

Introduction to spatial data in R for paleontologists

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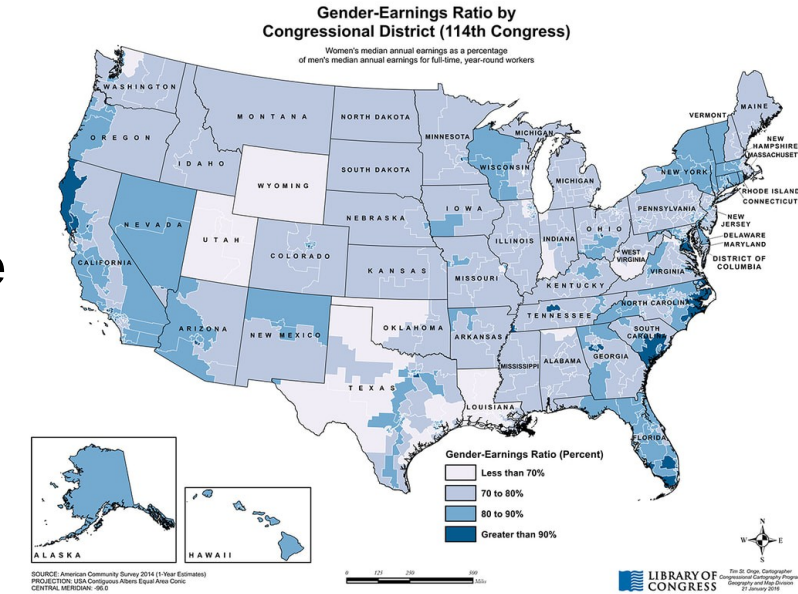
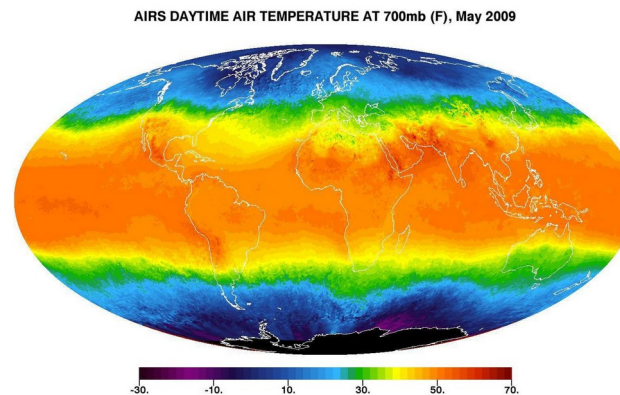
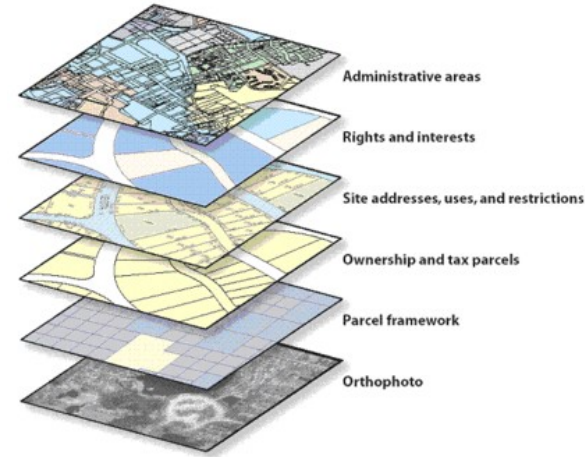
Basic Concepts

Where, what, why?

GIS basics

G(eographic) I(nformation) S(ystems/software) are everywhere

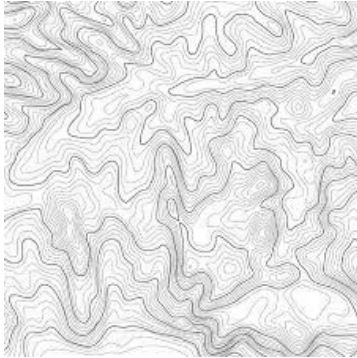
- Science
- Civil Engineering
- Aeronautics
- Military
- Economics
- etc.



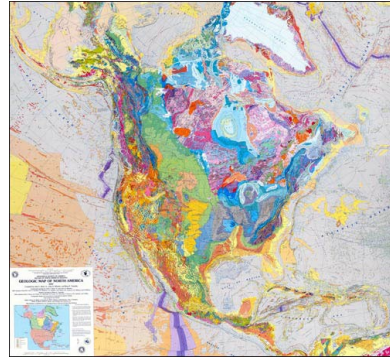
Vital in Earth Sciences

G(eographic) I(nformation) S(ystems) are everywhere

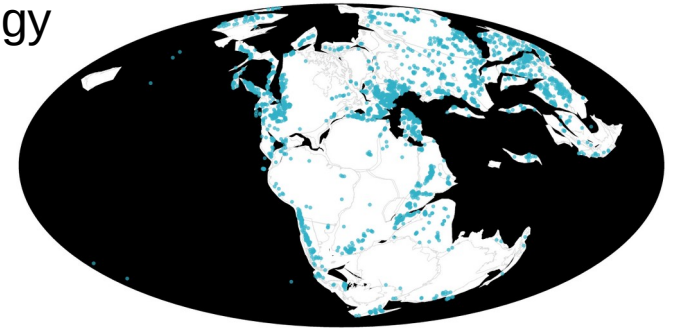
- topography



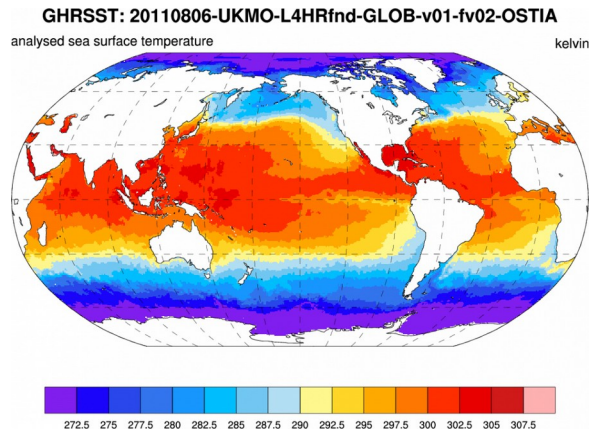
- geology



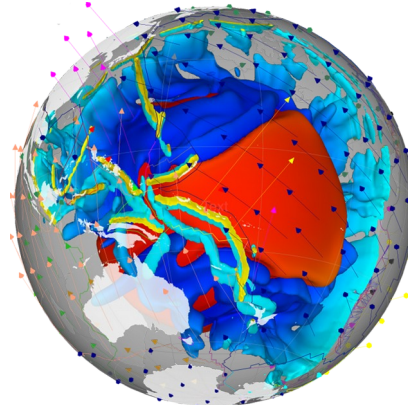
- paleontology



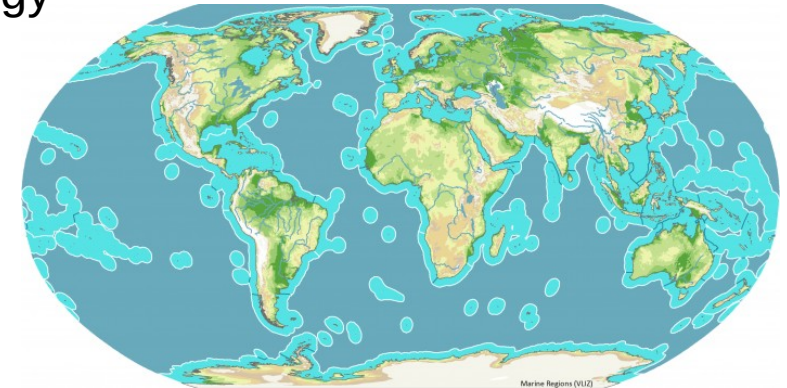
- climate



- geophysics



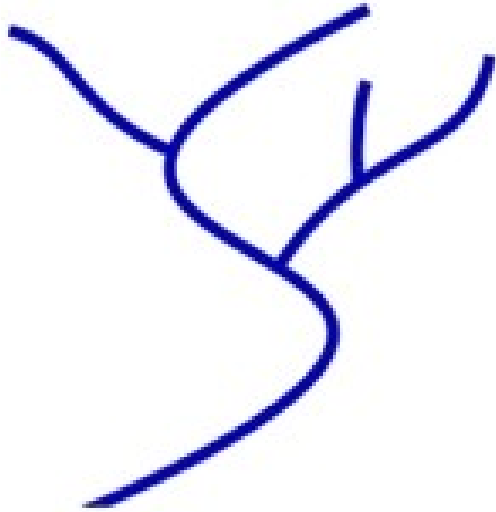
- ecology



Basic data types

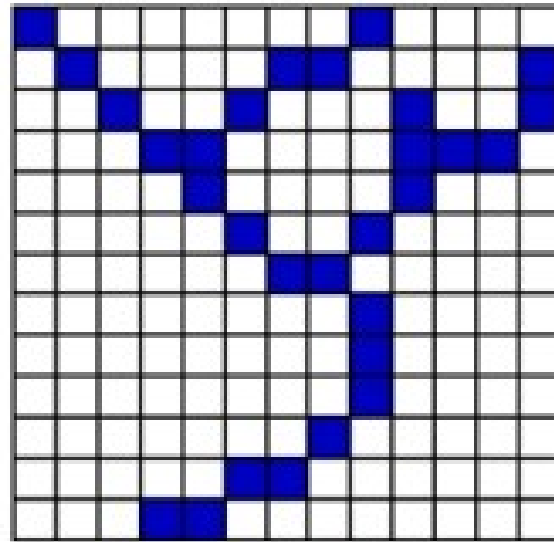
- Similar to computer graphics
- Sometimes in 3D

Object view



Vector

Field view

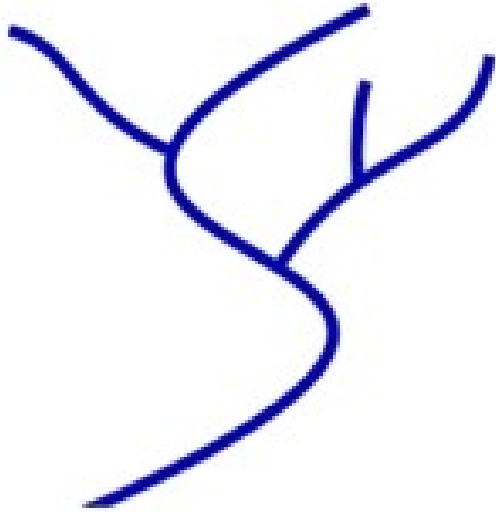


Raster

Basic data types

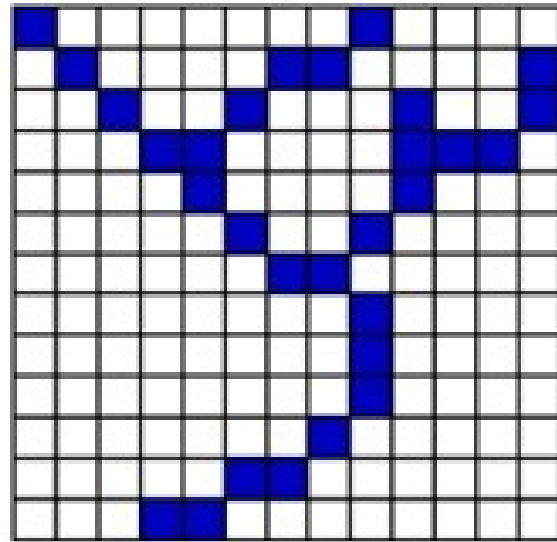
- Similar to computer graphics
- Often in 3D

Object view



Vector

Field view



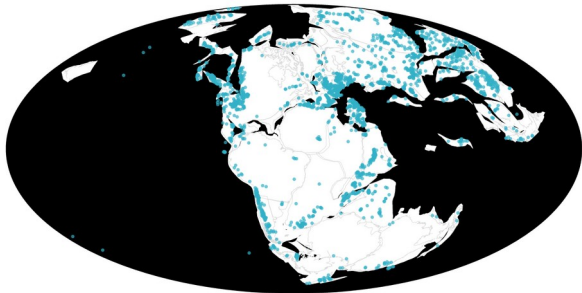
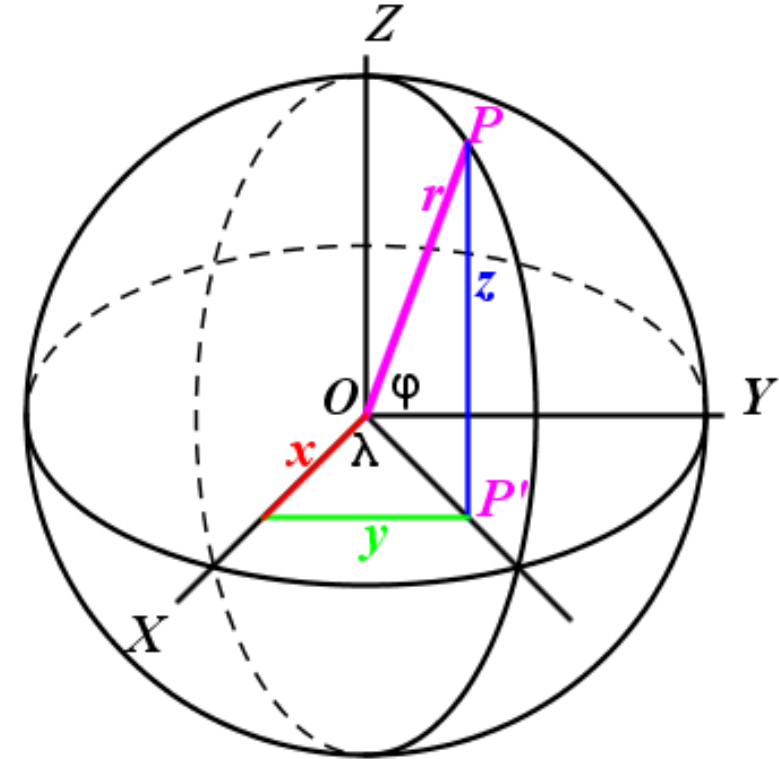
Raster

There is one twist:



Vector data

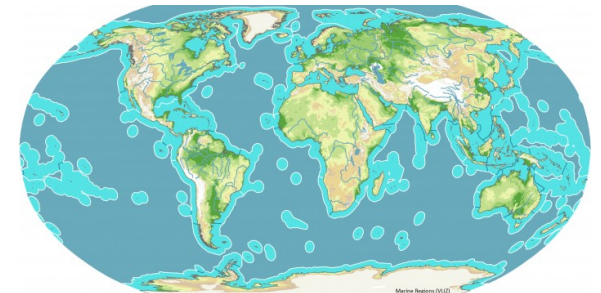
- Structure is defined with points that have coordinates
- Spherical coordinates, Cartesian too, or projection-specific
- Additional attributes are rendered to the entities
- 3 primary kind



Points



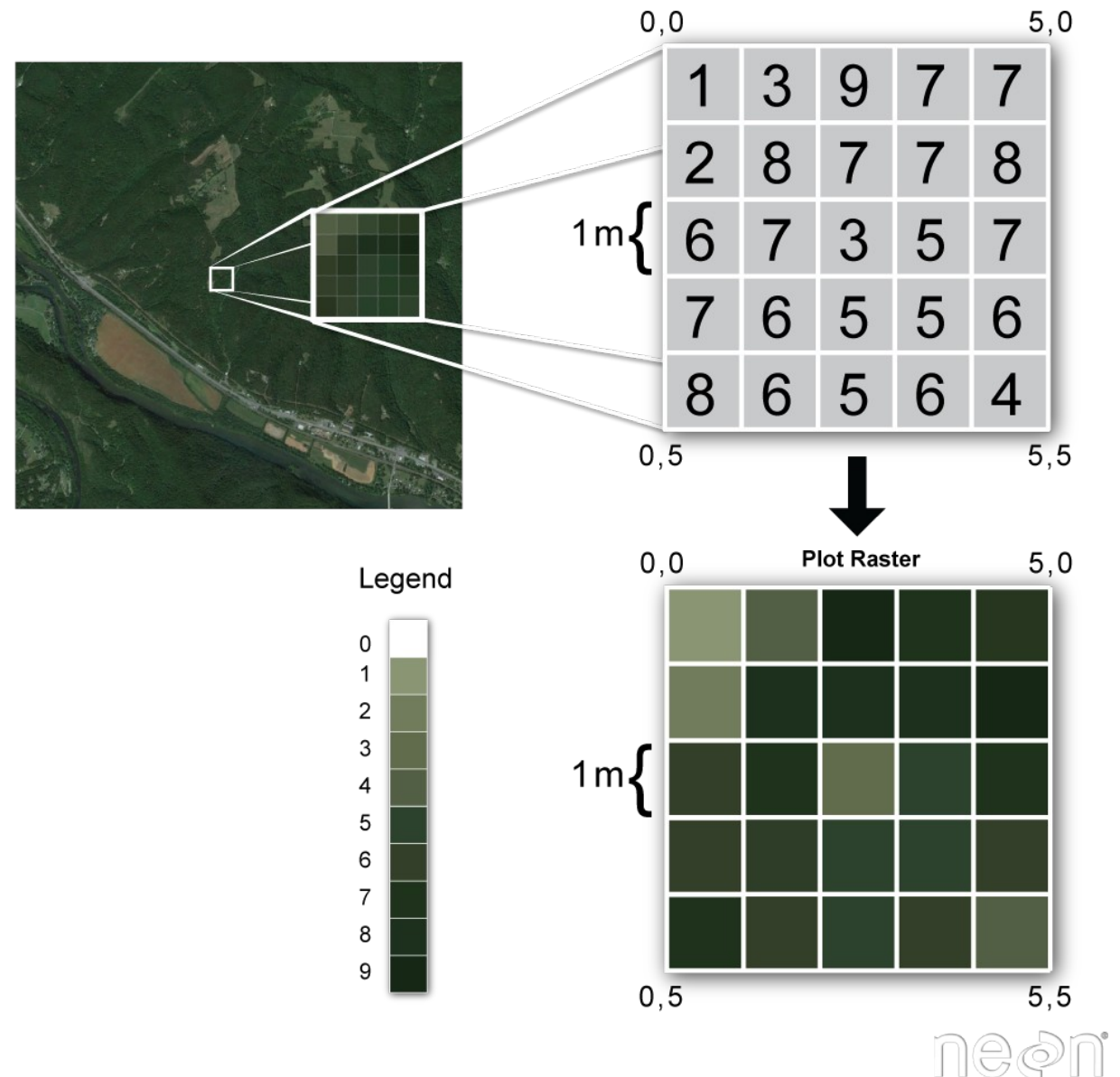
Lines



Polygons (shapes)

