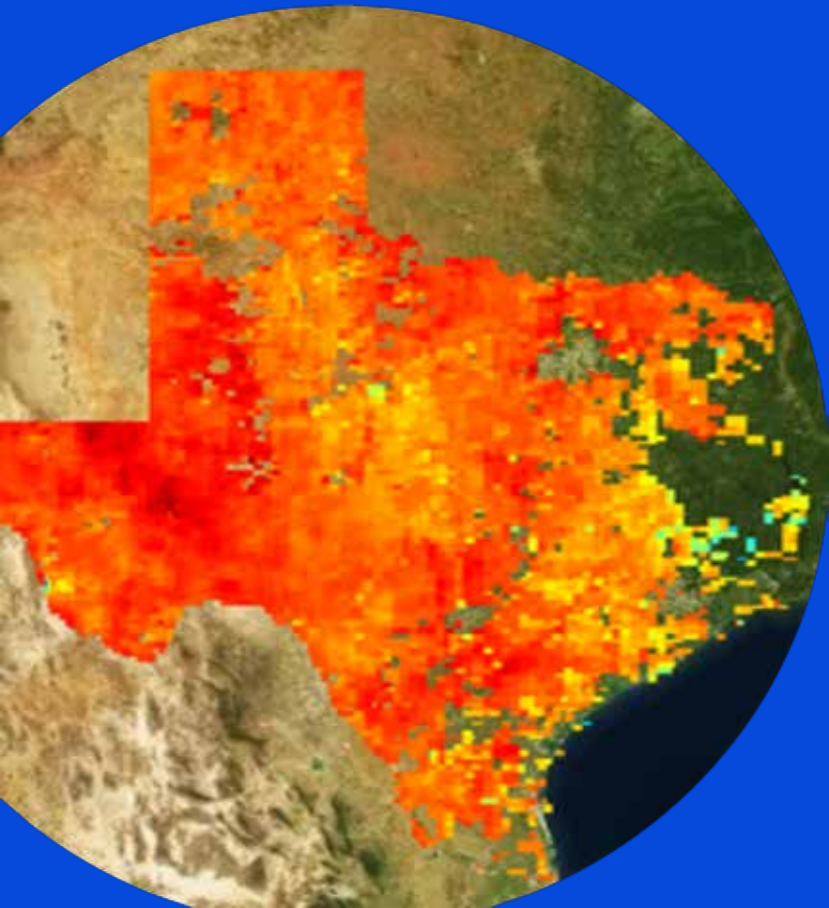


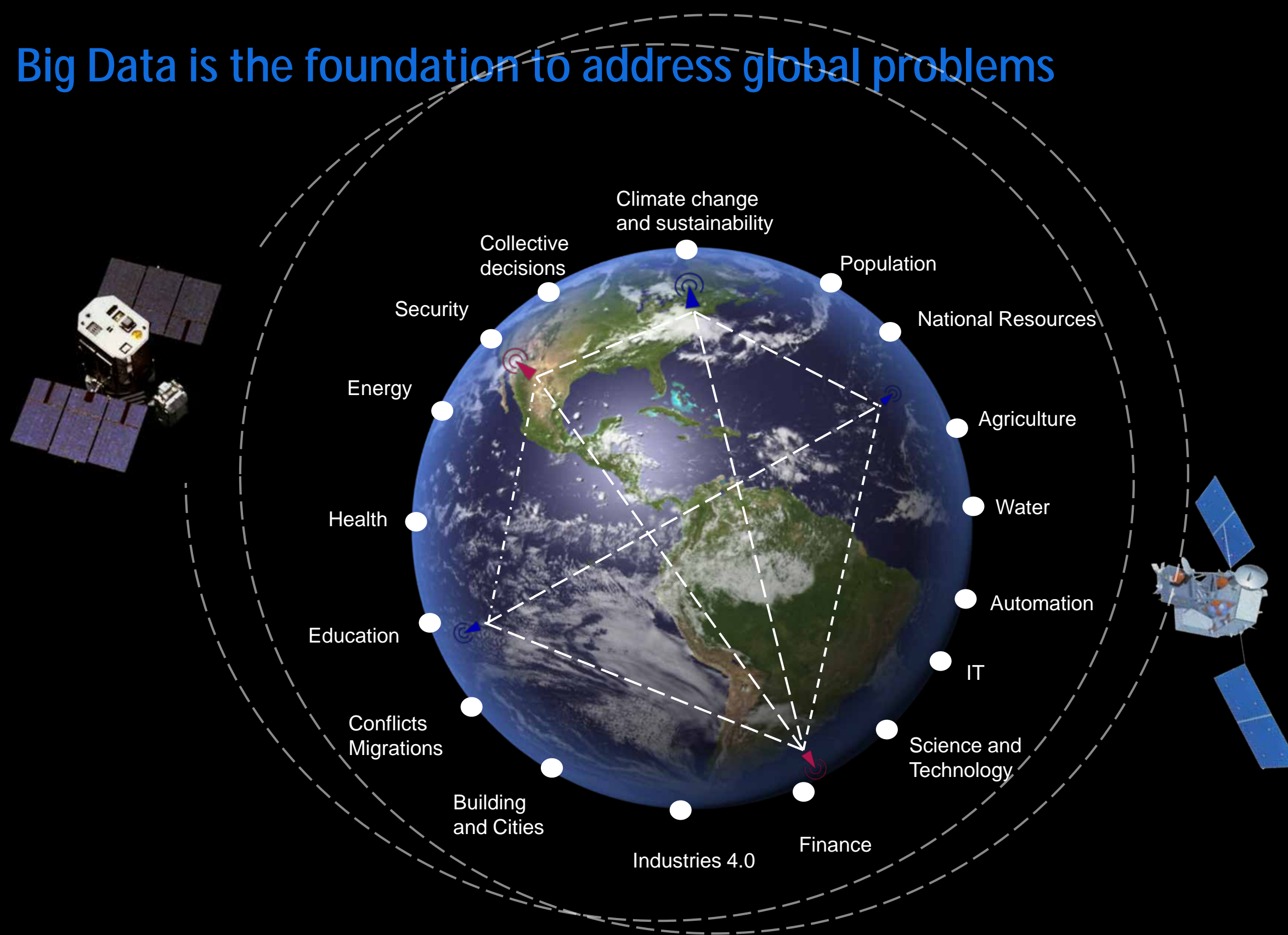
Big Data and Artificial Intelligence: Global Scale Geo-Spatial Analytics

Levente Klein

IBM TJ Watson Research Center, NY



Big Data is the foundation to address global problems

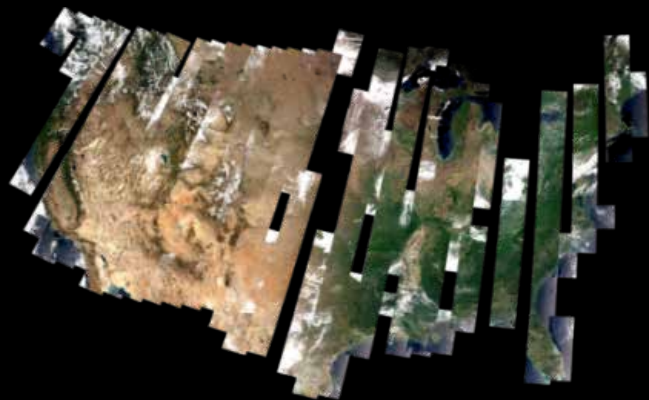


What is PAIRS? *A platform developed at IBM Research to ingest and analyze drone, weather and satellite data at global scale*

TODAY'S APPROACH

- Each data set is kept at a different place in different formats, projections, units etc.
- Exabytes stored in billions of “individual scenes”, or files typically on tape.
- Analyst has to “order” scenes from each source:
 - Download, assemble, re-sample, re-project, align, classify scenes, etc.....
- Data is moved to the application
- Time to value is limited by data curation (90%).

