** connect dots in correct order



# What is a map?

Polygon: connect only the correct dots



# What is a map?

Polygon: connect only the correct dots



# states data

- > library(maps)  
> states <- map\_data("state")  
> str(states)  
'data.frame': 15537 obs. of 6 variables:  
  \$ long : num -87.5 -87.5 -87.5 -87.5 -87.6 ...  
  \$ lat : num 30.4 30.4 30.4 30.3 30.3 ...  
  \$ group : num 1 1 1 1 1 1 1 1 1 1 ...  
  \$ order : int 1 2 3 4 5 6 7 8 9 10 ...  
  \$ region : chr "alabama" "alabama" "alabama"  
  "alabama" ...  
  \$ subregion: chr NA NA NA NA ...

```
> head(states)
```

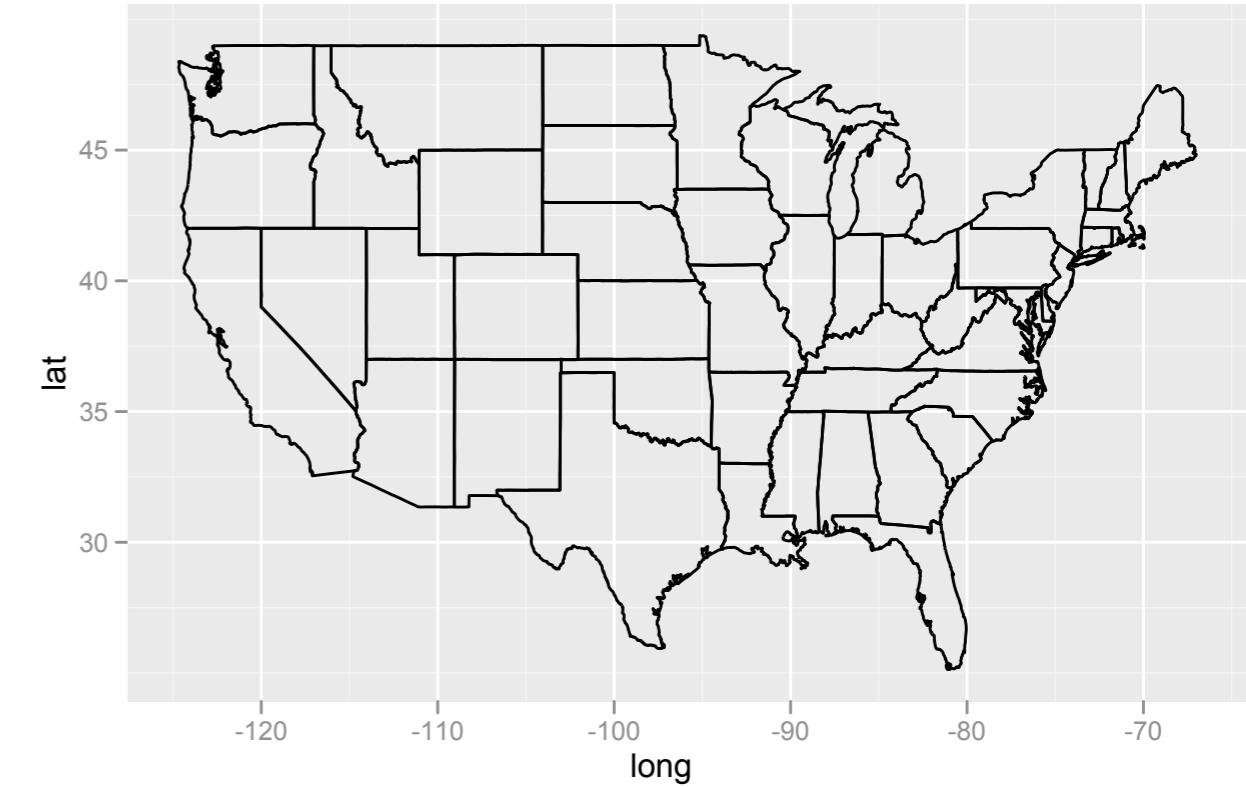
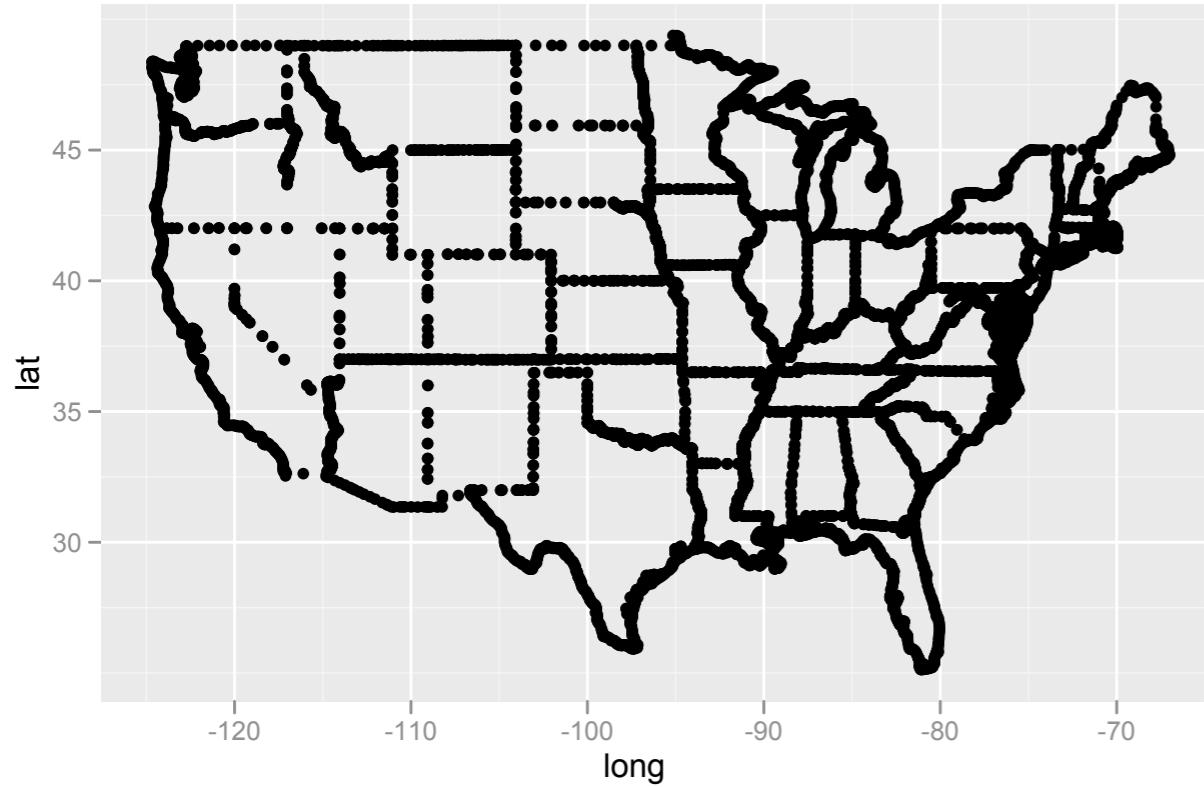
|   | long      | lat      | group | order | region  | subregion |
|---|-----------|----------|-------|-------|---------|-----------|
| 1 | -87.46201 | 30.38968 | 1     | 1     | alabama | <NA>      |
| 2 | -87.48493 | 30.37249 | 1     | 2     | alabama | <NA>      |
| 3 | -87.52503 | 30.37249 | 1     | 3     | alabama | <NA>      |
| 4 | -87.53076 | 30.33239 | 1     | 4     | alabama | <NA>      |
| 5 | -87.57087 | 30.32665 | 1     | 5     | alabama | <NA>      |
| 6 | -87.58806 | 30.32665 | 1     | 6     | alabama | <NA>      |

