The background of the slide is a high-resolution satellite image of the Earth's surface, focusing on the continent of Europe and extending into Africa and the Middle East. The image shows various landmasses in brown and green, with blue oceans and white clouds. The curvature of the Earth is visible at the top.

# Introducing Modern Geospatial

David Bianco  
Sr. Geospatial Architect, AWS

**Agriculture**

**Real Estate**

**Insurance**

**Supply Chain  
Logistics**

**Government**

**Sustainability**

**Retail/CPG**

**Telco**

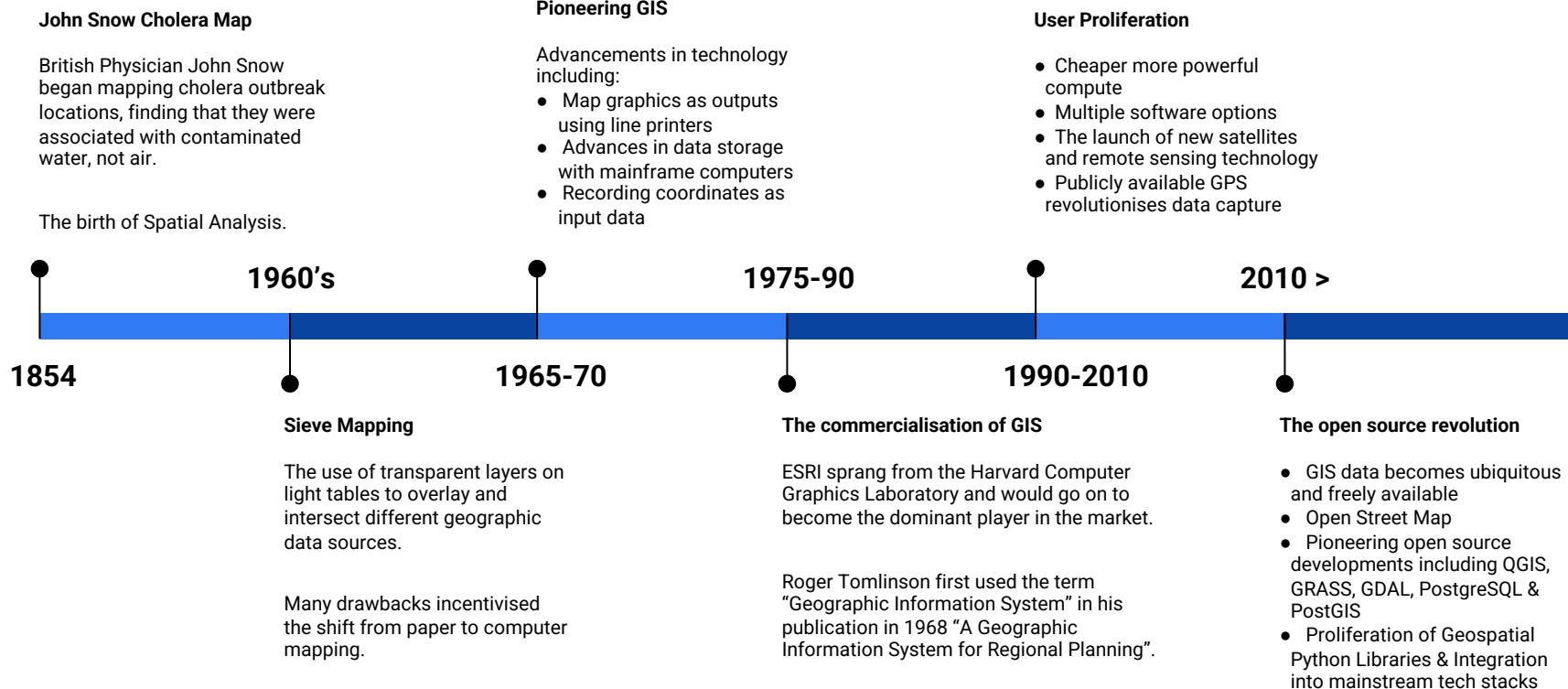
**Real Estate**

**Transportation**

**Financial  
Services**

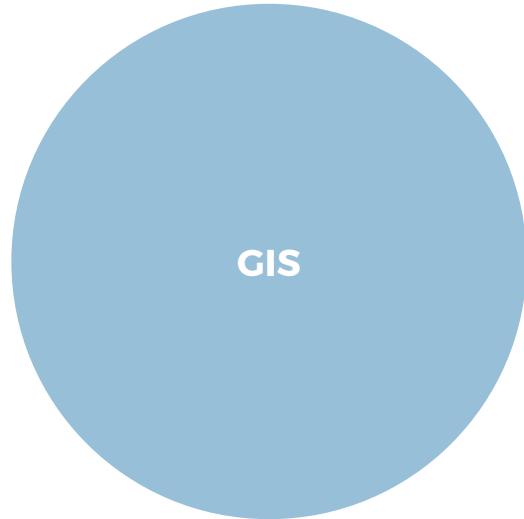
**Utilities**

# A brief history of GIS



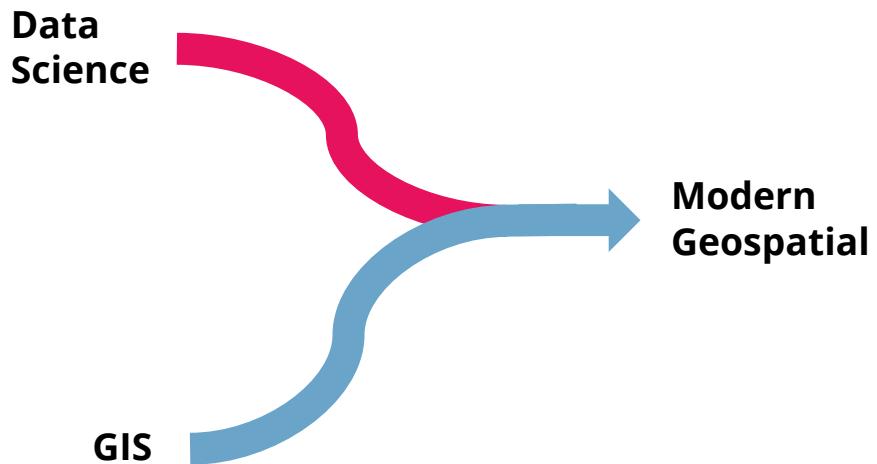
# Legacy GIS

- Monopolistic market:  
ESRI
- Walled garden / Closed  
Source proprietary  
software
- Pseudo open file  
formats
- Siloed teams
- Outputs typically static &  
focussed around maps



# Modern geospatial

- Standards based
- Open & Interoperable Tools
- Familiar programming languages (Python, SQL, R)
- Directly integrated with typical Data Science tech stacks
- Thriving open source ecosystem
- Cloud native & highly scalable for:
  - Massive data volumes
  - Different data types & velocities



# **Modern Geospatial is** ***Cloud-Native Data Formats***

## **Cloud-Optimized GeoTIFF (COG)**



- Efficient imagery data access
- Legacy compatibility
- Cloud native, optimized for S3
- Bring compute to your data
- Rasterio python library
- <https://cogeo.org/>

**Modern Geospatial is**  
***Cloud-Native Data Formats***

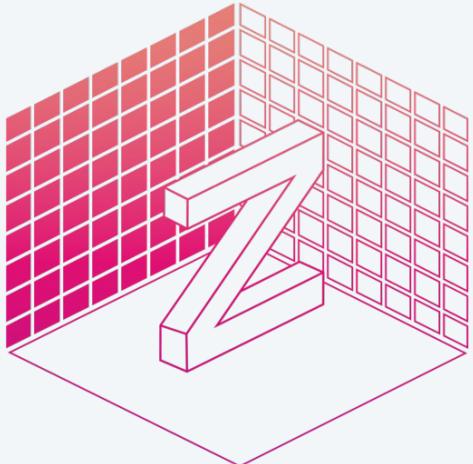