Raster data

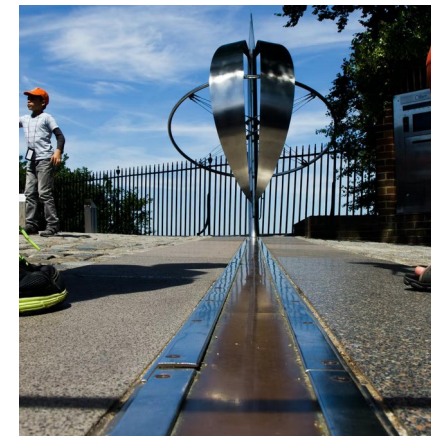
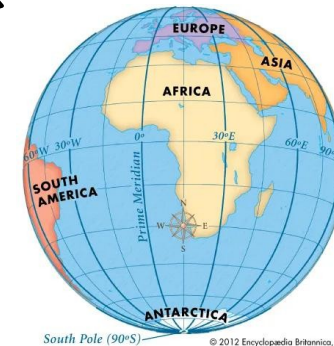
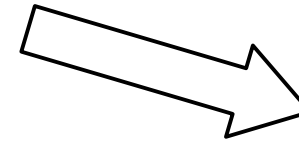
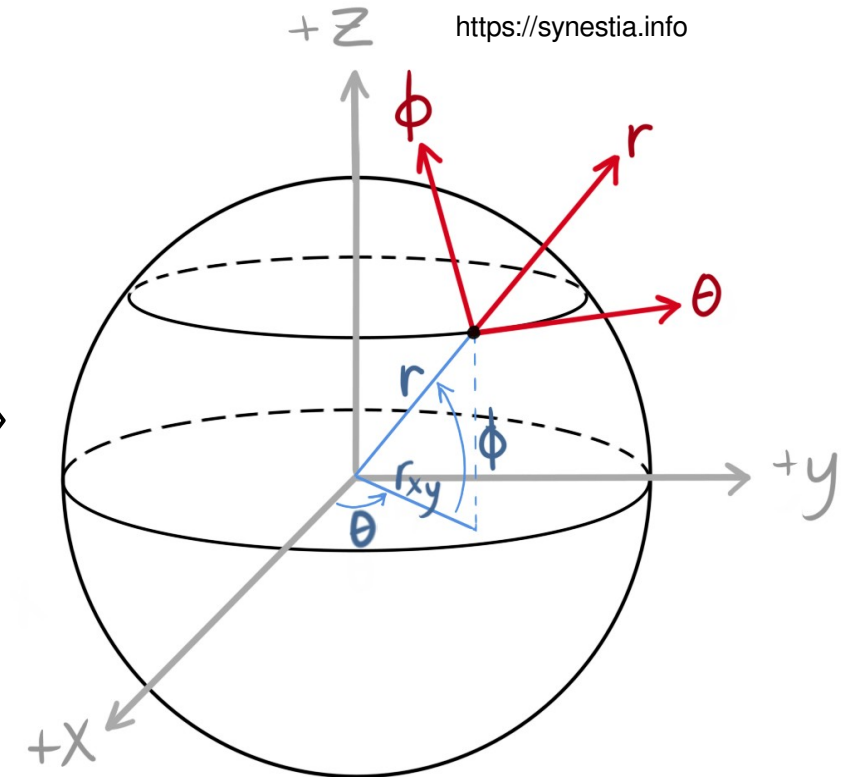
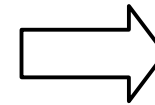
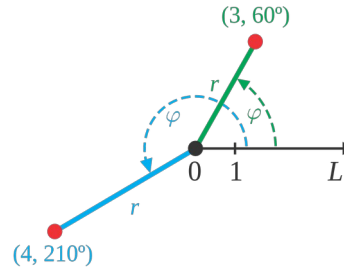
- Structure is defined by a grid, data is a lattice of values
- The field view of Earth
- Similar to raster graphics, but with georeferencing



Coordinate Reference Systems

Geographic coordinates

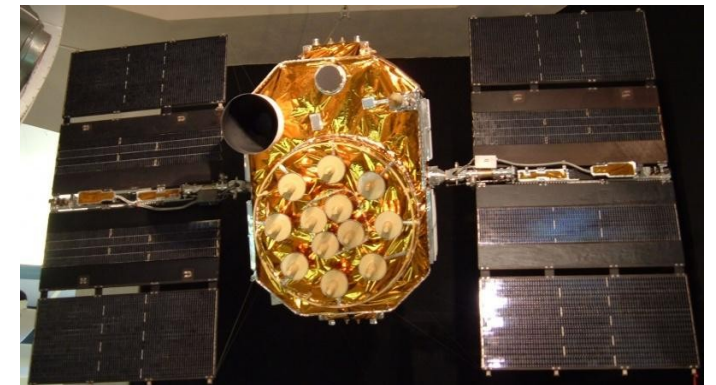
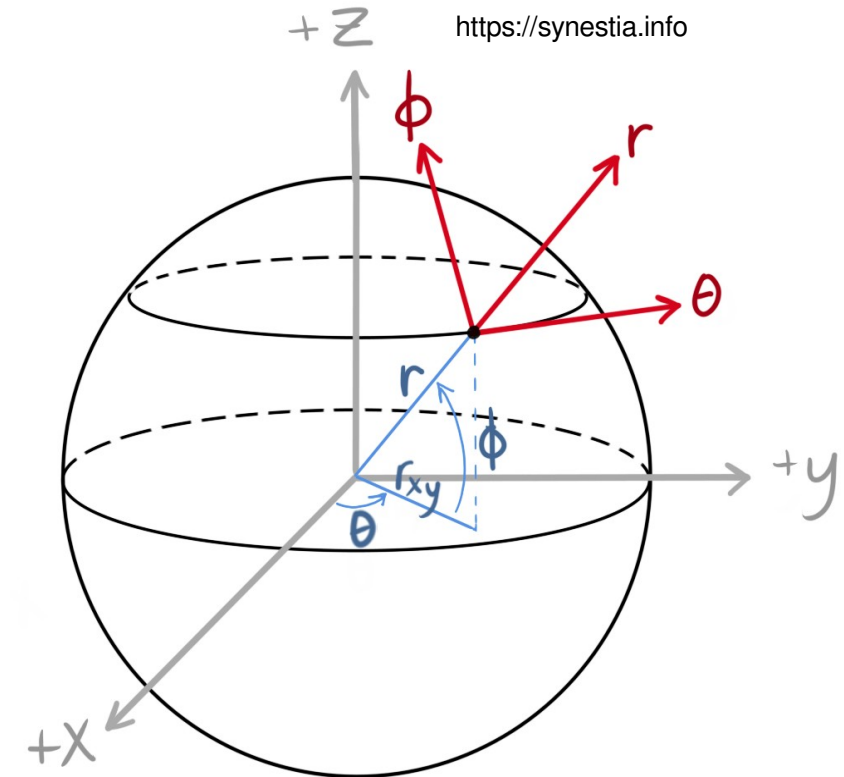
- Based on polar coordinates
- ϕ : latitude
 - $[-90^\circ, 90^\circ]$, equator : 0°
- θ : longitude
 - $[-180^\circ, 180^\circ]$, 0° : prime meridian
- r : elevation



Coordinate Reference Systems

Geocentric coordinates

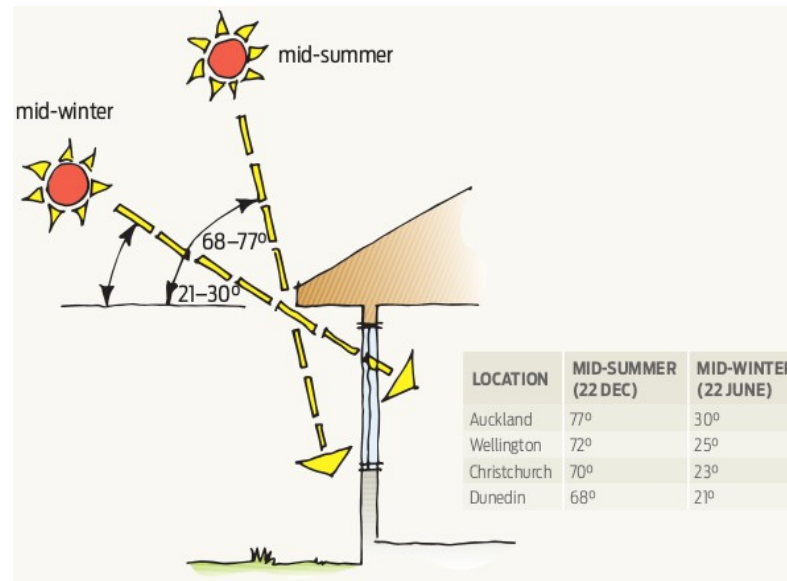
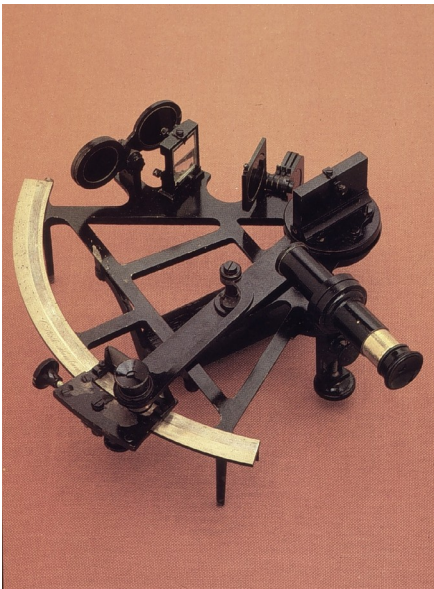
- x, y, z , Earth-Centered Coordinate System
- Based on center of mass, equator and PM
- Used for satellite tracking and navigation (e.g. GPS)
- WGS84 datum



Coordinate Reference Systems

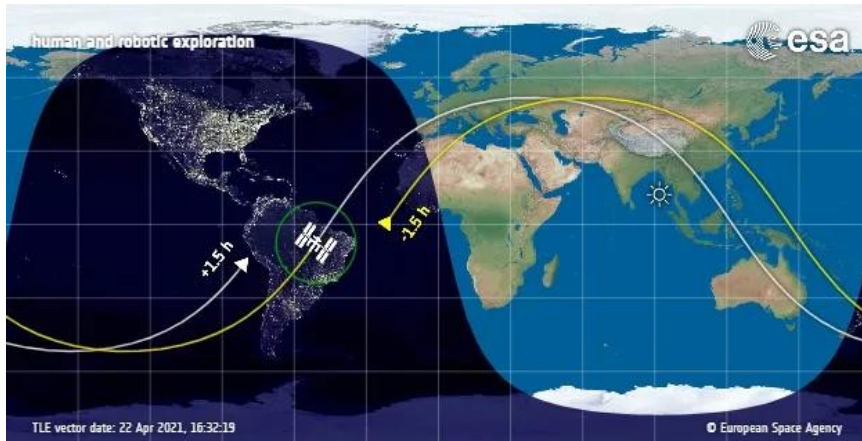
Projection based coordinate systems

- Surface: a 2-dimensional map
- Traditionally: Cartography
- Especially nautical applications

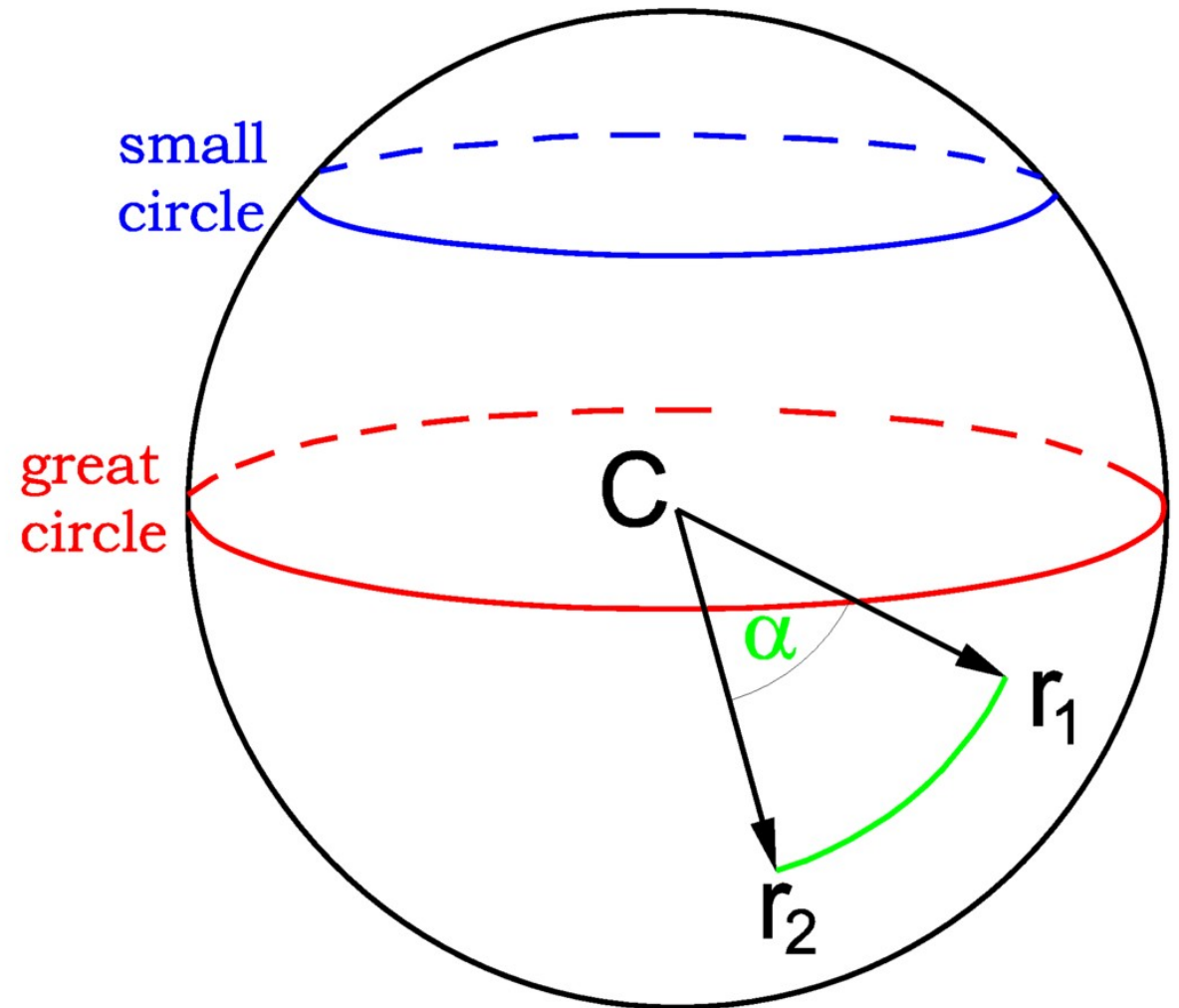


Spheres and Circles

- There are no straight lines
- All points are connected by arcs, either along a great or a small circle