# Maps in ggplot2

- Geoms: polygon or path for filled polygons or outlines only

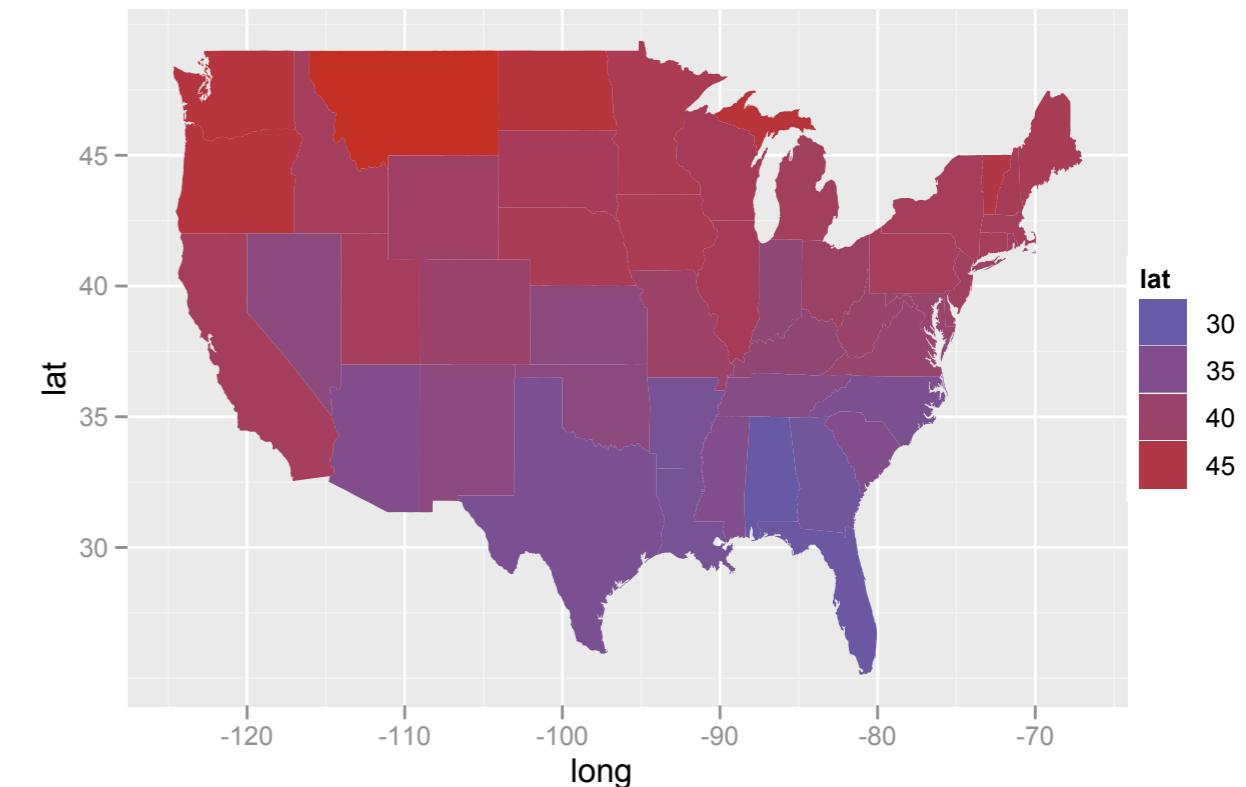
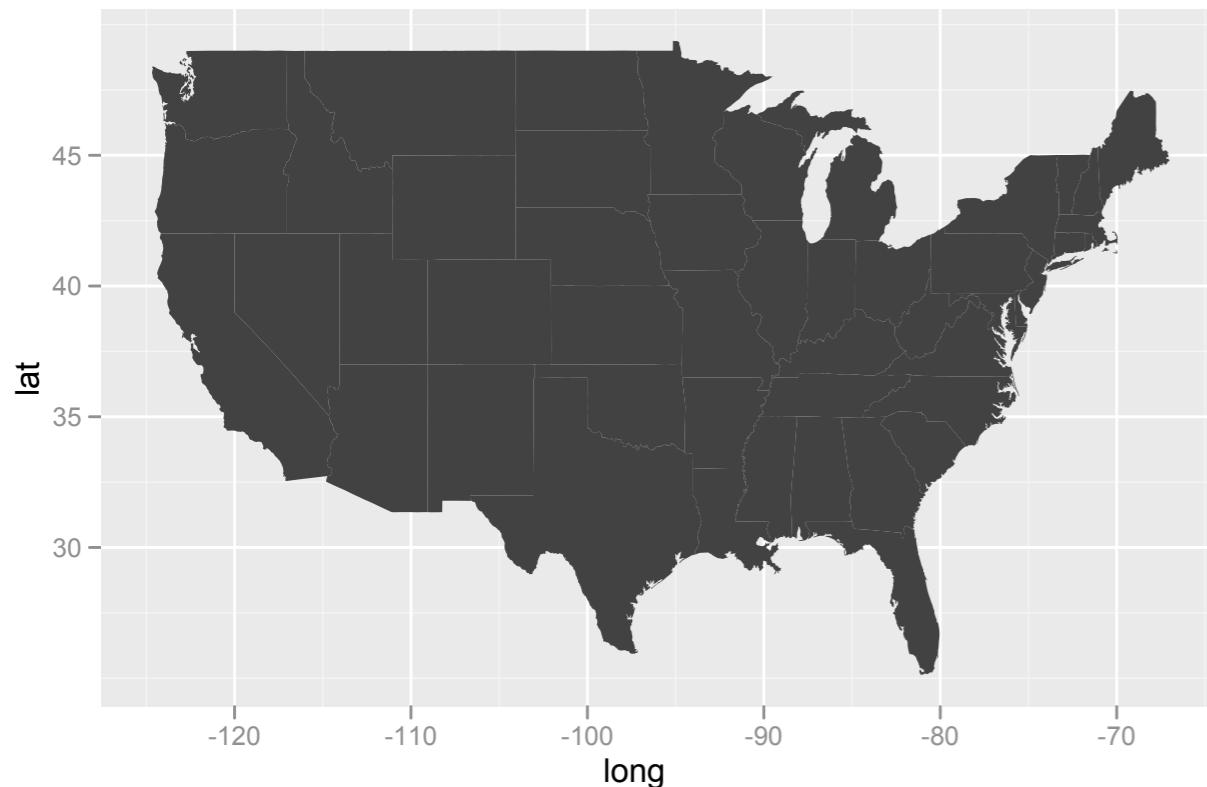
```
> qplot(data = states, x = long, y=lat,
 order = order, group = group,
 geom = "path"/"polygon")
```

```
qplot(long, lat, geom="point", data=states)
```



```
qplot(long, lat, geom="path", data=states, group=group, order = order)
```

```
qplot(long, lat, geom="polygon", data=states, group=group, order = order)
```