## **Cloud-Optimized Point Cloud (COPC)**



- Manage LiDAR point cloud data
- LAZ file (LAS zip compressed)
- Cloud native, optimized for S3
- Friends with PDAL, Entwine, Greyhound
- <https://copc.io/>

# Modern Geospatial is *Cloud-Native Data Formats*

## Zarr



- Common format for climate analytics use cases
- N-dimensional array
- Cloud-native (S3) vs HDF, NetCDF
- <https://zarr.dev/>

# **Modern Geospatial is** ***Cloud-Native Data Formats***

## **GeoParquet**



**Parquet**

- A powerful column-oriented data format
- Built from the ground up as an alternative to the CSV
- Cross platform
- An incubating OGC Standard to add geospatial data types (point, line, polygon) to Parquet
- <https://github.com/opengeospatial/geoparquet>

# Modern Geospatial is *Community*



CLOUD-NATIVE  
GEOSPATIAL  
FOUNDATION



The Spatial Community



**Modern Geospatial is  
*Analytics at Scale***

## Data Warehouse

- Analytics use cases
- SQL engine
- Serverless and Scalable options
- DuckDB – the new kid in town



Google  
Big Query



amazon  
REDSHIFT



databricks



DuckDB

# Modern Geospatial is *Analytics at Scale*

## Notebooks

- Perfect for experiments, R&D
- Analytics and visualization
- Collaboration
- Self-contained



Amazon SageMaker



Fused.io



databricks



**Modern Geospatial is**  
***Analytics at Scale***



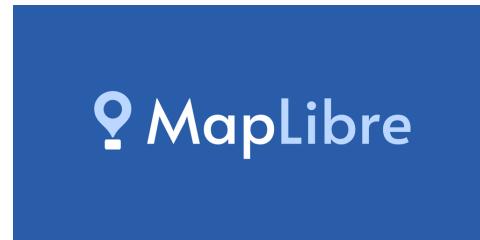
## Parallel Compute

- Python
- Spark, Scala
- Big data
- Serverless functions



# **Modern Geospatial is *Serverless Web Maps***

- Raster and Vector map tiles
- TiTiler (raster)
- PMTiles (vector)
- Multiple front-end JS libraries
  - MapLibre
  - CARTO
  - Leaflet
  - OpenLayers