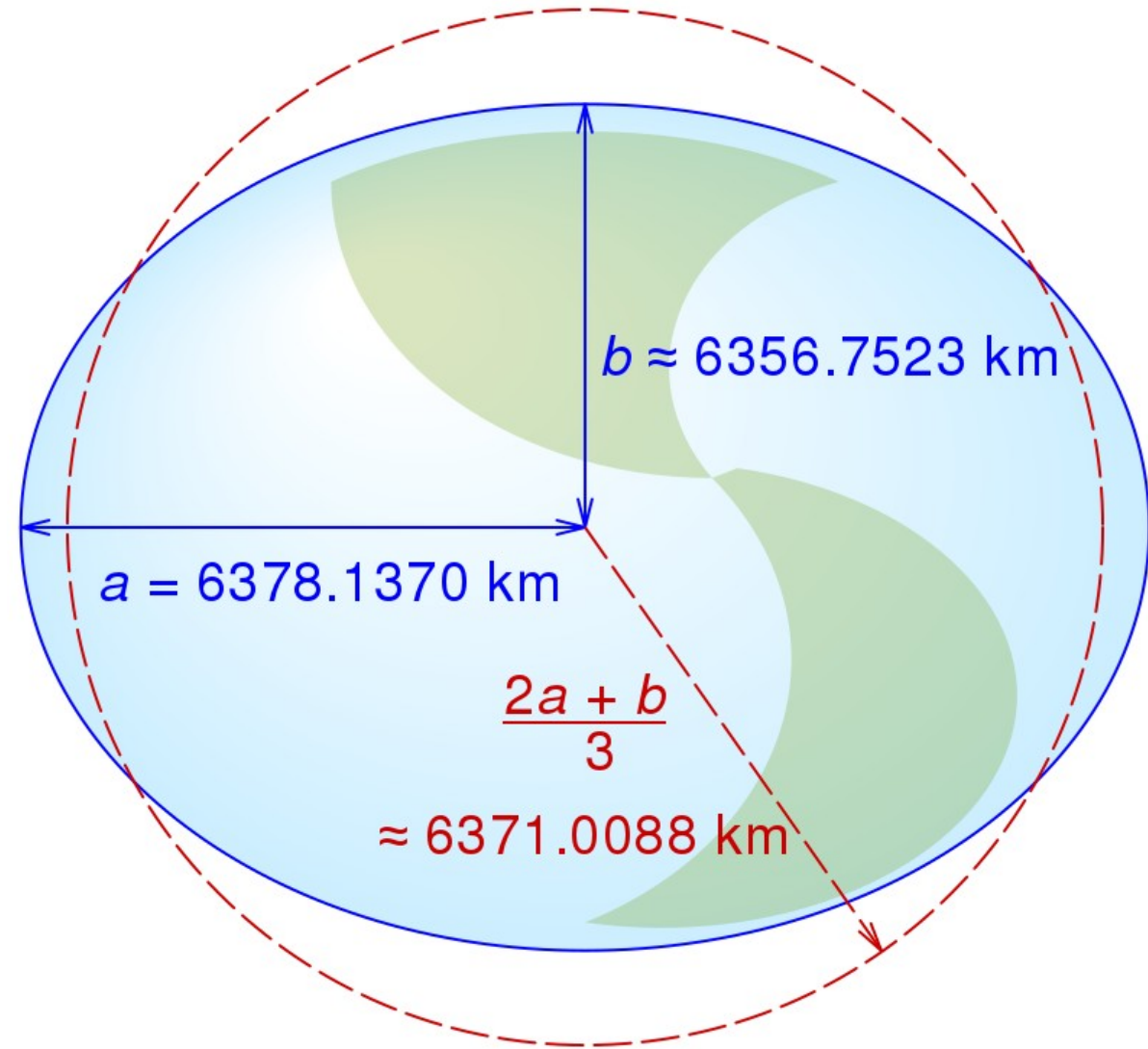


Path of the ISS



The reference ellipsoid

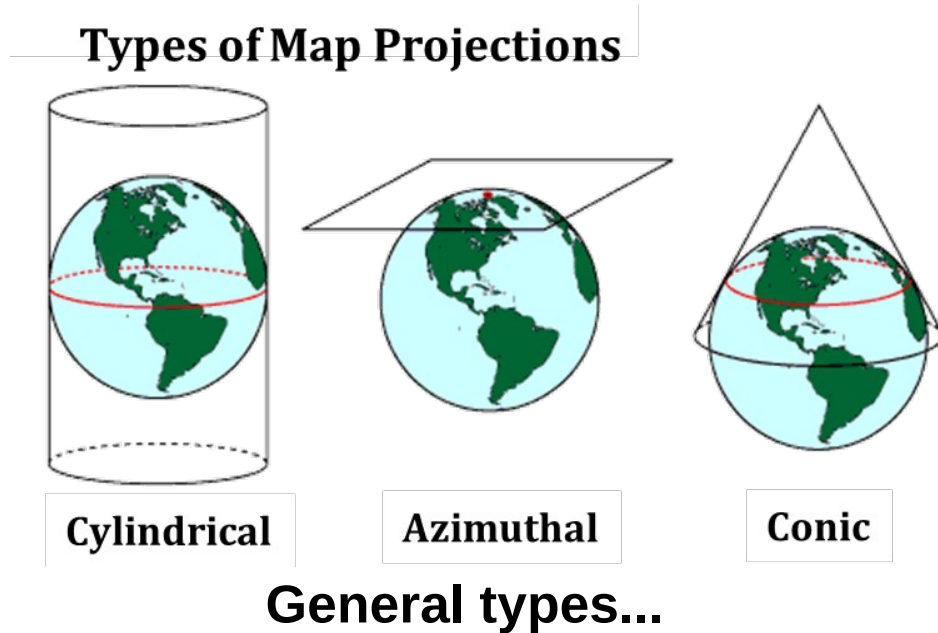
- Approximates the geoid
- Flattened rotational ellipsoid
- Used as a basis for elevation



Coordinate Reference Systems

Map projections

- There is dozens of them
- Complex transformations of spherical coordinates
- They all distort the globe in some sense:
 - conserve area and distort angles (*equal-area projection*)
 - distort area and conserve angles (*conformal projection*)
 - distort both area and angles

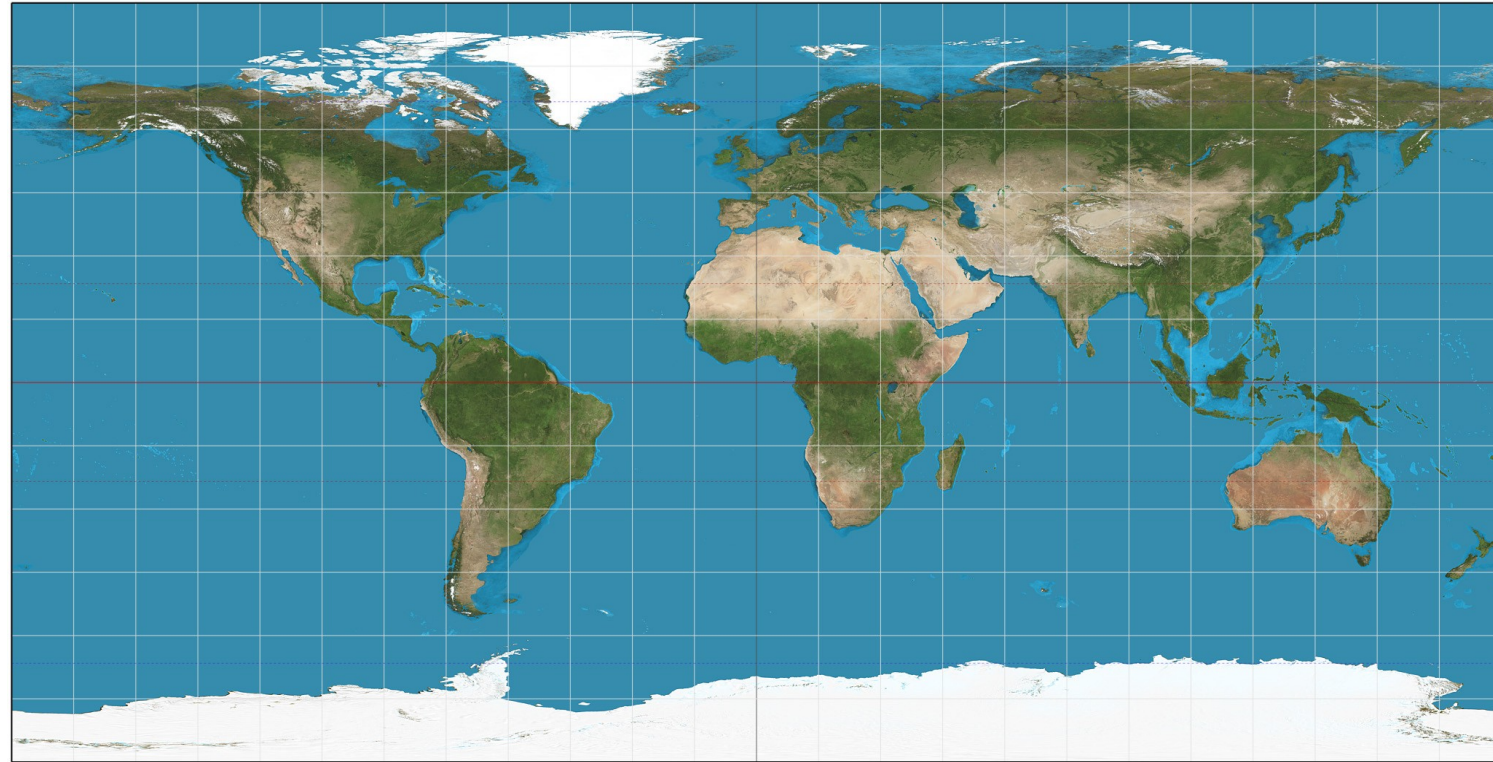


The True size of.. :
<https://www.thetruesize.com>

Coordinate Reference Systems

e.g. Equirectangular Projection

- Longitude (x) – Latitude (y)
- Centered around (0, 0)
- Plate Carée
- Most frequently used for visualization of global-scale data
- Distorts everything



Coordinate Reference Systems

e.g. Mercator projection

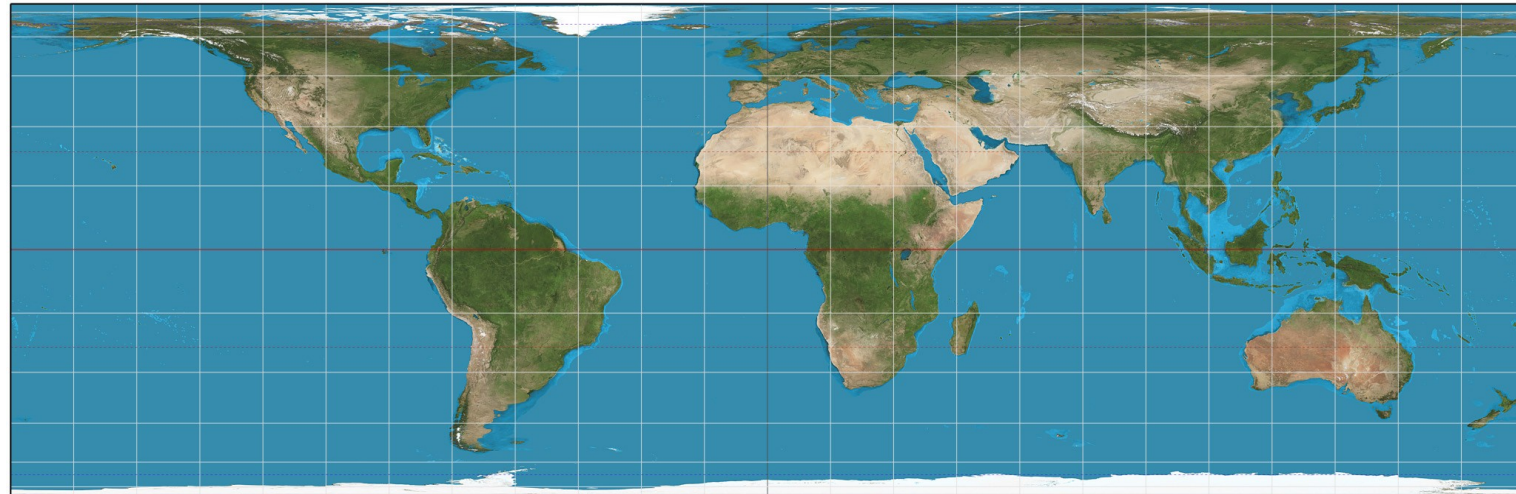
- Conformal
- (nautical use)
- Highly distorts areas
- Cannot represent poles
- Variant: Google Earth



Coordinate Reference Systems

e.g. Lambert's Cylindrical EA Projection

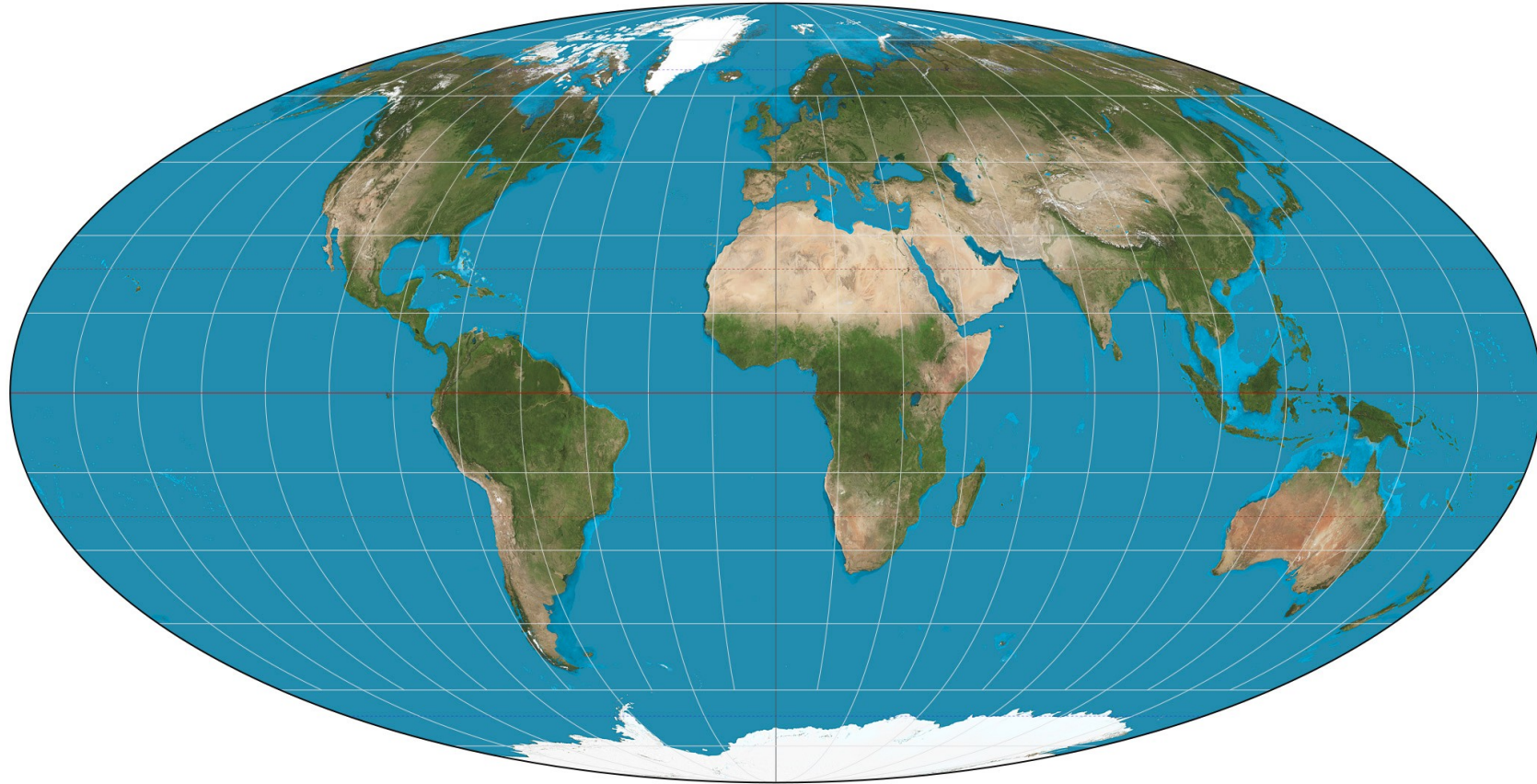
- Equal-area
- Highly distorts angles latitudinally