# Making Maps look like Maps

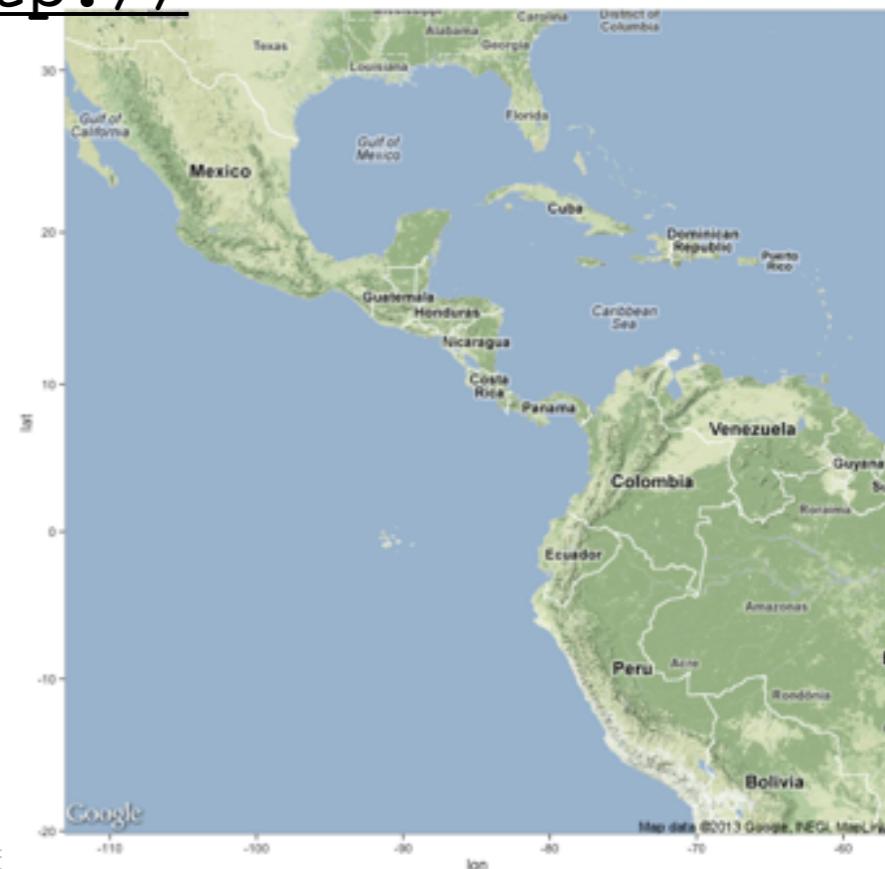
```
> theme(axis.title.x=element_blank(), # remove x and y label
 axis.title.y=element_blank(),
 axis.line=element_blank(), # no axis at the bottom and the left
 axis.ticks=element_blank(), # don't show ticks
 axis.text.y = element_blank(), # no tick marks
 axis.text.x = element_blank(),

 panel.grid.minor=element_blank(), # don't show any gridlines
 panel.grid.major=element_blank(),
 panel.background=element_blank(), # invisible background
 panel.border = element_blank(), # no border around plot space
 panel.margin = unit(0, "lines")
)
```