**Modern Geospatial is  
*Open Data***

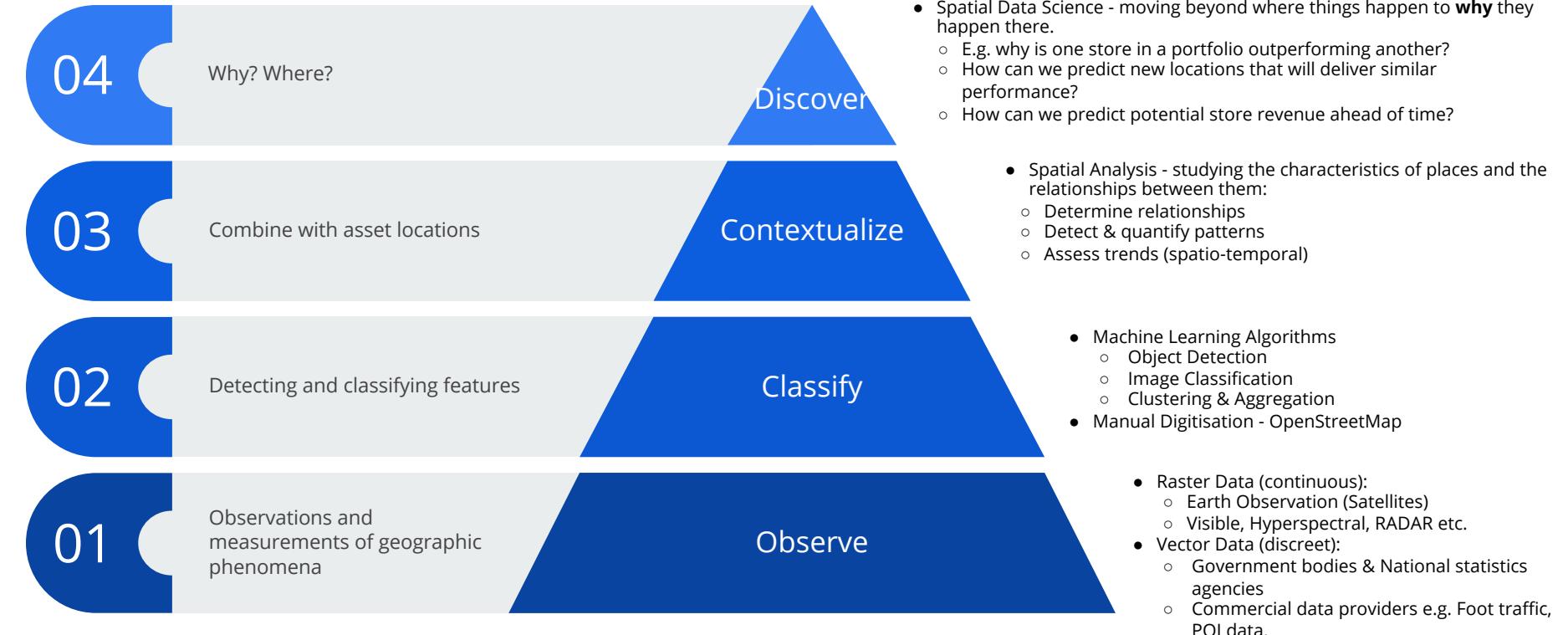


CARTO Spatial  
Data Catalog

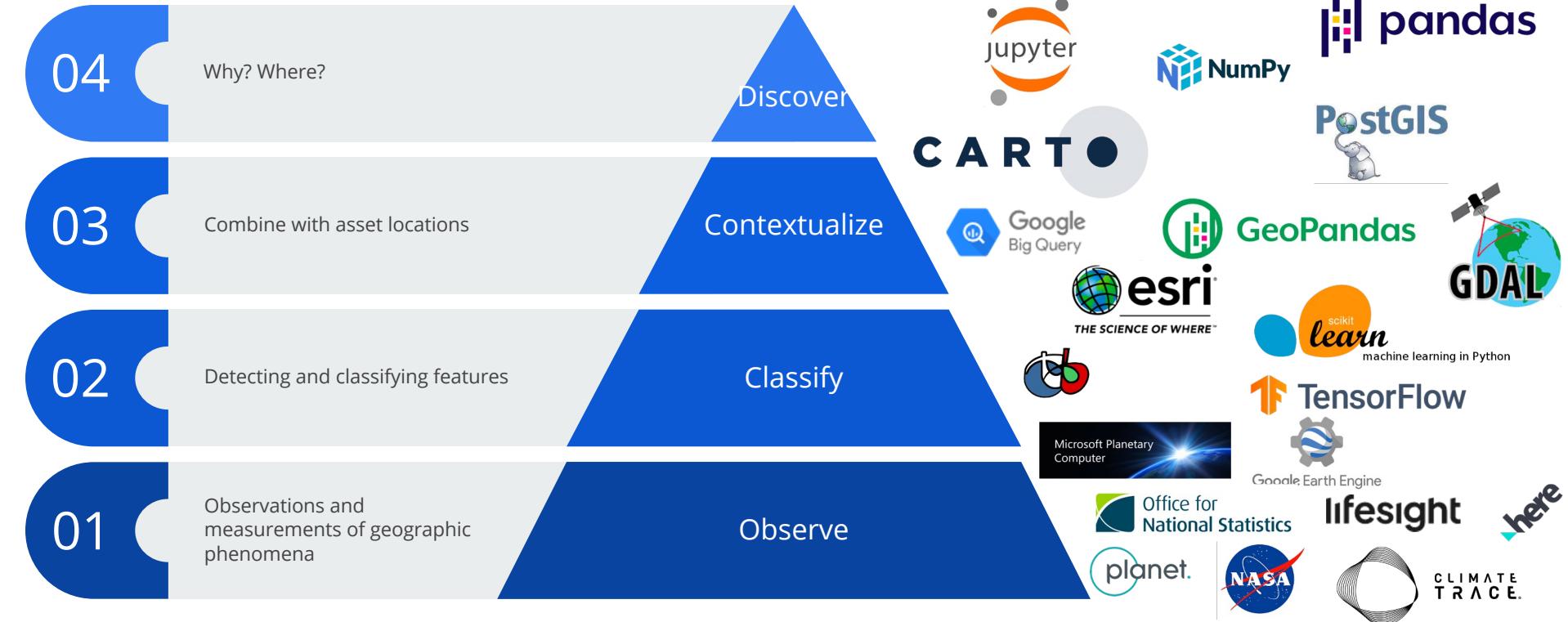
**SOURCE  
COOPERATIVE**



# The Spatial Pyramid



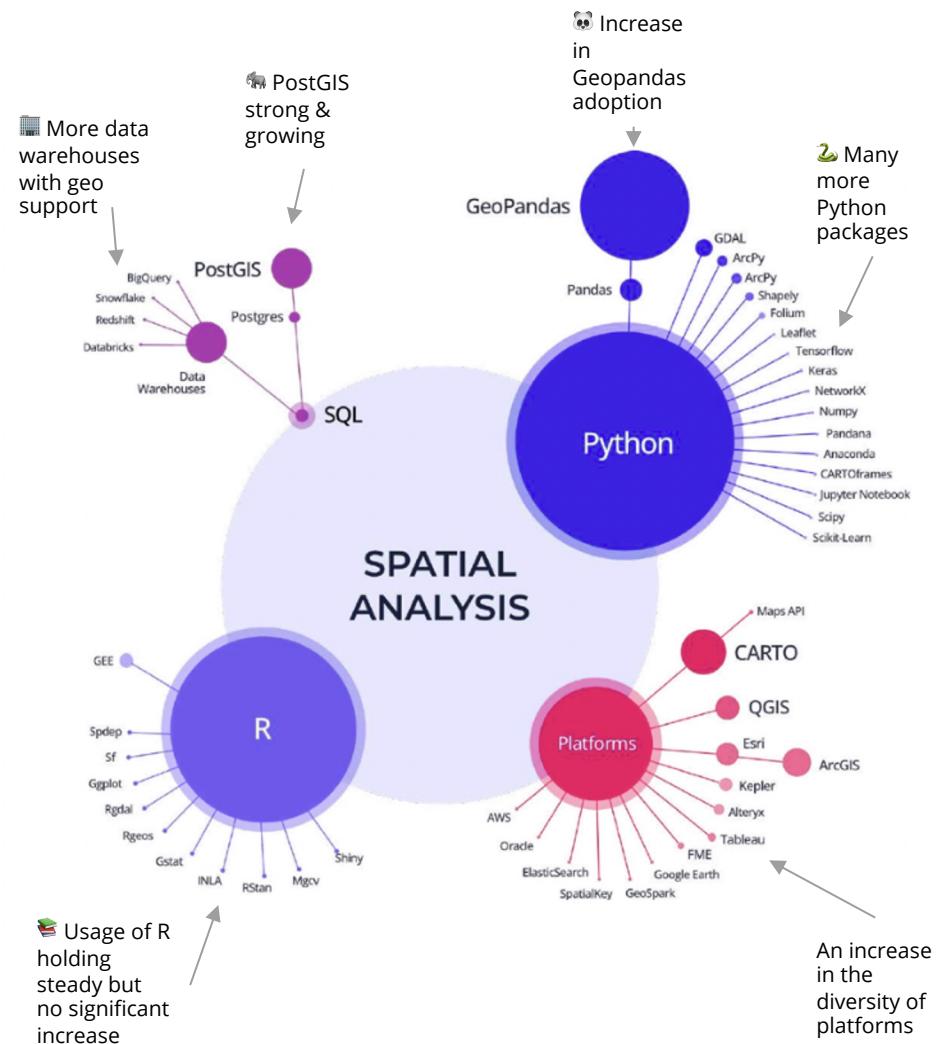
# The Spatial Pyramid - Toolkit Examples



# The State of Spatial Data Science 2023 (vs. 2022)

💡 86% of teams use Python or SQL as their primary programming language

From: The State of Spatial Data Science in Enterprise 2023 by CARTO & AWS.