Coordinate Reference Systems

e.g. Mollweide Projection

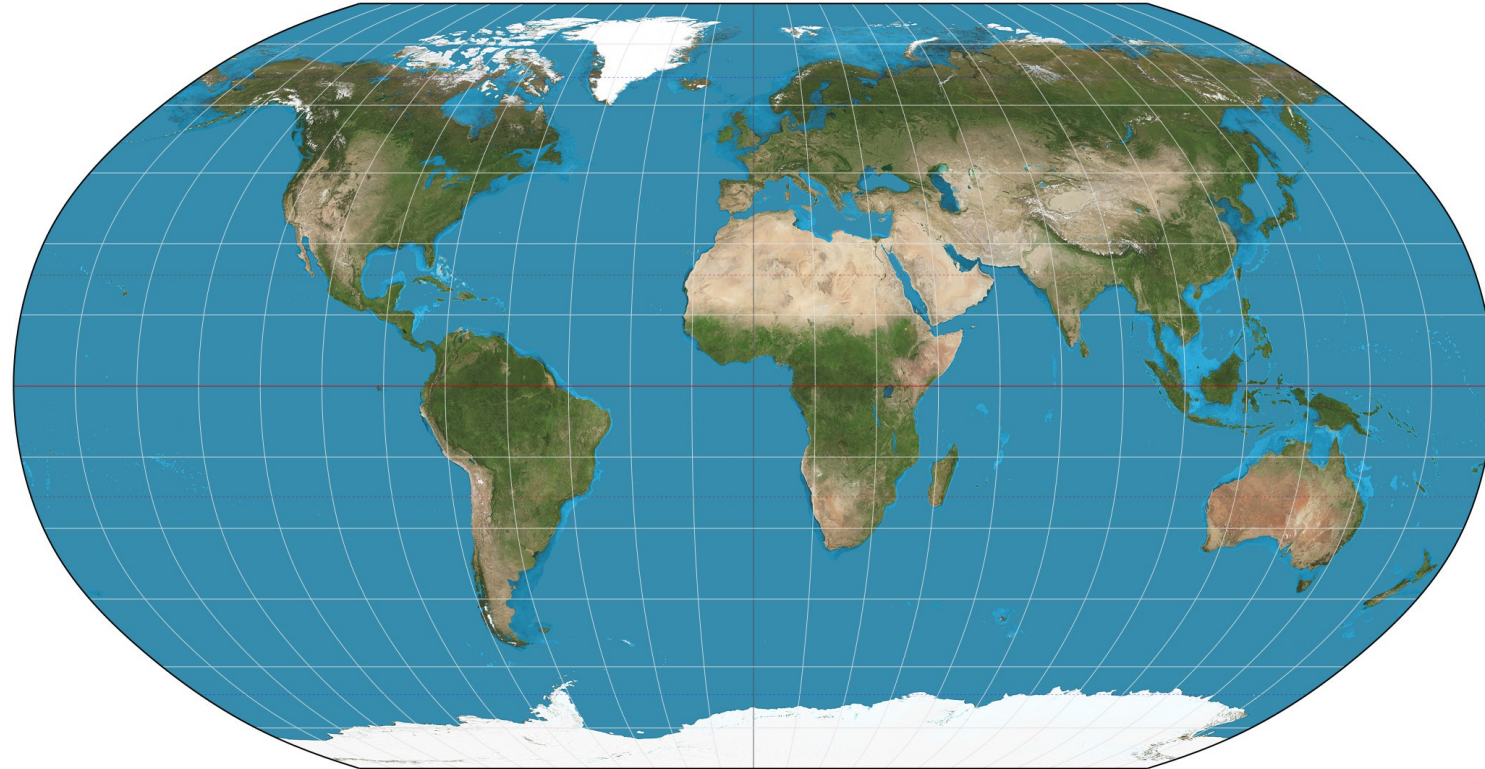
- Equal-area
- Highly distorts angles longitudinally



Coordinate Reference Systems

e.g. Robinson Projection

- Distorts both angles and areas
- Relatively representative
- Promoted by NatGeo and now used by IPCC



Coordinate Reference Systems

Representation

- Older: PROJ.4 string: “+proj=moll”
- Well known text WKT2 string

```
PROJCS["World_Mollweide",  
  GEOGCS["WGS 84",  
    DATUM["WGS_1984",  
      SPHEROID["WGS 84",6378137,298.257223563]],  
    PRIMEM["Greenwich",0],  
    UNIT["Degree",0.0174532925199433]],  
  PROJECTION["Mollweide"],  
  PARAMETER["central_meridian",0],  
  PARAMETER["false_easting",0],  
  PARAMETER["false_northing",0],  
  UNIT["metre",1],  
  AXIS["Easting",EAST],  
  AXIS["Northing",NORTH],  
  AUTHORITY["ESRI","54009"]]
```

- EPSG registry ID (epsg.io) : ESRI:54009



EPSG

GEODETIC PARAMETER DATASET

Managed by IOGP's Geomatics Committee

Implementation

Where, what, why?

GIS tools: Why R?

- Automatized manipulation and extraction of data
- Larger quantity of work then with a GUI
- Python is much more powerful
- Integration with other analyses
- Statistical analyses



The Spatial ecosystem



- Multiple R extension packages form the backbone
- The heart: Open Source Geospatial Foundation
- Recipe:
 - **Open source libraries for calculations + R interface**
- R packages hook on the APIs of these libraries
- + extra calculations in compiled code (C, C++, Fortran)

Open Source Libraries/Projects

GDAL: Geodetic Data Abstraction Library

- Definitions of data formats
- Translation between data formats
- <https://gdal.org/>



Open Source Libraries/Projects

PROJ

- Coordinate transformation
- Definition of Coordinate Reference Systems (CRS) and translation
- Current version is 9.0.0 (March 2022)
- R packages rely on older versions (PROJ4 or PROJ6)



Open Source Libraries/Projects

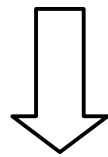
GEOS: Geometry Open Source

- Computational geometry especially towards the manipulation of spatial data
- <http://libgeos.org/>

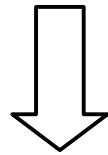


The R packages

- Only some are essential, they are on the CRAN
- They are using the libraries
- Class definitions and basic methods
- Lots of packages build on these...



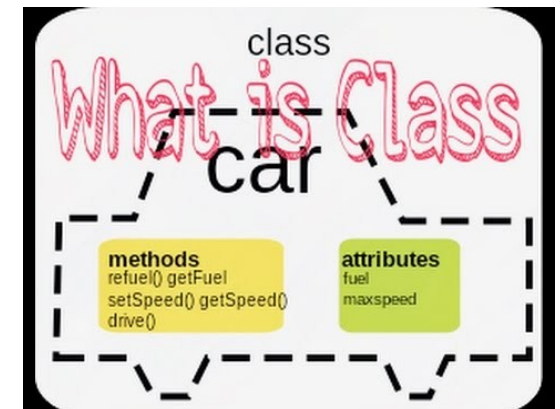
Lot of dependencies, slow development



The current mess



What is a class?



<https://www.youtube.com/watch?v=XqrkcO42DI8>

Current issues with R spatial

PROJ4 to PROJ6-based

- This is the worst time to learn spatial calculations in R
- Old packages have been around for 10+ years



Packages

old

new

vector

sp,
rgdal, rgeos

sf, terra

raster

raster

terra, stars

+ others: e.g. geosphere

What to learn?

Focus on the new but...

- Lot's of older methods rely on the older packages
- The objects can typically be translated from one to another, without problems



Installing all of them

Focus on the new but...

- On Windows this is trivial, you can get all from the CRAN with `install.packages()`
- On Mac (and Linux), it is recommended to install them one at a time. They will a) either tell you what libraries need to be installed so they can function properly, 2) only indicate errors and then we have to google :)
- The list, again:

`sp raster rgdal rgeos terra sf (stars) geosphere`



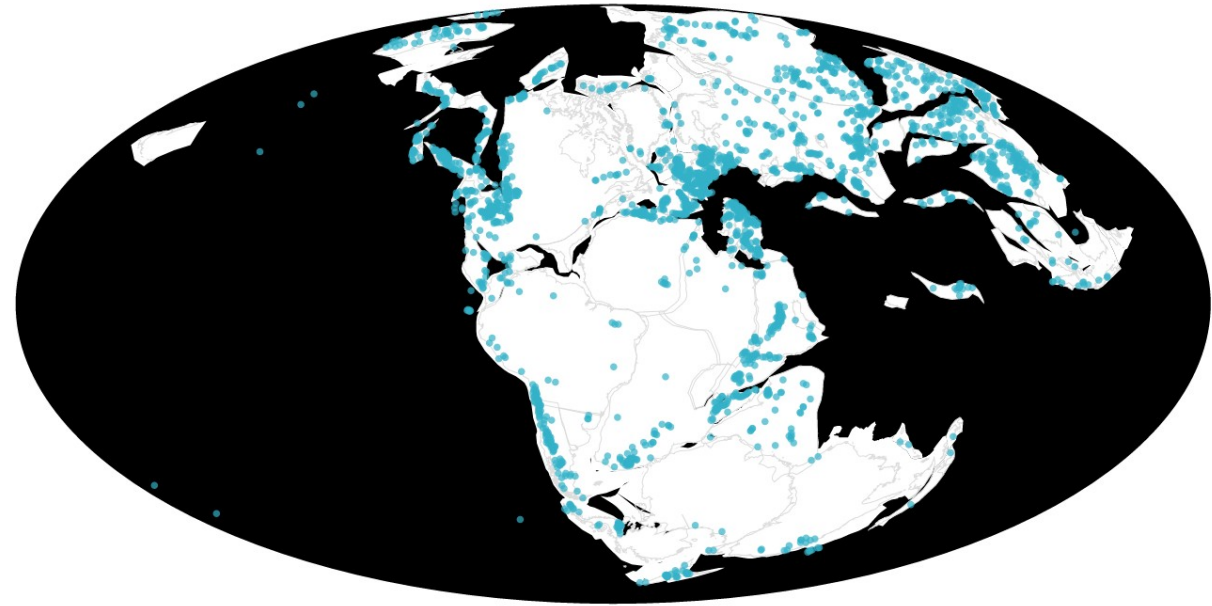
Vector data

with sf (and sp, rgdal, and rgeos)

Data concepts

Feature types: points

- A feature is a thing – everything is a feature, that can be combined to form sets.
- **Geometry**: It has coordinates and a CRS
- **Attributes**: every point has data such as age, name, id etc..
- Features can be combined into sets, e.g. Multipoint

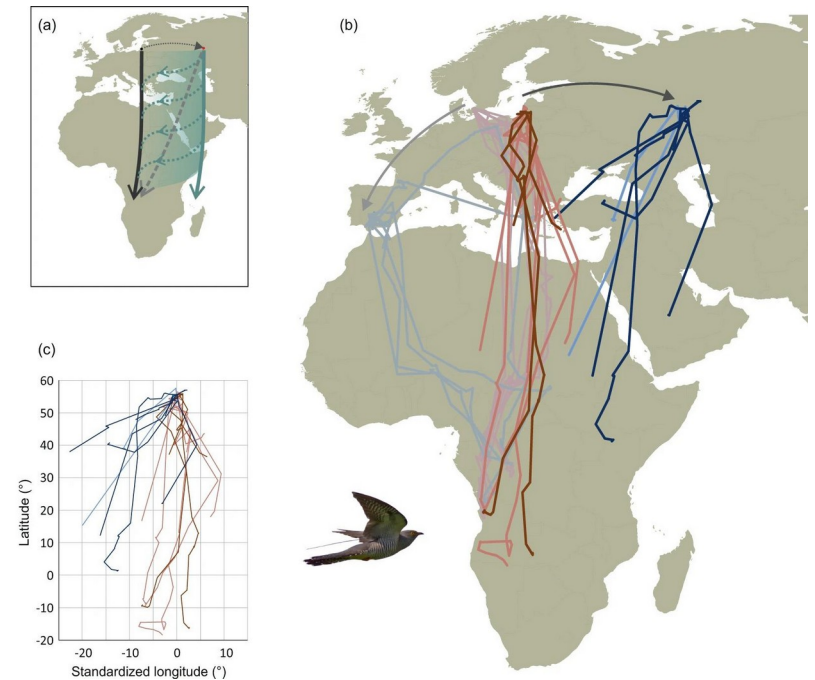


Fossil occurrences in the PBDB

Data concepts

Feature types: line

- Made up of sequence of points
 - One line: path, GPS track
 - Multiline: multiple paths combined that represent one thing
- Both a single line and a multiline can have attributes

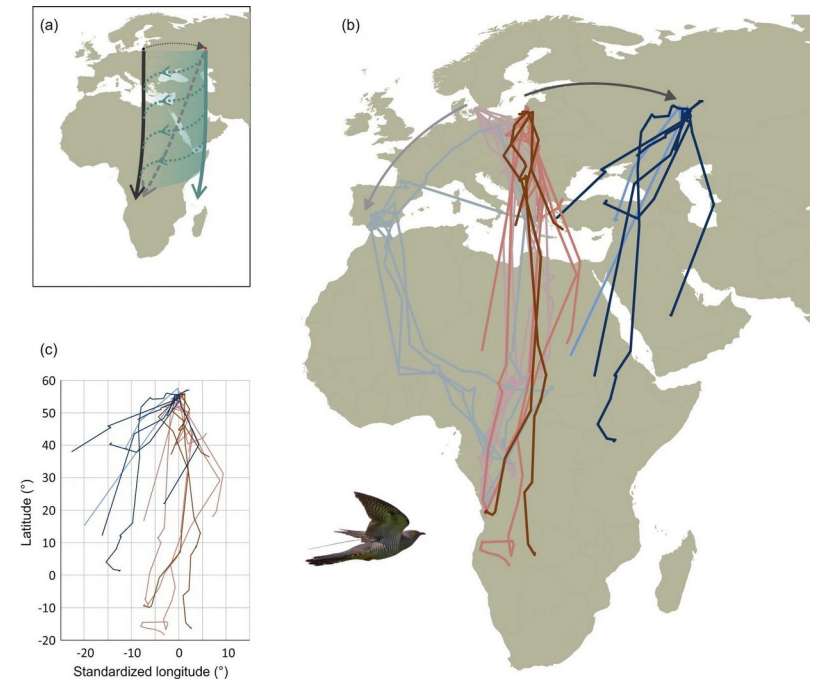


Thorup et al. 2020 Sci. Rep.

Data concepts

Feature types: line

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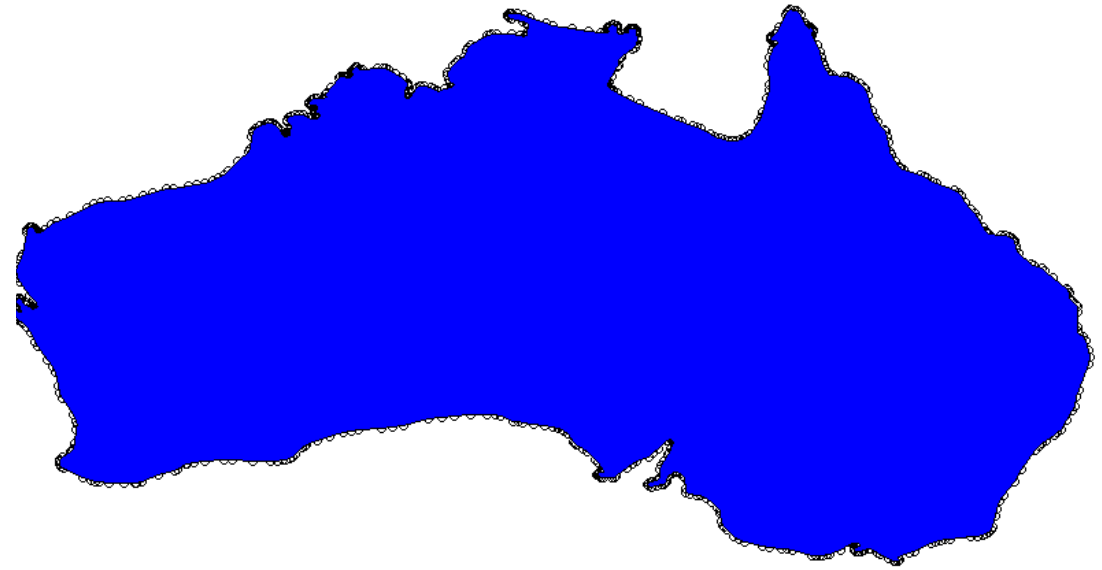


Thorup et al. 2020 Sci. Rep.