# RGoogleMaps

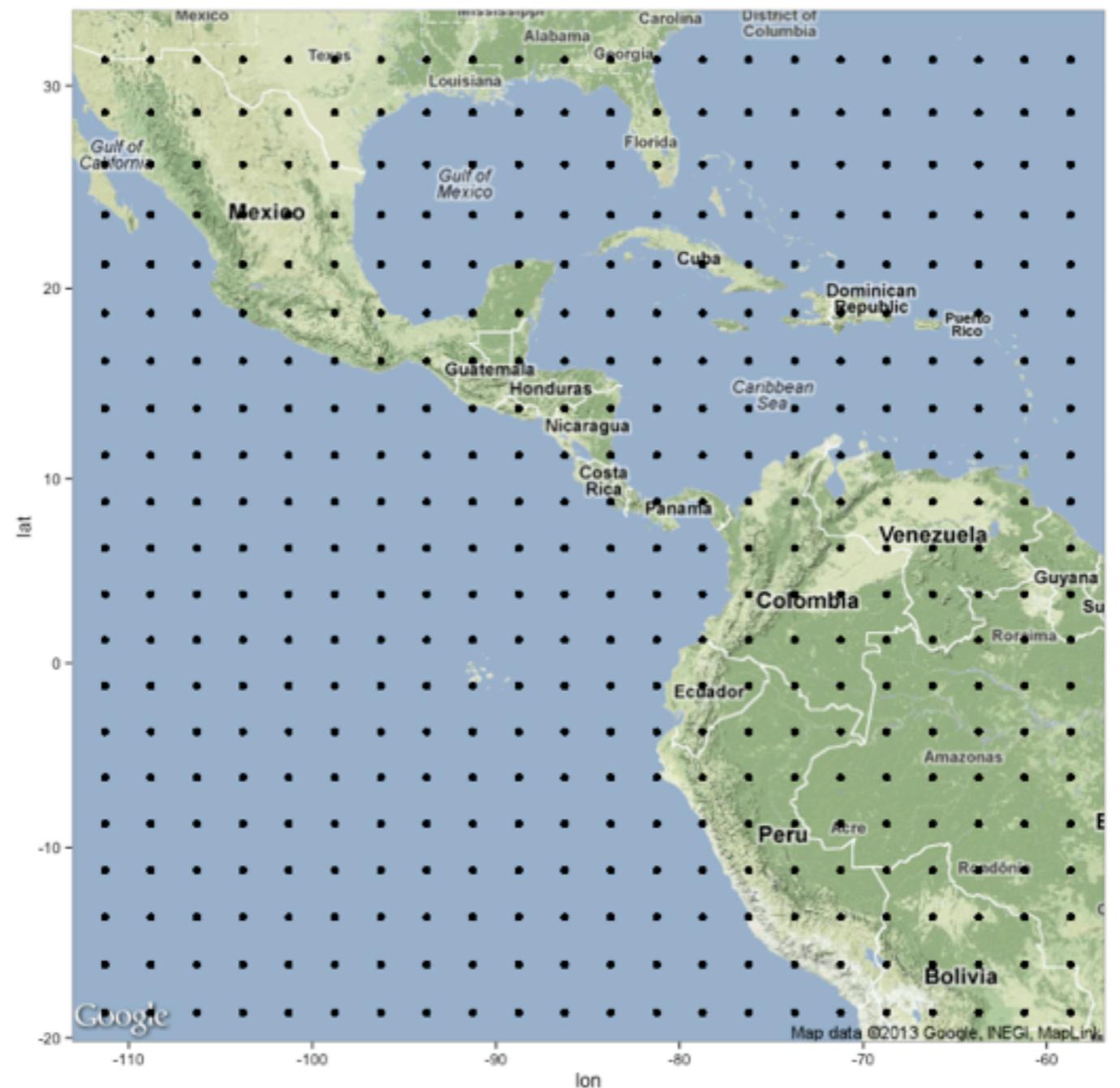
Load a satellite image:

```
> library("ggmap")
> nasa_center <- c(lon=-85.0, lat=7.50)
> nasamap <- get_googlemap(center = nasa_center, zoom=4)
Map from URL : http://maps.googleapis.com/maps/api/staticmap?center=7.5,-85&zoom=4&size=%20640x640&maptype=terrain&sensor=false
Google Maps API Terms of Service : http://developers.google.com/maps/terms
> ggmap(nasamap)
```