# The growth in Geo-Python packages

Applications are diverse:

From remote sensing image processing through to network analysis & routing.

Multiple packages are available for every stage of the workflow from object detection and image classification through to data visualisation.

## 2022 Geospatial Python Packages Stats

Percent increase is from 2021. Data provided by BigQuery Public Data - Python Package Index dataset.

 geemap	1.2M	+843%
 leafmap	88K	+355%
 esda	336K	+217%
 whitebox	298K	+190%
 pydeck	10.7M	+127%
 geopandas	32M	+108%
 libpysal	591K	+105%
 osmnx	954K	+92%
 fiona	33M	+81%
 folium	10.4M	+66%
 shapely	92M	+63%
 pyproj	56M	+58%
 rasterio	10.9M	+46%
 gdal	2.7M	+18%

# Spatial SQL

Spatial SQL uses all the same elements and structure of normal SQL but allows you to work with another data type: a GEOMETRY or GEOGRAPHY.

GEOMETRIES can be classified in:

1. Points (pairs of coordinates)
2. Lines (sequence of coordinates)
3. Polygons (group of coordinates that form shapes)

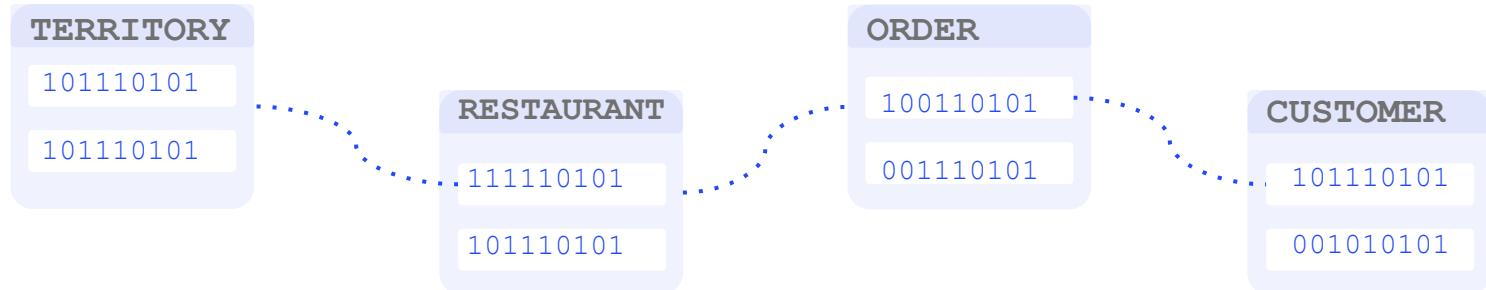
With these new data types come a set of functions, commonly predicated with **ST** (such as ST\_Intersects) which stands for spatial type.

st\_normalize  
st\_orientation st\_geogfromwkb  
st\_ispolygoncw st\_asewkt  
st\_iscollection st\_convexhull st\_asencodedpolyline  
st\_box2dfromgeohash st\_xmax st\_crosses st\_makepoint  
st\_isreverse st\_askml st\_numpatches st\_pointn  
st\_issimple st\_intersects st\_geomfromtext  
st\_simplify st\_chaikinsmoothing st\_m st\_flipcoordinates  
st\_isempty st\_interpolatepoint st\_delaunaytriangles  
st\_linetocurve st\_perimeter2d st\_numgeometries st\_asewkb st\_makesolid  
st\_asgeojson st\_closestpointofapproach st\_intersection  
st\_translate st\_distancespherest\_cpawithinst\_geohash st\_mpolyfromtext  
st\_envelope st\_ispolygonccw st\_makebox2d st\_overlaps st\_geomfromgeojson  
st\_scale st\_estimatedextent st\_extent st\_orientedenvlope  
st\_equals st\_geomfromewkb st\_isring st\_collectionextract  
st\_buildarea st\_curvetolinest\_astwkb st\_symdifference  
st\_filterbym st\_linecrossingdirection st\_dump st\_nrings  
st\_wrapx st\_geomfromgml st\_polygonfromtext st\_dimension  
st\_seteffectivearea st\_geomfromkml st\_projectst\_dwithin  
st\_distance st\_isvalidreasonst\_contains st\_xminst\_coorddim  
st\_centroid st\_zmin st\_straightskelton st\_numinteriorring  
st\_aslatlontext st\_zmax st\_difference st\_clusterdbscan  
st\_geometry st\_linefromwkb st\_dancespheroid st\_linesubstring  
st\_voronolines st\_gmltosql st\_concavehull st\_linefrommultip  
st\_within st\_isplanar st\_closestpointst\_asx3d  
st\_asgeobuf st\_makeline st\_memunion st\_dfullywithin  
st\_angle st\_removepoint st\_linemerge st\_setpointst\_hasarc  
st\_approximatemedialaxis st\_clusterwithin st\_makenevelope  
st\_startpointst\_geometryfromtext st\_makevalid st\_tileenvelope  
st\_hausdorffdistance st\_shiflongitude st\_pointinsidecircle  
st\_orderingequals st\_multist\_interiorring st\_zmflag  
st\_union st\_memsizer st\_disjoint st\_transform  
st\_memsizes st\_exteriorring st\_points