Data concepts

Feature types: Single Polygons

- Made up of sequence of points
- Closed to separate inside from outside
- Every polygon has attributes
- E.g. every island/landmass is by definition one polygon



Data concepts

Feature types: Multiple polygons

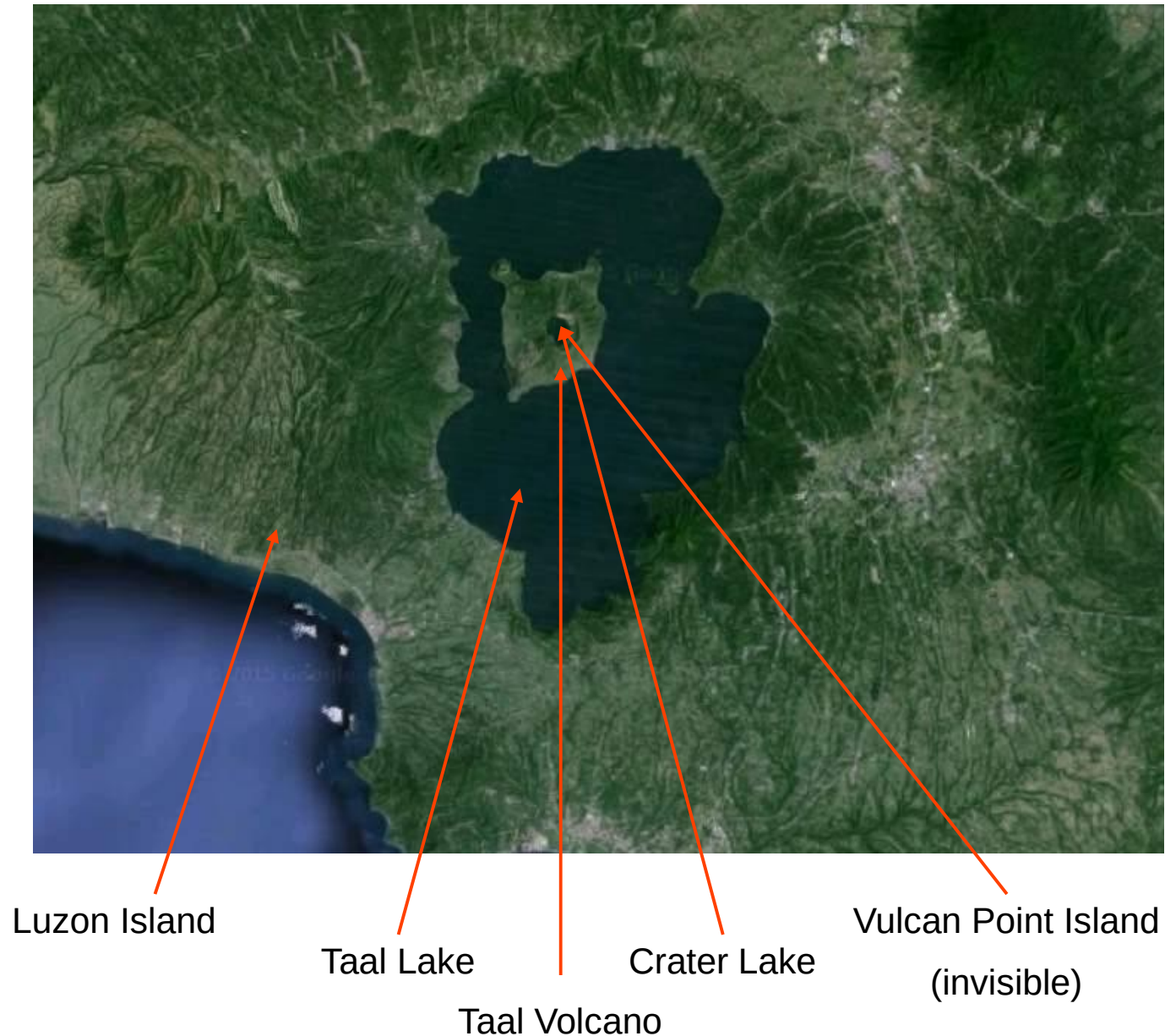
- Polygons can be combined to represent single entities
- One thing is represented by multiple polygons, e.g. a country



Data concepts

Feature types: Multiple polygons

- Polygons can have holes
- Holes are also polygons that are inside other polygons
- The direction of points defines whether something is a hole or not



Registering complex data in R

- For GIS, 2 column matrices can do the job for points, lines and polygons
- You can create lists of Polygons and lists of that, but it quickly becomes a mess...
- S3 and S4 classes

	long	lat
1	142.3752	-10.99448
2	142.5119	-11.01241
3	142.6009	-11.05538
4	142.6376	-11.08747
5	142.7468	-11.26374
6	142.9131	-11.68280
7	142.9775	-11.80399
8	143.0637	-11.90817
9	143.0800	-11.90902
10	143.0876	-11.88224
11	143.1104	-11.88547
12	143.1691	-11.92764
13	143.2208	-11.98907
14	143.2265	-12.05601
15	143.1904	-12.18825
16	143.1972	-12.27063
17	143.3962	-12.80673
18	143.4831	-13.10462
19	143.5455	-13.38480
20	143.5754	-13.67029
21	143.6182	-13.85430
22	143.6887	-14.04426

S3 Objects

- Informal classes, which is based on a label: the `class` attribute
- They are often just lists: access elements with `$` or `[[]]`
- Example the “`lm`” class produced by `lm()`
- Methods dispatch works based on function names:
 - `predict.lm()` is called when `predict()` is used on an object that comes from this class
- There is no constraint on the object structure!
- Example in spatial: `sf`

```
adam@posidonia: ~ 80x62
> a <- rnorm(1:10)
> b <- rnorm(1:10)
> model <- lm(b ~ a)
> str(model)
list of 12
 $ coefficients : Named num [1:2] -0.4468 -0.0945
 .. attr(*, "names")= chr [1:2] "(Intercept)" "a"
 $ residuals    : Named num [1:10] 0.0315 -0.0252 -0.8386 -0.3477 0.0826 ...
 .. attr(*, "names")= chr [1:10] "1" "2" "3" "4" ...
 $ effects      : Named num [1:10] 1.434 -0.209 -0.838 -0.344 0.071 ...
 .. attr(*, "names")= chr [1:10] "(Intercept)" "a" "" "" ...
 $ rank         : int 2
 $ fitted.values: Named num [1:10] -0.529 -0.424 -0.41 -0.384 -0.503 ...
 .. attr(*, "names")= chr [1:10] "1" "2" "3" "4" ...
 $ assign       : int [1:2] 0 1
 $ qr           : List of 5
 ..$ qr        : num [1:10, 1:2] -3.162 0.316 0.316 0.316 0.316 ...
 .. .. attr(*, "dimnames")=List of 2
 .. .. ..$ : chr [1:10] "1" "2" "3" "4" ...
 .. .. ..$ : chr [1:2] "(Intercept)" "a"
 .. .. .. attr(*, "assign")= int [1:2] 0 1
 ..$ qraux: num [1:2] 1.32 1.23
 ..$ pivot: int [1:2] 1 2
 ..$ tol : num 1e-07
 ..$ rank : int 2
 .. .. attr(*, "class")= chr "qr"
 $ df.residual : int 8
 $ xlevels     : Named list()
 $ call        : language lm(formula = b ~ a)
 $ terms       :Classes 'terms', 'formula' language b ~ a
 .. .. attr(*, "variables")= language list(b, a)
 .. .. attr(*, "factors")= int [1:2, 1] 0 1
 .. .. .. attr(*, "dimnames")=List of 2
 .. .. .. ..$ : chr [1:2] "b" "a"
 .. .. .. ..$ : chr "a"
 .. .. .. attr(*, "term.labels")= chr "a"
 .. .. .. attr(*, "order")= int 1
 .. .. .. attr(*, "intercept")= int 1
 .. .. .. attr(*, "response")= int 1
 .. .. .. attr(*, ".Environment")=<environment: R_GlobalEnv>
 .. .. .. attr(*, "predvars")= language list(b, a)
 .. .. .. attr(*, "dataClasses")= Named chr [1:2] "numeric" "numeric"
 .. .. .. .. attr(*, "names")= chr [1:2] "b" "a"
 $ model       : 'data.frame': 10 obs. of 2 variables:
 ..$ b: num [1:10] -0.497 -0.449 -1.249 -0.732 -0.42 ...
 ..$ a: num [1:10] 0.868 -0.246 -0.384 -0.665 0.595 ...
 .. .. attr(*, "terms")=Classes 'terms', 'formula' language b ~ a
 .. .. .. attr(*, "variables")= language list(b, a)
 .. .. .. attr(*, "factors")= int [1:2, 1] 0 1
 .. .. .. .. attr(*, "dimnames")=List of 2
 .. .. .. .. ..$ : chr [1:2] "b" "a"
 .. .. .. .. ..$ : chr "a"
 .. .. .. .. attr(*, "term.labels")= chr "a"
 .. .. .. .. attr(*, "order")= int 1
 .. .. .. .. attr(*, "intercept")= int 1
 .. .. .. .. attr(*, "response")= int 1
 .. .. .. .. attr(*, ".Environment")=<environment: R_GlobalEnv>
 .. .. .. .. attr(*, "predvars")= language list(b, a)
 .. .. .. .. attr(*, "dataClasses")= Named chr [1:2] "numeric" "numeric"
 .. .. .. .. .. attr(*, "names")= chr [1:2] "b" "a"
 .. .. .. .. attr(*, "class")= chr "lm"
```


S4 Objects

- Formal classes, with a pre-defined structure
- The object has slots, that can have only specific types and they must have them!
- Slots can be accessed with the @ operator
- Methods are written more explicitly for the argument classes (with setMethod())
- Most spatial objects use this framework!

```
> str(spp)
Formal class 'SpatialPolygons' [package "sp"] with 4 slots
..@ polygons :List of 1
.. ..$ :Formal class 'Polygons' [package "sp"] with 5 slots
.. .. ..@ Polygons :List of 2
.. .. .. ..$ :Formal class 'Polygon' [package "sp"] with 5 slots
.. .. .. .. ..@ labpt : num [1:2] 134.4 -25.6
.. .. .. .. ..@ area : num 685
.. .. .. .. ..@ hole : logi FALSE
.. .. .. .. ..@ ringDir: int 1
.. .. .. .. ..@ coords : num [1:637, 1:2] 142 143 143 143 143 ...
.. .. .. .. ..- attr(*, "dimnames")=List of 2
.. .. .. .. .. ..$ : NULL
.. .. .. .. .. ..$ : chr [1:2] "long" "lat"
.. .. .. .. ..$ :Formal class 'Polygon' [package "sp"] with 5 slots
.. .. .. .. ..@ labpt : num [1:2] 63.8 36.8
.. .. .. .. ..@ area : num 8883
.. .. .. .. ..@ hole : logi FALSE
.. .. .. .. ..@ ringDir: int 1
.. .. .. .. ..@ coords : num [1:7337, 1:2] 180 180 180 180 179 ...
.. .. .. .. ..- attr(*, "dimnames")=List of 2
.. .. .. .. .. ..$ : NULL
.. .. .. .. .. ..$ : chr [1:2] "V1" "V2"
.. .. .. ..@ plotOrder: int [1:2] 2 1
.. .. .. ..@ labpt : num [1:2] 63.8 36.8
.. .. .. ..@ ID : chr "0"
.. .. .. ..@ area : num 9569
..@ plotOrder : int 1
..@ bbox : num [1:2, 1:2] -17.4 -39 180.4 77.7
.. ..- attr(*, "dimnames")=List of 2
.. .. ..$ : chr [1:2] "x" "y"
.. .. ..$ : chr [1:2] "min" "max"
..@ proj4string:Formal class 'CRS' [package "sp"] with 1 slot
.. ..@ projargs: chr NA
```

An object from the old sp package

Package sp: Classes and Methods for Spatial Data

- Primarily by Edzer Pebesma and Roger Bivand
- From 2005
- The structures to represent the data in R
- S4 classes and how to interact with them
- Primarily used for vector data also some raster
 - `SpatialPoints(DataFrame)`
 - `SpatialLines(DataFrame)`
 - `SpatialPolygons(DataFrame)`

Vector File formats

ESRI Shapefiles

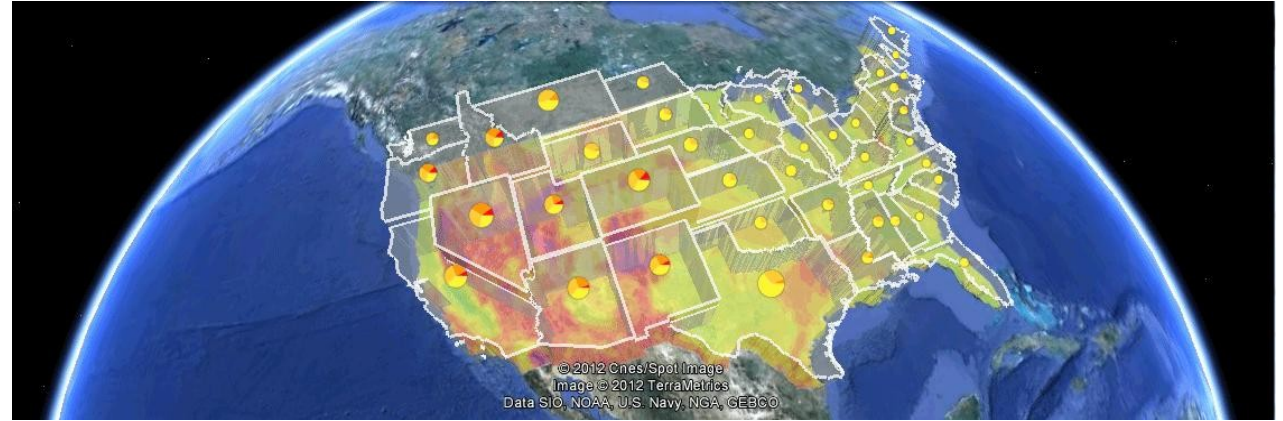
- Multiple files represent the data
 - .shx: Index file, where is what
 - .shp: Main file, geometries
 - .dbf: Attribute information (dBASE)
 - .prj, .sbn, etc..



Vector File formats

Keyhole Markup Language

- .kml or .kmz file (z for zipped)
- Standard for the web



Google Earth uses .kml



Open
Geospatial
Consortium

Vector File formats

GeoJSON

- .js .json also for the web
- Human readable

```
{
  "type": "Feature",
  "geometry": {
    "type": "Point",
    "coordinates": [125.6, 10.1]
  },
  "properties": {
    "name": "Dinagat Islands"
  }
}
```

PostGIS

- Database-oriented (PostgreSQL)

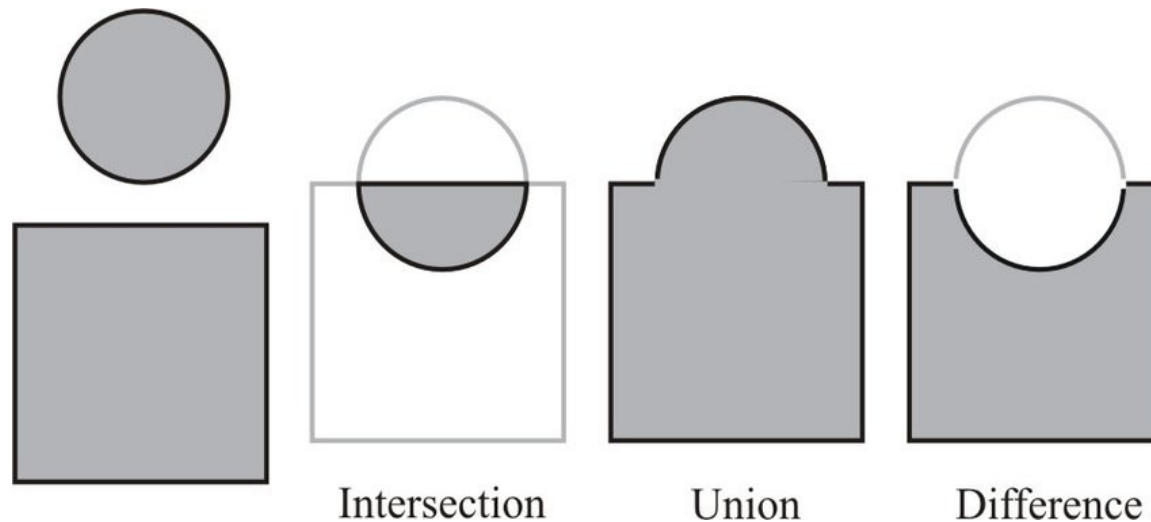
Package rgdal: Bindings for the 'Geospatial' Data Abstraction Library

- Primarily by Roger Bivand
- Interface to GDAL and PROJ<6
- Accessing data (I/O) and executing projections



Package rgeos: Interface to Geometry Engine - Open Source ('GEOS')

- Primarily by Roger Bivand
- Interface to GEOS
- Geometric calculations in the same CRS (e.g. Area)
- Boolean operations with shapes

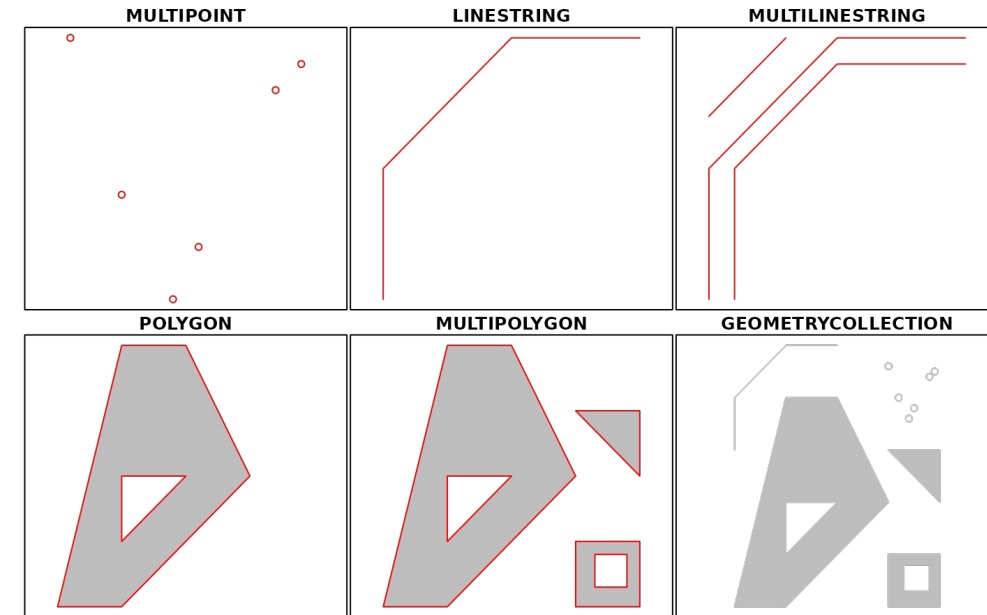


OLD

Package sf: Simple Features for R



- Primarily by Edzer Pebesma
- From 2017
- Integrates with GDAL, GEOS and PROJ
- Uses the **simple feature** standard
- Good tidyverse integration



Example 1

- Coastlines Natural Earth
- Plotting a world map!