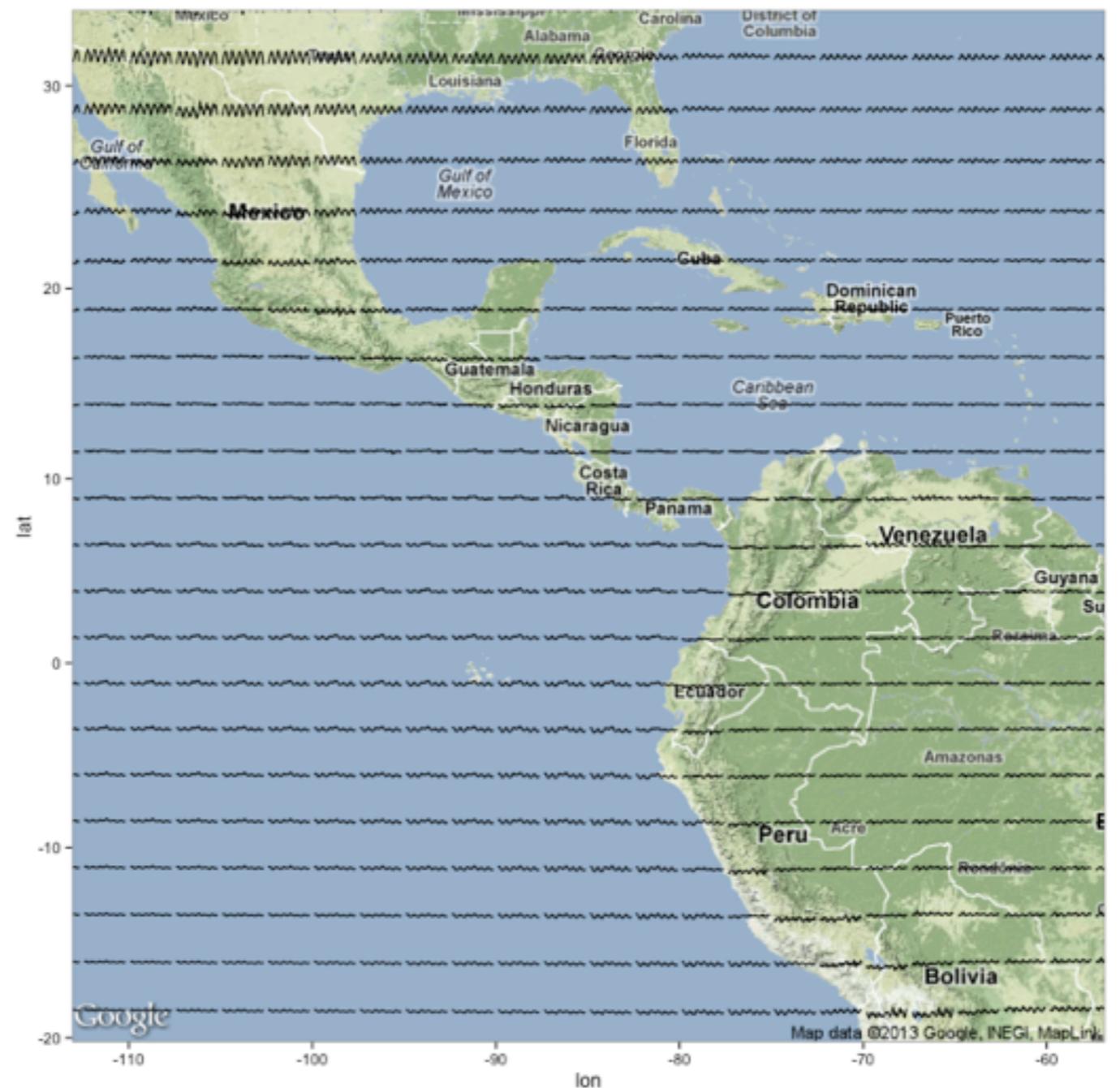
# Adding to satellite images

```
> ggmap(nasamap) + geom_point(data=nasa,
aes(x = long, y = lat))
```



# Adding to satellite images

```
> ggmap(nasamap) + geom_line(data=nasa.gly, aes(x=gx,
y=gy, group = gid))
```



Questions?  
Demo?

# Links

- <http://docs.ggplot2.org/>
- <http://streaming.stat.iastate.edu/~dicook/NCAR/>
- <http://vita.had.co.nz/papers/glyph-maps.pdf>
- <http://vita.had.co.nz/papers/layered-grammar.pdf>
- Displaying time series, spatial and space-time data with R  
(not ggplot2) <http://oscarperpinan.github.io/spacetime-vis/>