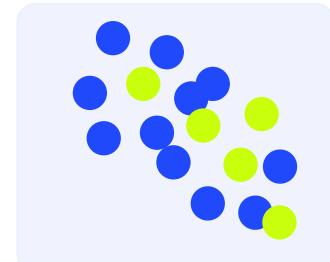
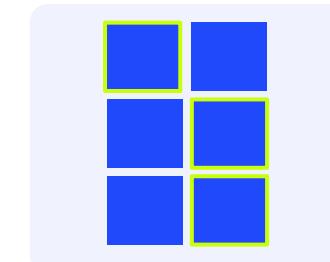
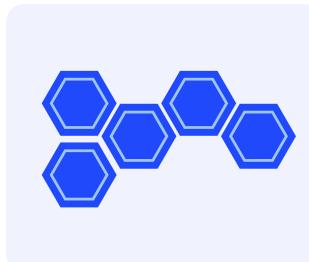
# Spatial SQL - language of the Data Warehouse

	Native ST Functions	CARTO's Analytics Toolbox Functions	Total
 PostGIS	271	17	<b>288</b>
 Google Big Query	64	123	<b>187</b>
 amazon REDSHIFT	102	62	<b>164</b>
 snowflake®	66	82	<b>148</b>
 databricks	-	71	<b>71</b>

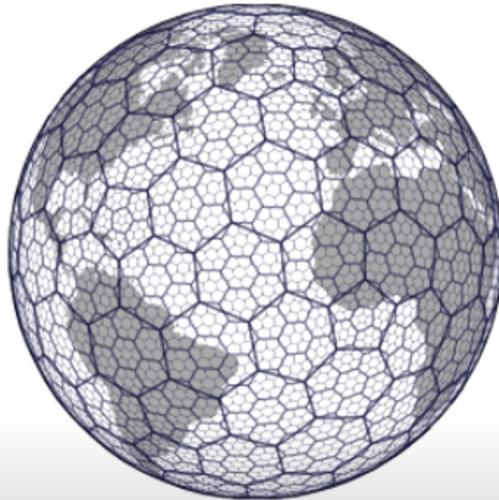
# How do you model your data?



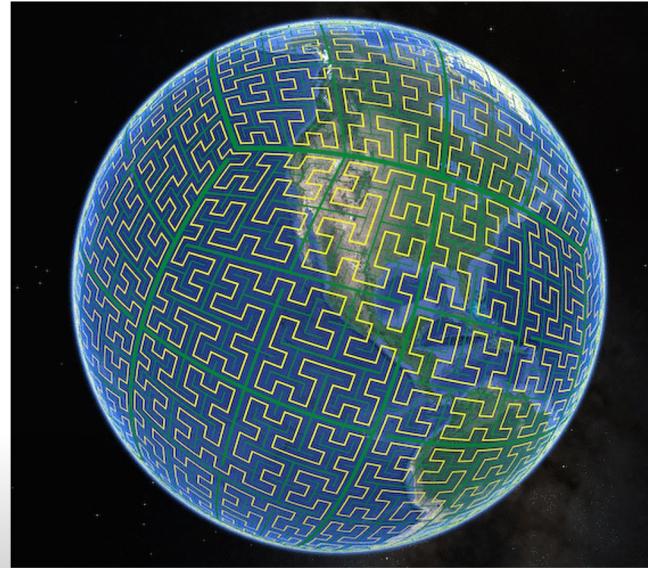
What geographic support you use matters a lot