Natural Earth

Free vector and raster map data at 1:10m, 1:50m, and 1:110m scales

[Home](#) [Features](#) [Downloads](#) [Blog](#) [Issues](#) [Corrections](#) [About](#)



Parks and Protected Lands

San Juan Island NHP, Olympic NP, Mount Rainier NP, Ebey's Landing NH RES, Klondike Gold Rush NHP Seattle Unit, Ross Lake NRA, North Cascades NP, Lake Chelan NRA, Lake Roosevelt NRA, Glacier NP, Grant-Kohrs Ranch NHS

Natural Earth is a public domain map dataset available at 1:10m, 1:50m, and 1:110 million scales. Featuring tightly integrated vector and raster data, with Natural Earth you can make a variety of visually pleasing, well-crafted maps with cartography or GIS software.

Natural Earth was built through a collaboration of many [volunteers](#) and is supported by [NACIS](#) (North American Cartographic Information Society), and is free for use in any type of project (see our [Terms of Use](#) page for more information).



Convenience

Natural Earth solves a problem: finding suitable data for making small-scale maps. In a time when the web is awash in geospatial data, cartographers are forced to waste time sifting through confusing tangles of poorly attributed data to make clean, legible maps. Because your time is valuable, Natural Earth data comes ready-to-use.



Neatness Counts

The carefully generalized linework maintains consistent, recognizable geographic shapes at 1:10m, 1:50m, and 1:110m scales. Natural Earth was built from the ground up so you will find that all data layers align precisely with one another. For example, where rivers and country borders are one and the same, the lines are coincident.

50m-admin-0-countries_area (242 areas selected)			
COUNTRYNAM	SCALERANK	FEATURECLA	SOVE
Afghanistan	1.000000000000	Countries	Afghanistan
Aland	3.000000000000	Countries	Finland
Albania	1.000000000000	Countries	Albania
Algeria	1.000000000000	Countries	Algeria

GIS Attributes

Natural Earth, however, is more than just a collection of pretty lines. The data attributes are equally important for mapmaking. Most data contain embedded feature names, which are ranked by relative importance. Other attributes facilitate faster map production, such as width attributes assigned to river segments for creating tapers.

<https://www.naturalearthdata.com/downloads/110m-physical-vectors/>

Example 2

- World Administrative Boundaries

World Administrative Boundaries - Countries and Territories

Information

Table

Map

Analyze

Export

API

This dataset displays level 0 world administrative boundaries. It contains countries as well as non-sovereign territories (like, for instance, French overseas).

Dataset Identifier world-administrative-boundaries

Downloads 33,342

Themes Administration, Government, Public finances, Citizenship

Keywords United Nation, ISO-3 code, Countries, Territories, Shape, Boundaries

License [Open Government Licence v3.0](#)

Language English

Modified April 26, 2019 11:09 AM

Publisher World Food Programme (UN agency)

Reference https://geonode.wfp.org/layers/geonode%3Awld_bnd_adm0_wfp

Territory world

Last processing May 15, 2019 9:49 AM (metadata)

May 15, 2019 9:49 AM (data)

Example 3

- Range data from the IUCN
- Freely available for academic use



https://www.iucnredlist.org/resources/spatial-data-download

2022-1 | [Login / Register](#) | [What's New](#)

[Advanced](#) [About](#) [Assessment process](#) [Res](#)

SPATIAL DATA & MAPPING RESOURCES

Spatial Data Download

The banner features a world map with green dots indicating species distributions. Two blue parrots are flying on the right side. The text 'RED LIST MAPS' is above the main title 'Discover and explore species distributions and observations'. The IUCN Red List logo is in the top left corner of the banner.

Raster data

With terra (and raster)

Package raster: Geographic Data Analysis and Modeling

- Primarily by Robert Hijmans
- Since 2010
- Standard for raster processing for a long time
- Most ecological packages depend on this
- Integration of WorldClim data



Package terra: Spatial Data Analysis

- Primarily by Robert Hijmans
- Interface to GEOS
- Almost the same as raster, this is the easier transition.



Raster File formats

csv

- Single uncompressed layer, a table of values
- Not properly georeferenced
- Column and row names might help

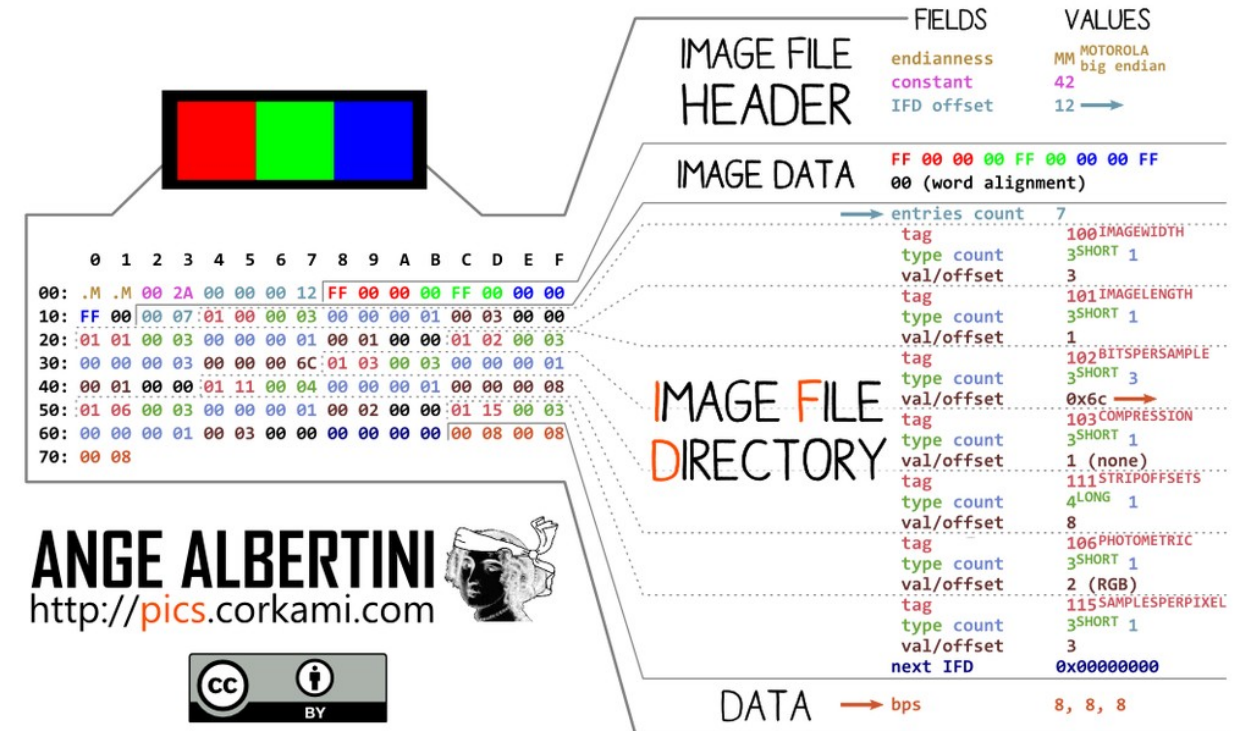
```
102,102,103,103,103,103,102,102,102,103,103,104,104,104,104,105,106,105,104,104,105,106,107,108,110,111,113,1
103,103,104,104,104,104,103,103,103,103,104,104,104,105,105,106,107,106,106,106,107,108,110,111,114,117,118,1
104,104,105,105,105,105,105,104,104,103,104,104,105,105,105,106,107,108,108,108,109,110,112,114,115,118,121,122,1
105,105,105,106,106,106,106,105,105,104,104,105,105,106,106,107,109,110,110,112,113,115,116,118,119,121,124,126,1
105,106,106,107,107,107,107,106,106,105,105,106,106,107,108,109,111,113,114,116,118,120,121,122,123,125,127,129,1
106,107,107,108,108,108,108,107,107,106,106,107,108,108,110,113,115,117,118,120,122,124,125,127,128,129,131,134,1
107,108,108,109,109,109,109,108,108,107,108,108,110,111,113,116,118,120,123,125,127,129,130,132,134,135,137,139,1
,108,109,109,110,110,110,110,109,109,108,110,110,113,116,118,120,122,125,127,129,133,136,138,140,141,142,148,150,
,109,110,110,111,111,111,111,110,110,110,112,114,118,121,123,125,127,129,133,137,141,143,145,146,148,150,154,156,
,110,110,111,113,112,111,113,112,112,114,116,119,121,124,127,129,133,138,143,146,149,149,151,153,154,157,159,160,
,110,111,113,115,114,113,114,114,115,117,119,121,124,126,129,133,140,145,150,154,155,155,157,159,161,162,164,165,
,111,113,115,117,116,115,116,117,117,119,121,124,126,128,132,137,143,151,156,161,161,162,163,165,166,167,168,170,
,114,115,117,117,117,118,119,119,120,121,124,126,128,131,137,143,150,156,160,163,165,168,170,171,172,173,174,175,
,116,118,118,118,120,121,121,122,122,123,125,128,130,134,141,147,152,156,160,165,168,170,174,176,179,180,181,181,
,118,120,120,121,122,123,124,124,125,126,127,129,132,135,142,149,153,157,161,166,170,174,178,180,182,183,184,184,
,120,121,122,123,124,125,126,127,127,128,130,132,134,137,142,151,155,158,162,169,172,176,181,183,184,186,187,188,
,120,122,125,126,126,127,128,129,130,130,132,134,136,139,145,152,157,160,167,172,175,178,181,185,186,188,190,191,
,121,124,126,128,129,129,130,131,132,133,135,137,139,143,150,154,159,164,170,173,176,179,184,186,189,190,191,192,
,122,125,127,130,130,131,133,134,135,136,137,140,143,147,154,158,162,166,171,174,177,181,186,189,190,190,191,192,
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,120,124,128,131,134,137,139,142,144,146,149,151,153,156,160,163,167,171,174,178,180,180,180,180,180,175,171,
,118,121,125,129,132,134,137,140,142,145,147,149,151,155,159,163,166,169,173,177,179,180,180,180,180,179,174,169,
,117,120,121,125,129,132,135,138,140,143,145,147,149,153,157,160,163,166,171,174,177,179,180,180,180,179,172,168,
,115,118,120,122,126,130,133,136,138,141,143,145,148,151,154,157,160,163,168,171,174,177,179,179,179,176,171,167,
,114,116,118,120,122,127,131,133,136,138,141,143,146,148,151,154,157,160,164,168,171,174,178,178,179,177,173,169,
,115,114,116,118,120,122,127,129,132,136,139,141,143,146,148,151,153,156,160,164,167,172,174,176,177,176,173,170,
```

Raster File formats

GeoTIFF

- Single uncompressed layer
- Completely open source
- TIFF image + georeferencing

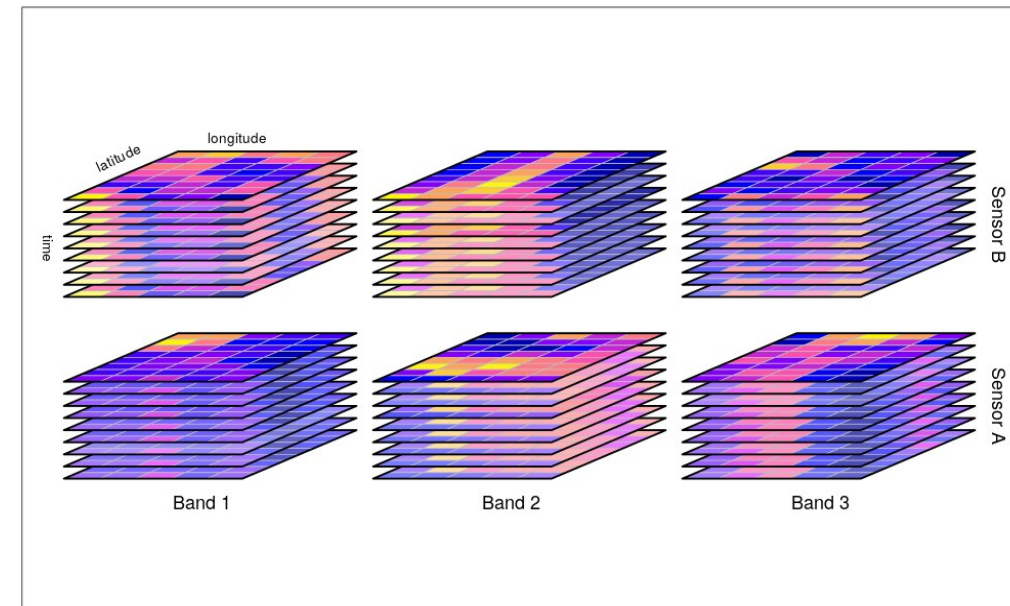
TBIG ENDIANAGGED IMAGE FILE FORMAT



Raster File formats

NetCDF

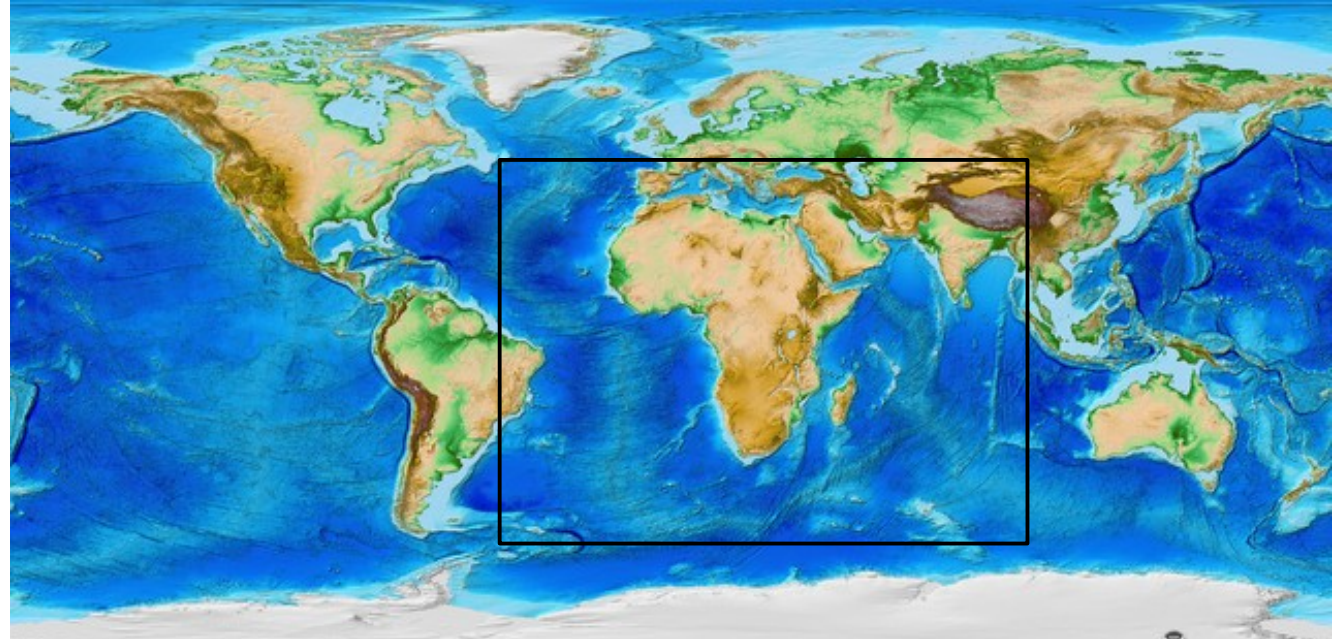
- Binary data cubes, lots of dimensions can be included
- Data registered in bands
- Requires the presence of `ncdf4` in R!



