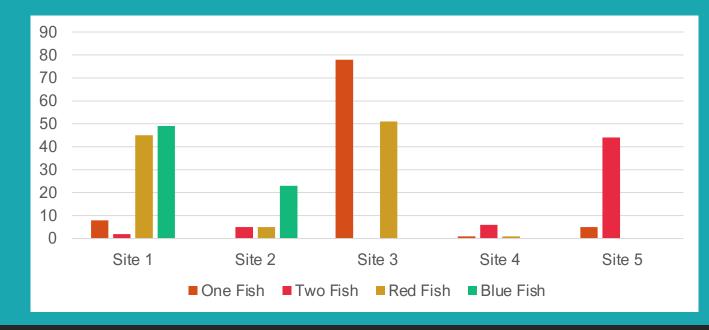


Species	One	Two	Red	Blue
Site				
1	8	2	45	499
2	0	5	5	23
3	78	0	51	0
4	1	6	1	0
5	5	44	0	0

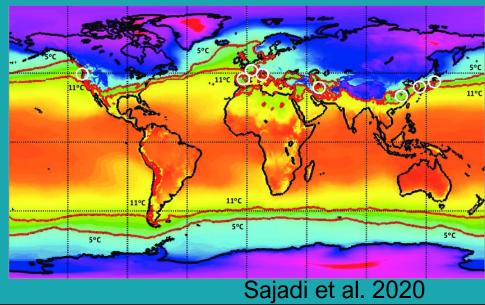












# How do I know if my

# data are 'big?'

 1 M records = good to go, 1 M – 1 B = can work in R with some extra help, > 1 B = need to be analyzed with map reduce algorithms with help from Hadoop etc.

#### More practically...

- If R doesn't work for you because you have too much data
- What can get more difficult when data is big?
  - The data may not load into memory
  - Analyzing data may take a long time
  - Visualizations get messy



# Okay, my data are too 'big,' what now?

- Check if you're using 64-bit version of R
- Allocate more memory (if you have it) to R
- Reduce # of objects stored in memory

#### Still too big?

- Make data smaller
- Get a bigger computer
- Access data differently
- Split up the dataset for analysis



### Make data smaller

 Run your analyses on a smaller chunk of your overall dataset to make sure it is indeed a memory or data size issue

# Get a bigger computer

 Convince your supervisor to buy you a new computer

#### When that fails

- Rutgers High-Performance Clusters
  - Amarel (DEENR Node)
  - Annotate (SEBS; Windows & Linux; get in touch with Robert Muldowney)

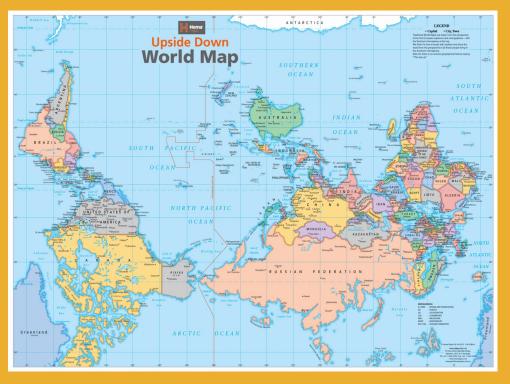


# Split up analyses

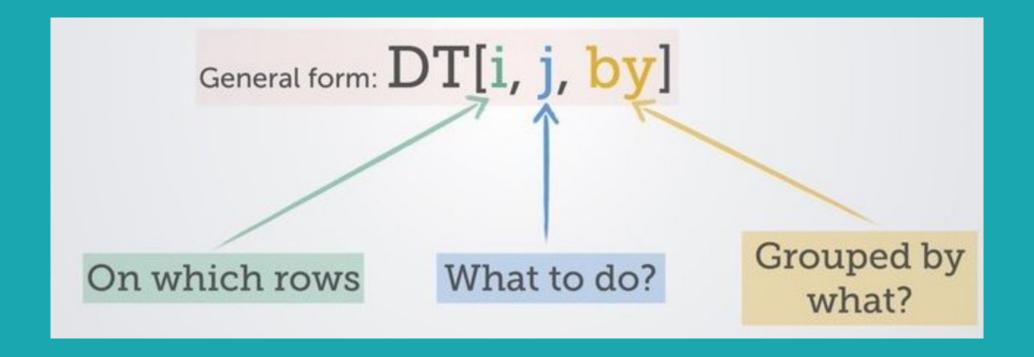
- Do analyses on x MB at a time
- Combine results
- Can use computing clusters to parallelize analysis:
  - Farming out subtasks to independent processors
  - MapReduce algorithms

## Access data differently

- Use `data.table` package
  - Good for very large data files
  - High performance version of base R's data.frame
  - Offers fast subset, grouping, update, and joins
  - Makes it easy to turn an existing data frame into a data table



#### data.table



#### Resources

Wisconsin Data Science

Large Datasets and You

FasteR! HigheR! StrongeR! - A Guide to Speeding Up R Code for Busy People

Taking R to the Limit, Part II: Working with Large Datasets

R Bloggers: Big Data in R

**CRAN-R:** Intro to Data Table

CRAN-R: Keys in Data Table

CRAN-R: Assignment by Reference