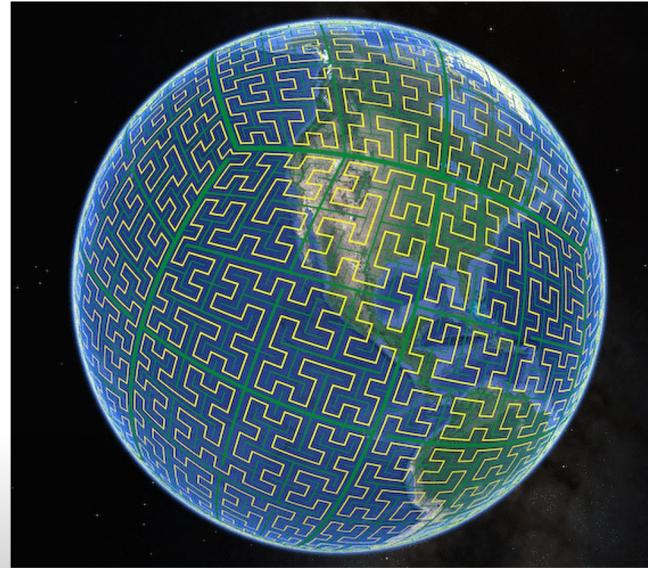
(0,0)	(1,0)	(2,0)	(3,0)	(4,0)	(5,0)	(6,0)	(7,0)
(0,1)	(1,1)	(2,1)	(3,1)	(4,1)	(5,1)	(6,1)	(7,1)
(0,2)	(1,2)	(2,2)	(3,2)	(4,2)	(5,2)	(6,2)	(7,2)
(0,3)	(1,3)	(2,3)	(3,3)	(4,3)	(5,3)	(6,3)	(7,3)
(0,4)	(1,4)	(2,4)	(3,4)	(4,4)	(5,4)	(6,4)	(7,4)
(0,5)	(1,5)	(2,5)	(3,5)	(4,5)	(5,5)	(6,5)	(7,5)
(0,6)	(1,6)	(2,6)	(3,6)	(4,6)	(5,6)	(6,6)	(7,6)
(0,7)	(1,7)	(2,7)	(3,7)	(4,7)	(5,7)	(6,7)	(7,7)



Quadkey ([source](#))



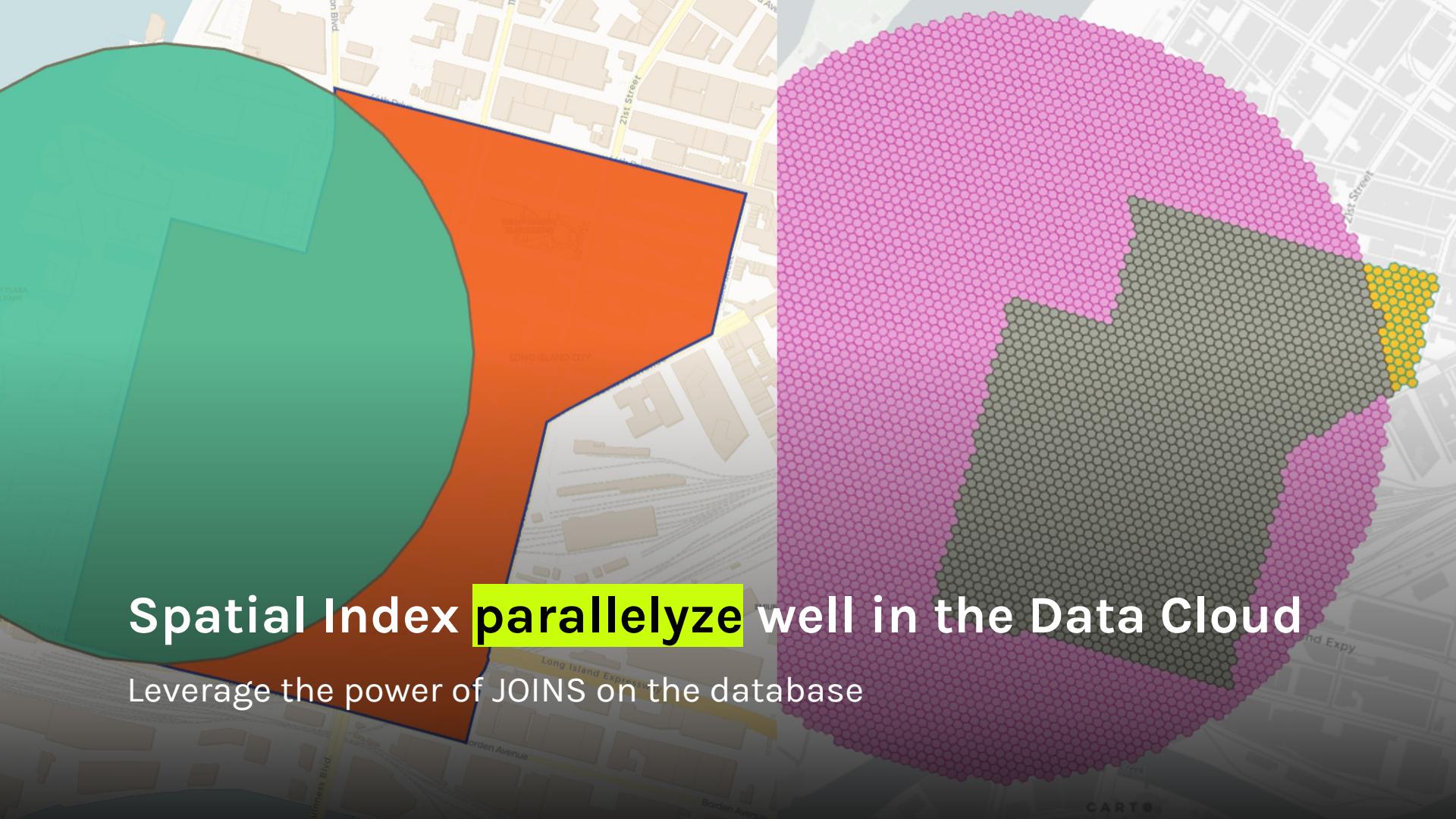
Uber's H3 ([source](#))