Operations on Rasters

Cropping

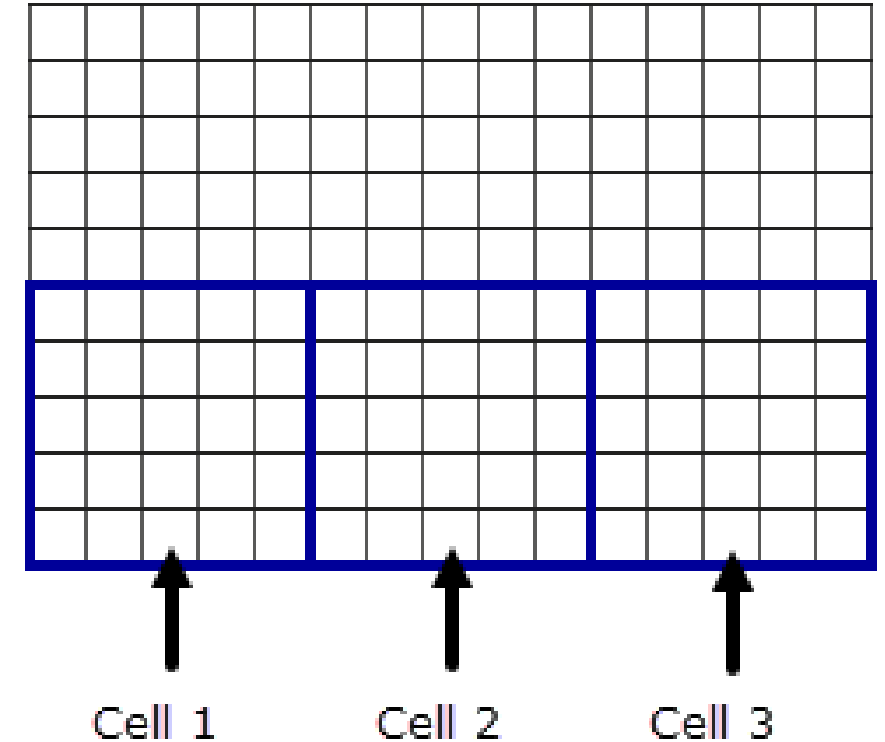
- Changes the extent of a raster



Operations on Rasters

Aggregation / Disaggregation

- Change resolution without changing cell boundaries
- Iteration of a function for data that belongs in a new cell

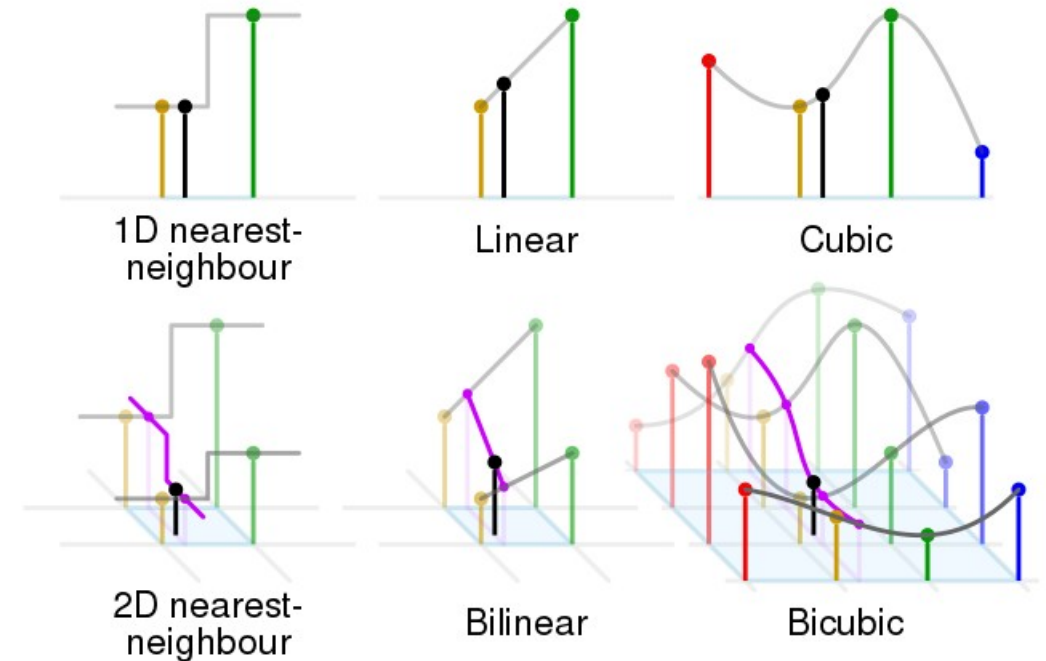


<https://desktop.arcgis.com/en/arcmap/latest/tools/spatial-analyst-toolbox/how-aggregate-works.htm>

Operations on Rasters

Resampling

- Change resolution to any resolution
- Often relies on interpolation

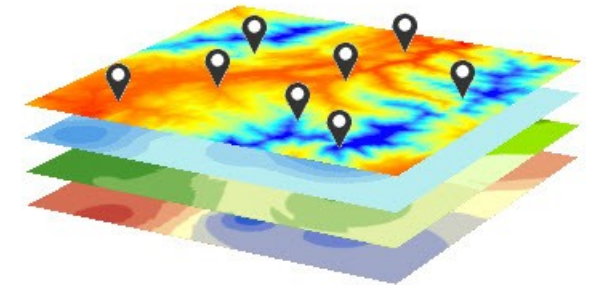


https://www.wikiwand.com/en/Bicubic_interpolation

Operations on Rasters

Extraction

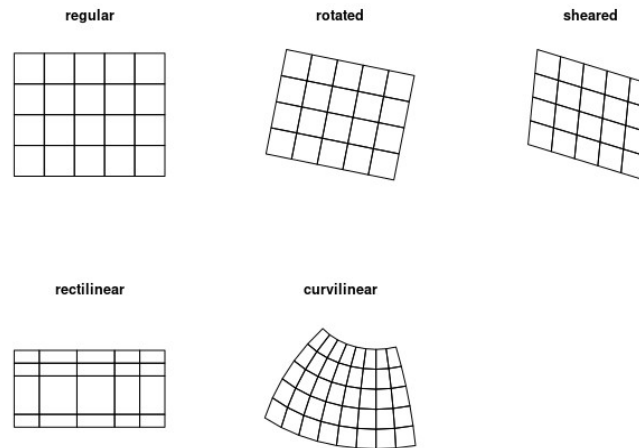
- Getting data out of a raster at given coordinates/locations
- Basic operation for species distribution modelling



esri.com

Package stars: Spatiotemporal Arrays, Raster and Vector Data Cubes

- Primarily by Edzer Pebesma
- Somewhat more complex than terra



Example 1

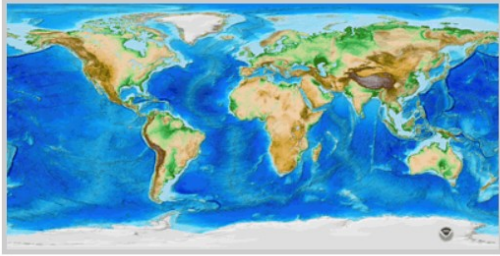
- The ETOPO1 Topography (1° by 1°)

NOAA NATIONAL CENTERS FOR ENVIRONMENTAL INFORMATION
NATIONAL OCEANIC AND ATMOSPHERIC ADMINISTRATION

NOAA > NESDIS > NCEI (formerly NGDC) > Marine Geology and Geophysics > Bathymetry & Relief

All Bathy/Relief Coastal DEMs Fishing Global Lakes Multibeam

ETOPO1 Global Relief Model



ETOPO1 is a 1 arc-minute global relief model of Earth's surface that integrates land topography and ocean bathymetry. Built from global and regional data sets, it is available in "Ice Surface" (top of Antarctic and Greenland ice sheets) and "Bedrock" (base of the ice sheets).

ETOPO1 Global Relief Model is used to calculate the [Volumes of the World's Oceans](#) and to derive a [Hypsographic Curve of Earth's Surface](#).

Cite ETOPO1: [doi:10.7289/V5C8276M](https://doi.org/10.7289/V5C8276M)

Grid Versions

- **ETOPO1 Ice Surface:** Grid of Earth's surface depicting the top of the Antarctic and Greenland ice sheets.
 - grid-registered: [netCDF](#), [georeferenced tiff](#)
 - cell-registered: [netCDF](#), [georeferenced tiff](#)
- **ETOPO1 Bedrock:** Grid of Earth's surface depicting the bedrock underneath the ice sheets.
 - grid-registered: [netCDF](#), [georeferenced tiff](#)
 - cell-registered: [netCDF](#), [georeferenced tiff](#)

[View Metadata](#). Relief for the rest of the world is the same in both versions.

Registrations

ETOPO1 is a 1 arc-minute global relief model of Earth's surface that integrates land topography and ocean bathymetry. Built from global and regional data sets, it is available in "Ice Surface" (top of Antarctic and Greenland ice sheets) and "Bedrock" (base of the ice sheets).

ETOPO1 Global Relief Model is used to calculate the [Volumes of the World's Oceans](#) and to derive a [Hypsographic Curve of Earth's Surface](#).

Cite ETOPO1: [doi:10.7289/V5C8276M](https://doi.org/10.7289/V5C8276M)

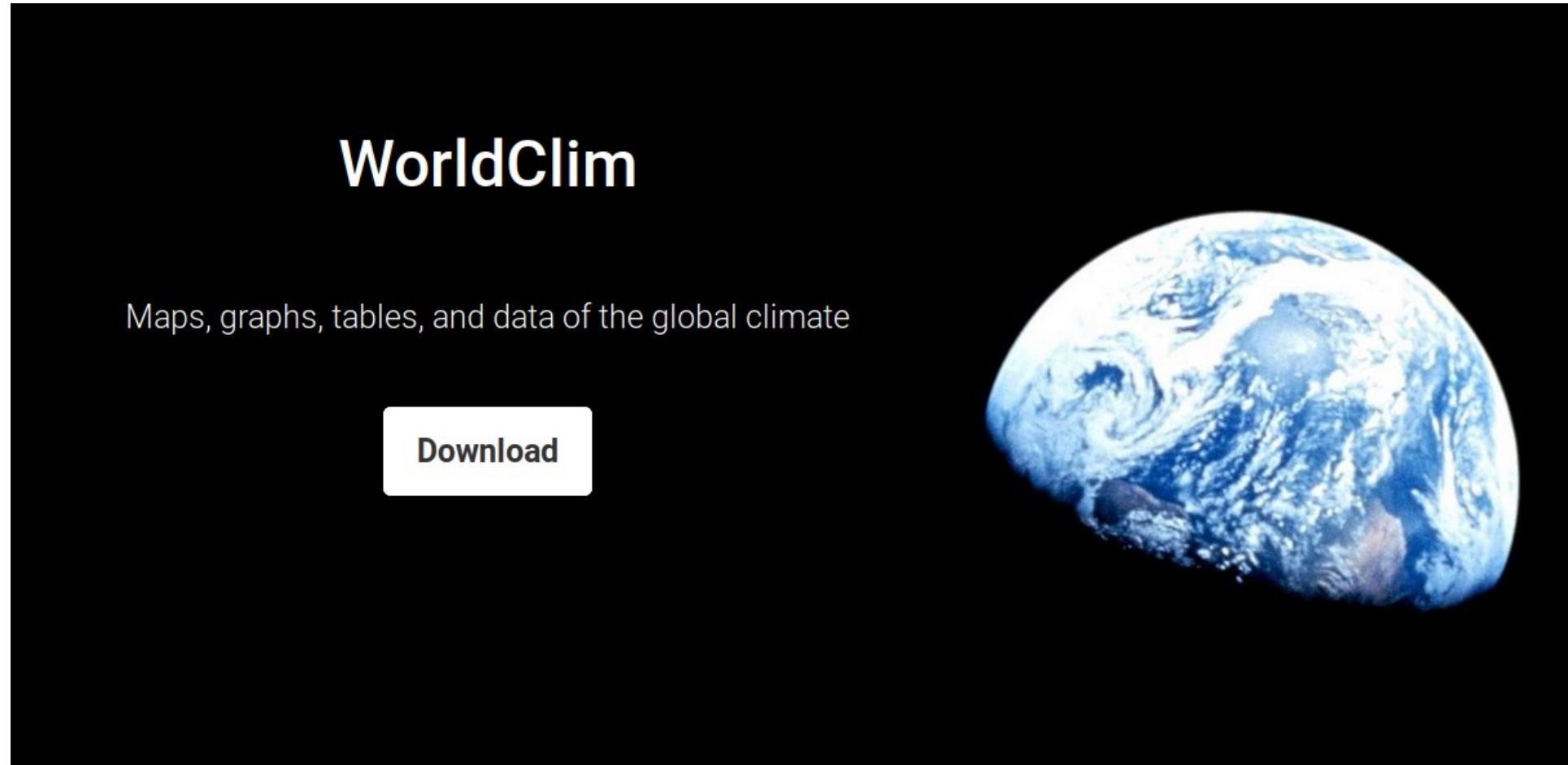
ETOPO1 Report: Procedures, Data Sources & Analysis
Frequently Asked Questions
Color Images
Posters
KMZ Images
Web Services

Global Grids:
ETOPO2 (deprecated)
ETOPO5 (deprecated)
GLOBE Topography

Extract Custom Grid
Interactive Map to Bathymetric Data

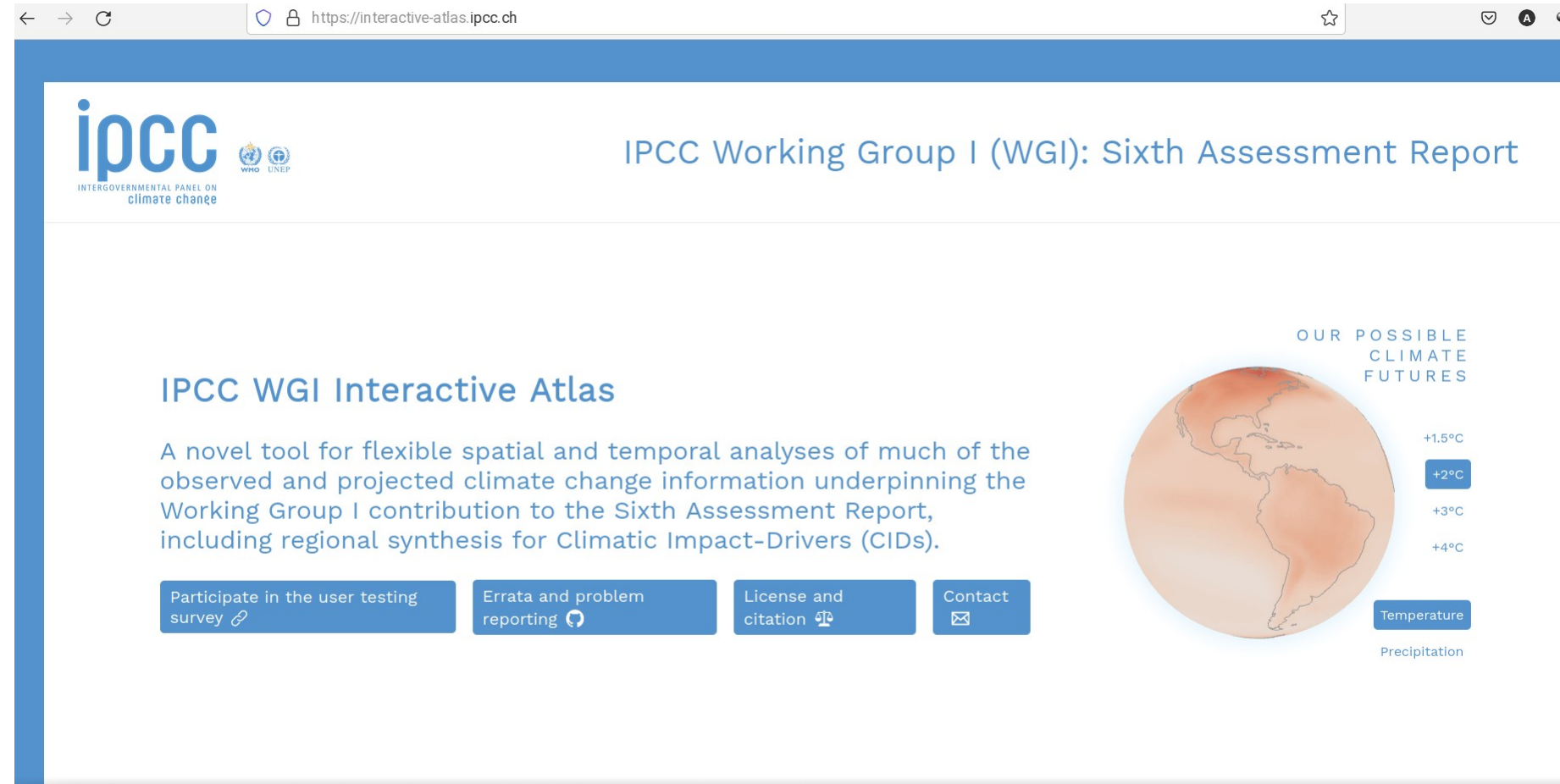
Example 2

- WorldClim



Example +

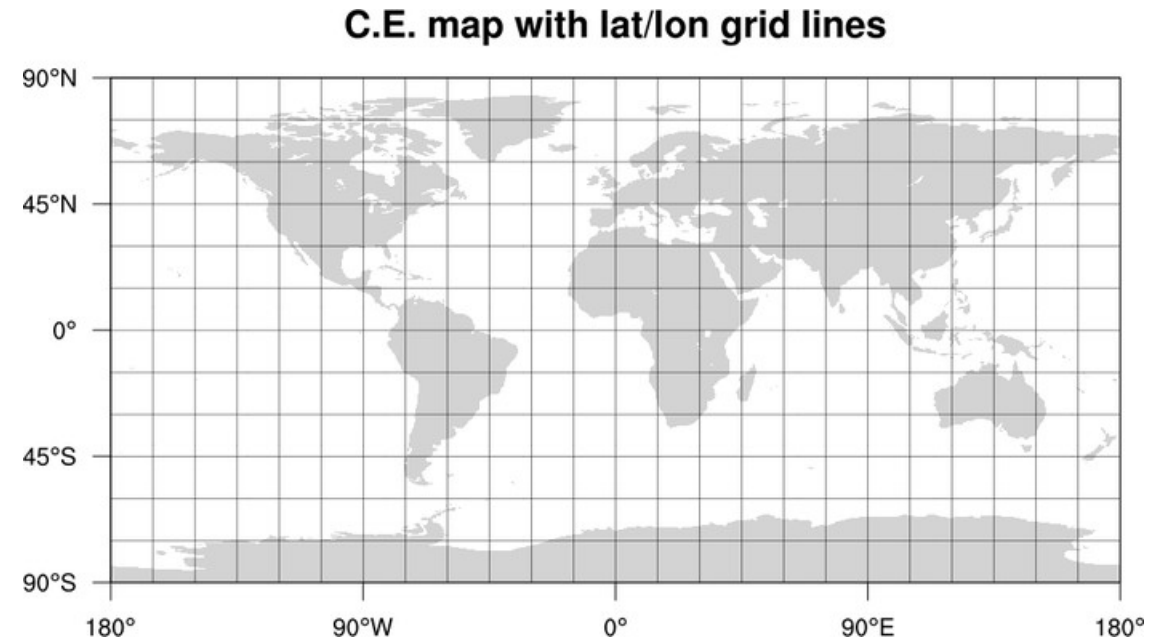
- IPCC AR6 Atlas



Non-rectangular raster grids

The advantage of rectangles

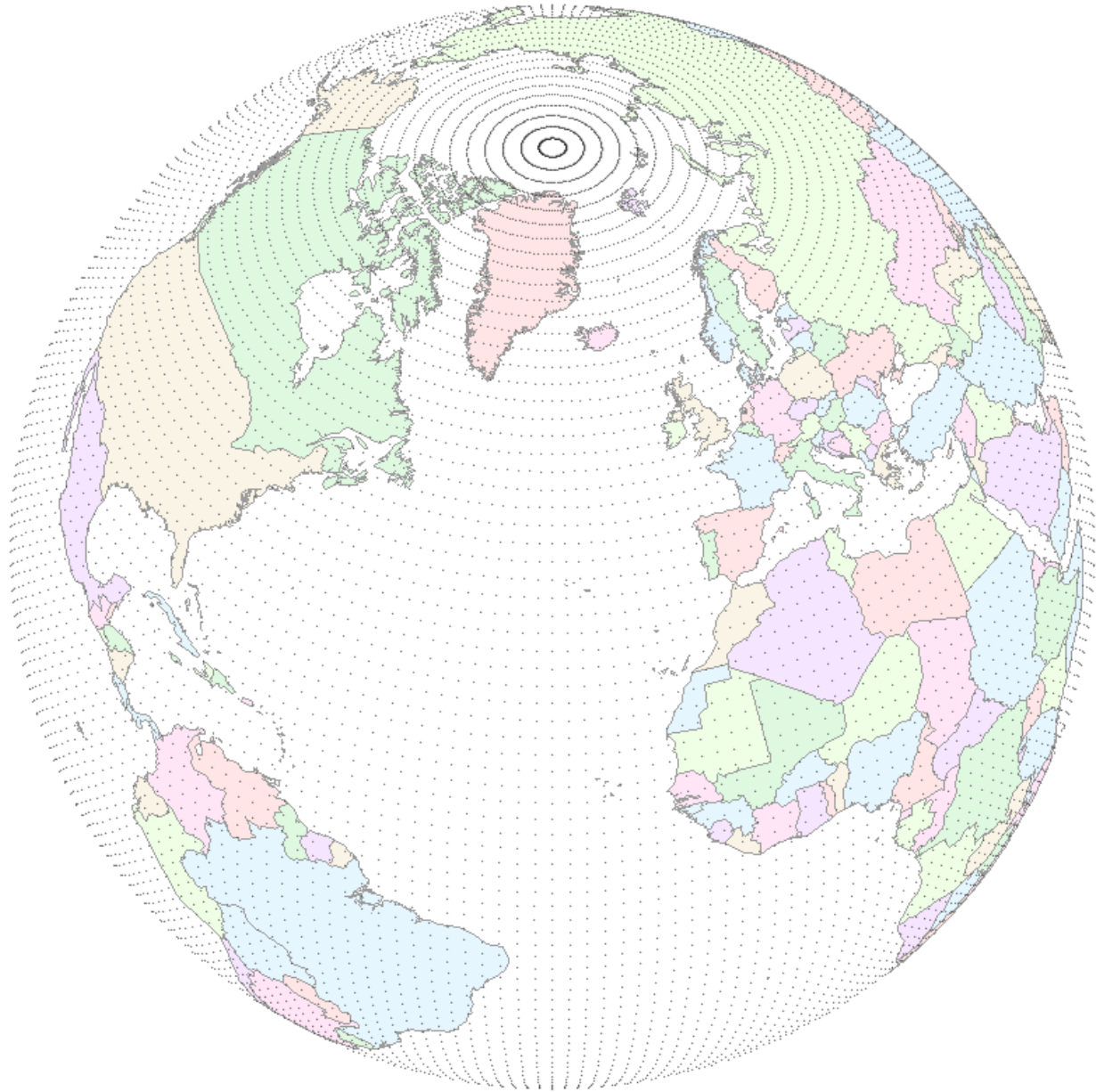
- Structure is easy to define
- Very easy to store in the memory
- Look natural in projections



Non-rectangular raster grids

The disadvantage

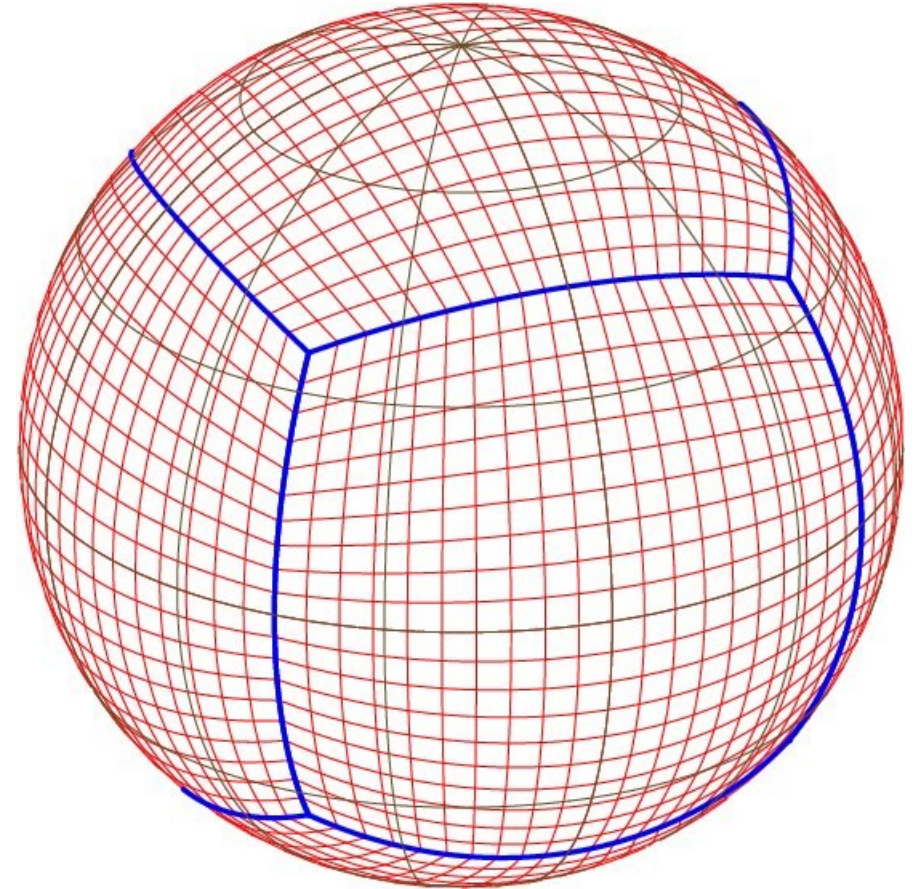
- long-lat grids are Gaussian
- Non-uniform on a sphere
 - Increased density towards the poles
 - Cell sizes decrease towards the poles
- Spatial binning will be biased!



Non-rectangular raster grids

Comon solution: cubed-sphere grid

- Still quadrilateral
- Some climate models rely on this



Purser and Tong, 2017

Non-rectangular raster grids

Most common solution: polyhedra

- Triangular or Penta-Hexagonal grids
- Also in some climate models

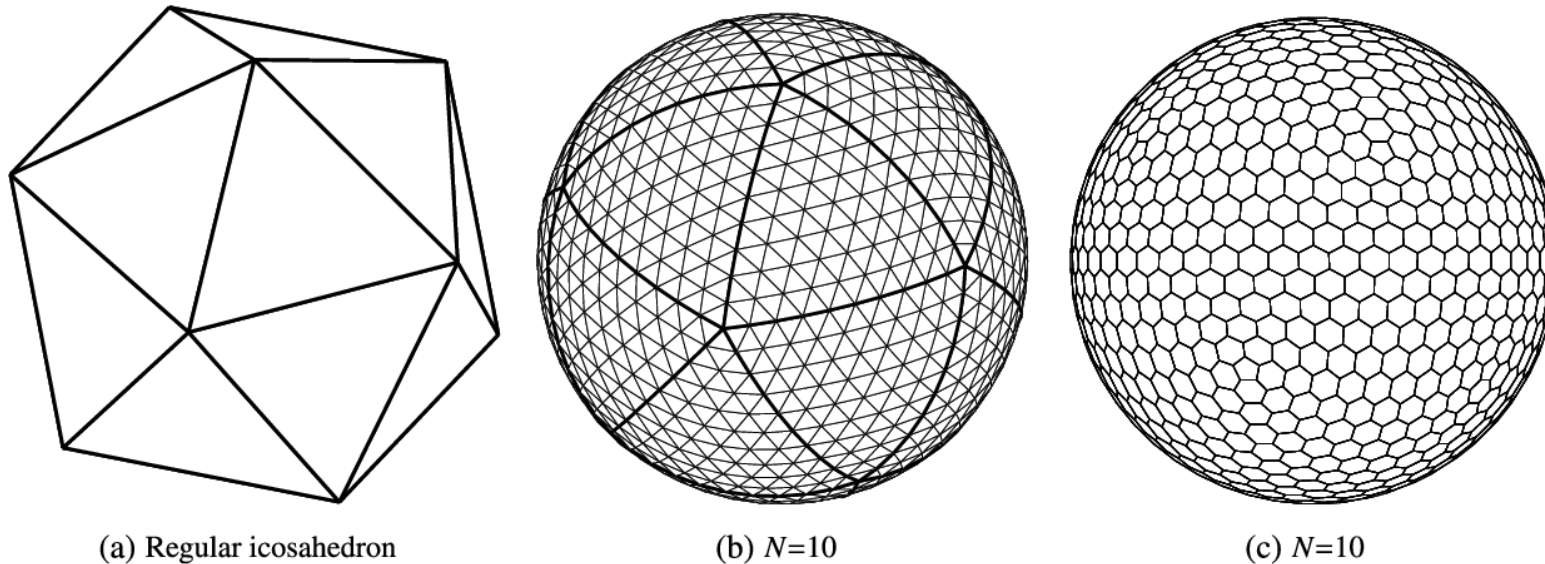
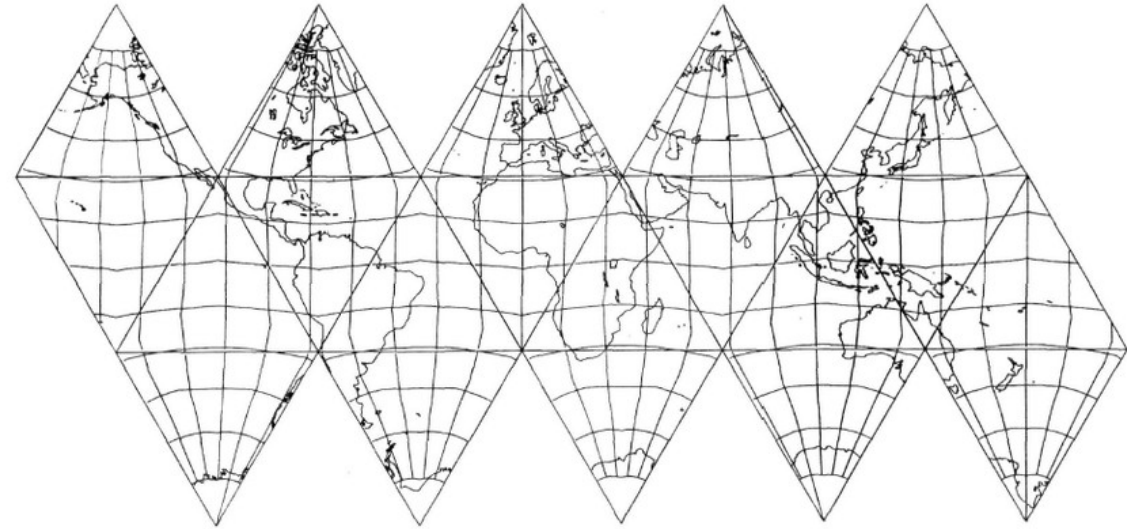


Fig. 7. The gradual refinement of the icosahedral geodesic grids.
Chen et al. 2014

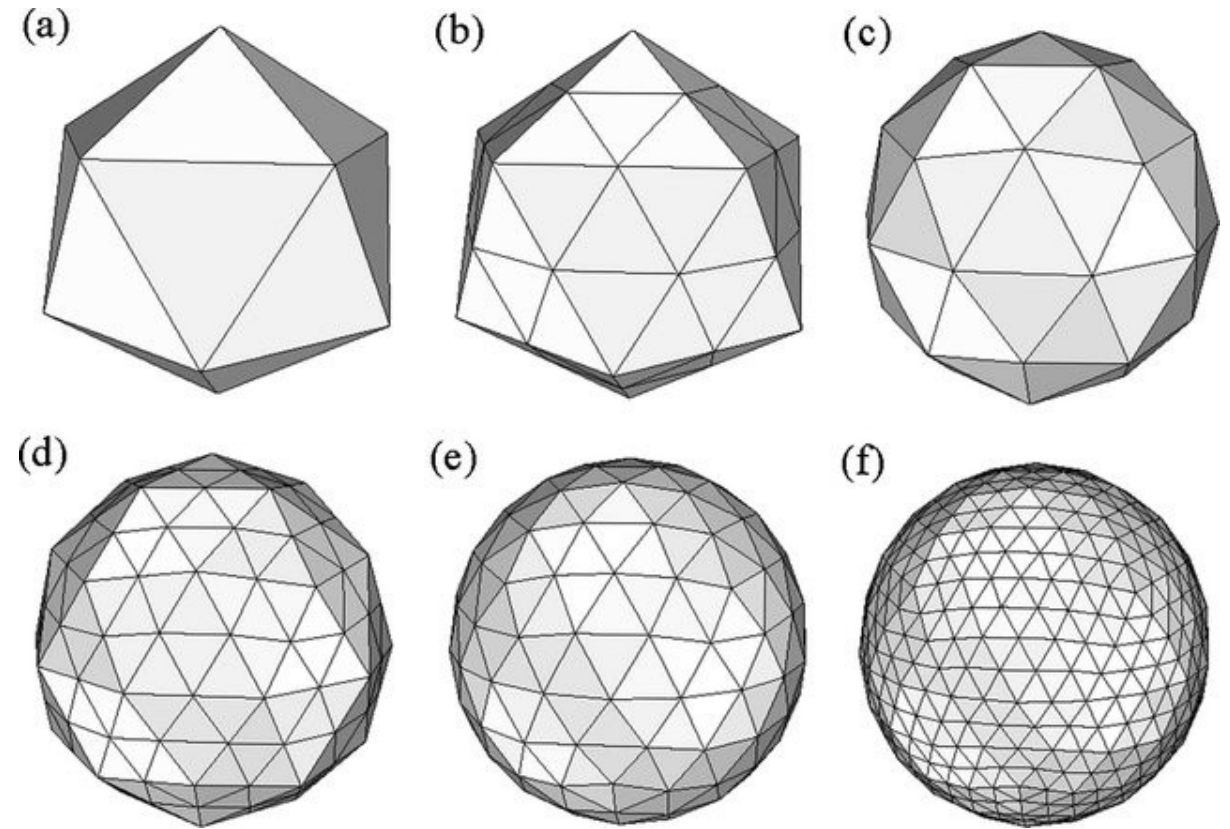
Package ddgridR: Discrete Global Grids for R

- by Richard Barnes
- Based on an program by Kevin Sahr
- Not on CRAN! <https://github.com/r-barnes/dggridR>
- Based on a Snyder projection
- Very high resolution, and well-known mathematical properties



Package icoesa: Coarse grids based on tessellated icosahedra

- I wrote this, still experimental
- More scalable for global scale
- Interface to sp (will be changed)
- 3D model
- The mathematical properties are unexplored



Icosahedron tessellation (Lipscomb and Ringler, 2005)