S2 ([source](#))

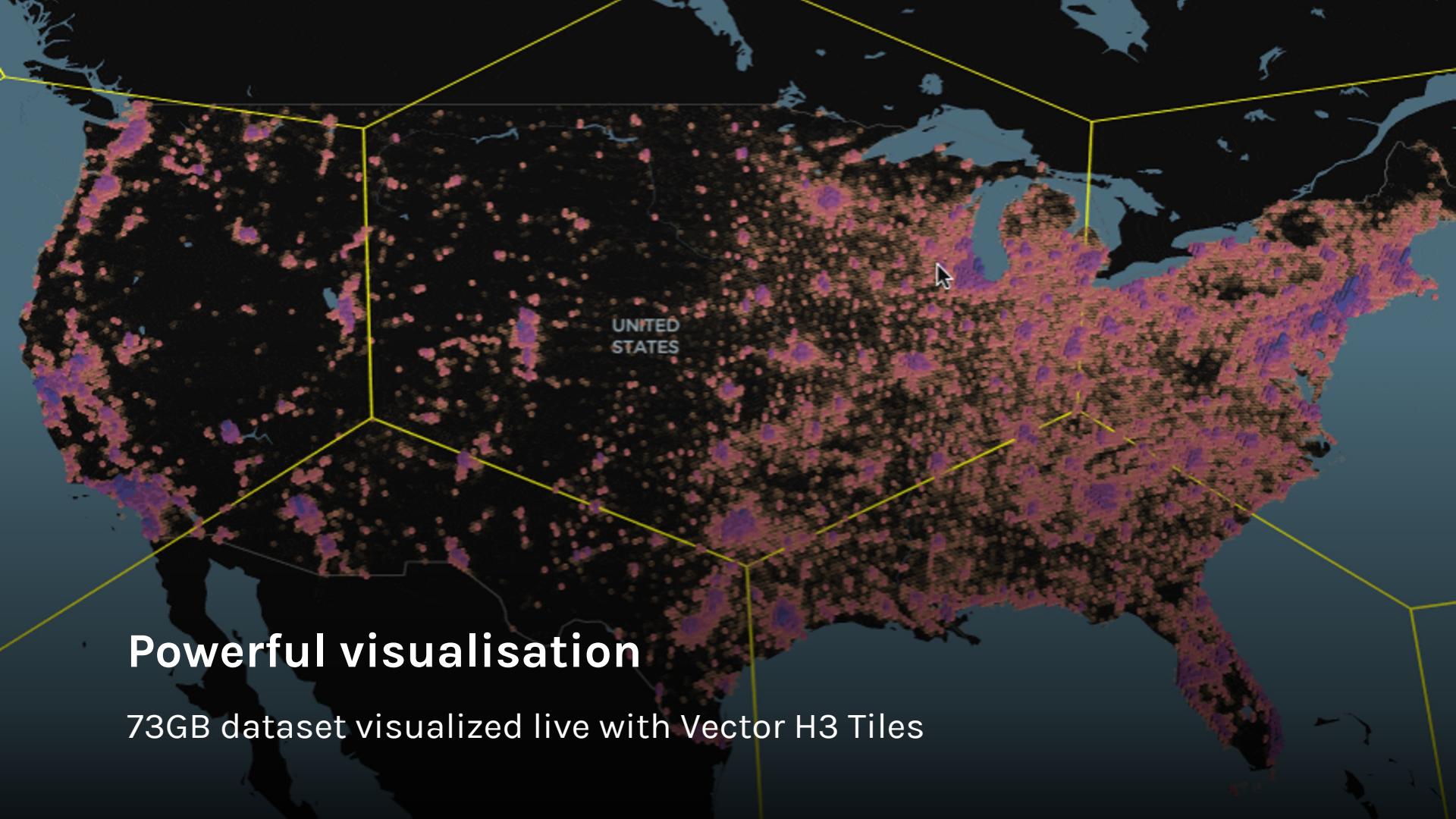
# Geospatial Hierarchical Indexes

Different strategies to partition the space into discrete grids



**Spatial Index **parallelize** well in the Data Cloud**

Leverage the power of JOINS on the database



**Powerful visualisation**

73GB dataset visualized live with Vector H3 Tiles

# Thank You.

David Bianco, AWS