LandSat scenes/tiles from
different satellite



PAIRS-Big Data Geospatial Platform



Actions

Query

COVID-19 State-level

Description

States/Province of USA, CDN, GER, PCR, AU

layer

STATECOVID.Confirmed

Survey - State Coronavirus (COVID 19)
Confirmed COVID-19 cases.

time

2020-01-01 00:00 - 2020-05-01 00:...

Opacity

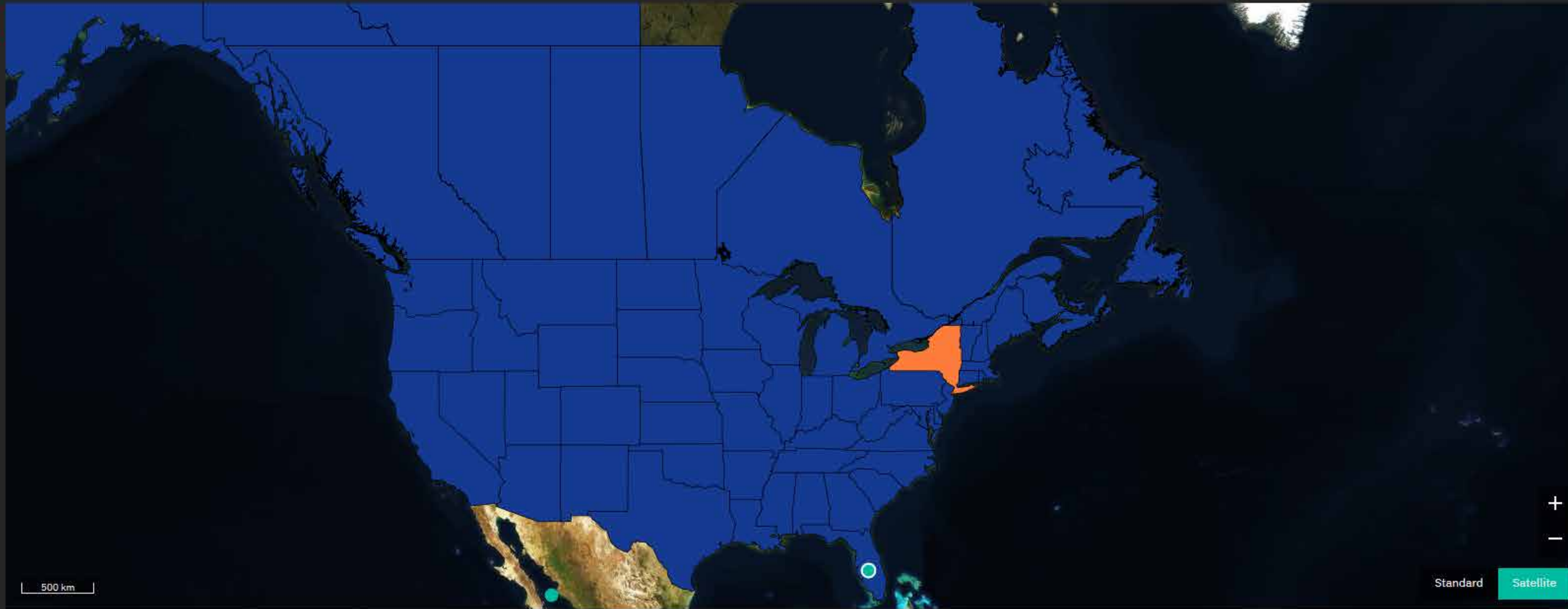
— +

Legend

Units: count

0 - 16000
16000 - 32000
32000 - 48000
48000 - 64000
64000 - 80000

Settings

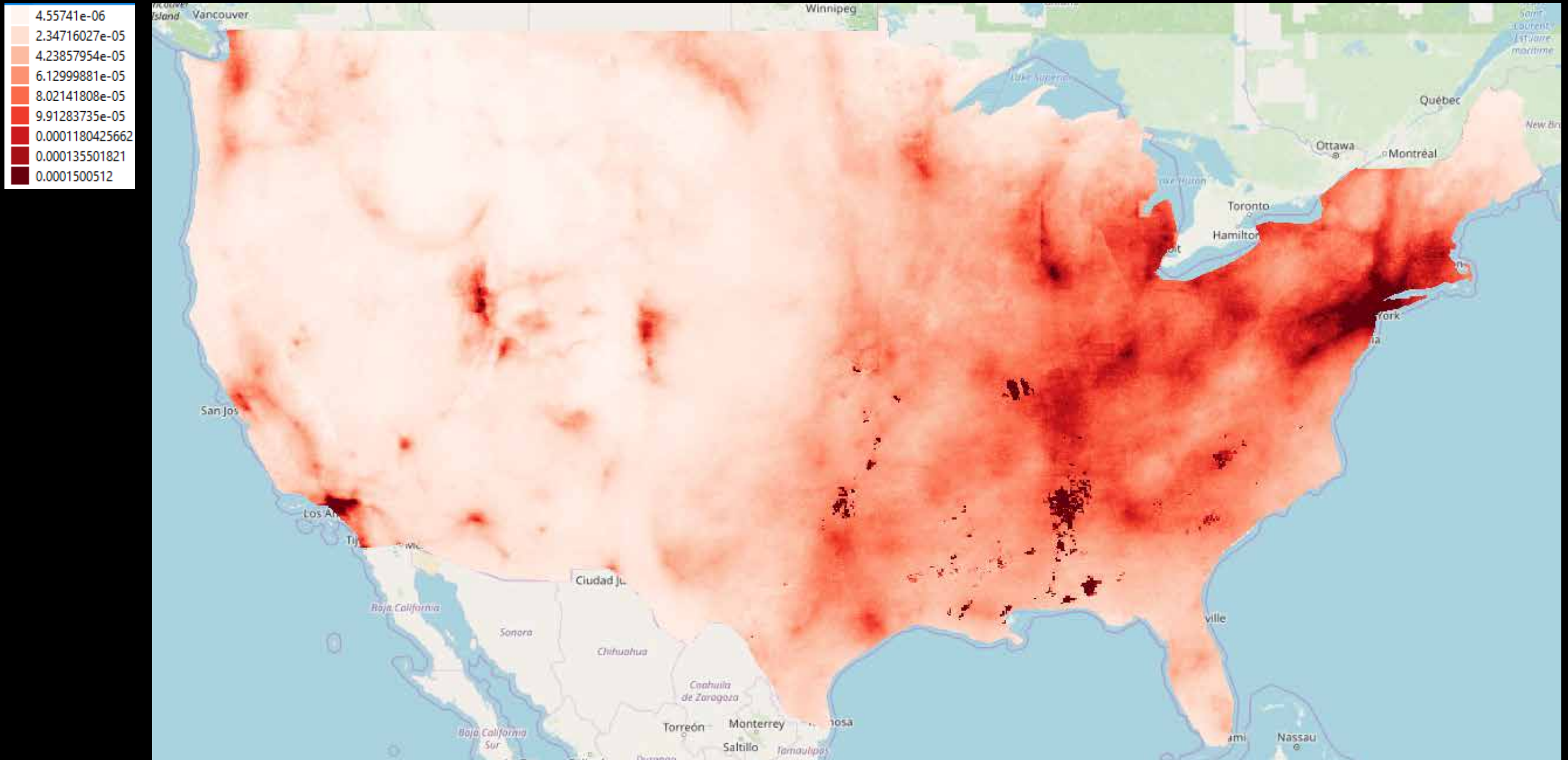


From 2019 - 06 - 30 23 : 00 To 2020 - 10 - 31 00 : 00 Latitude: 27.5273841 Longitude: -81.56167

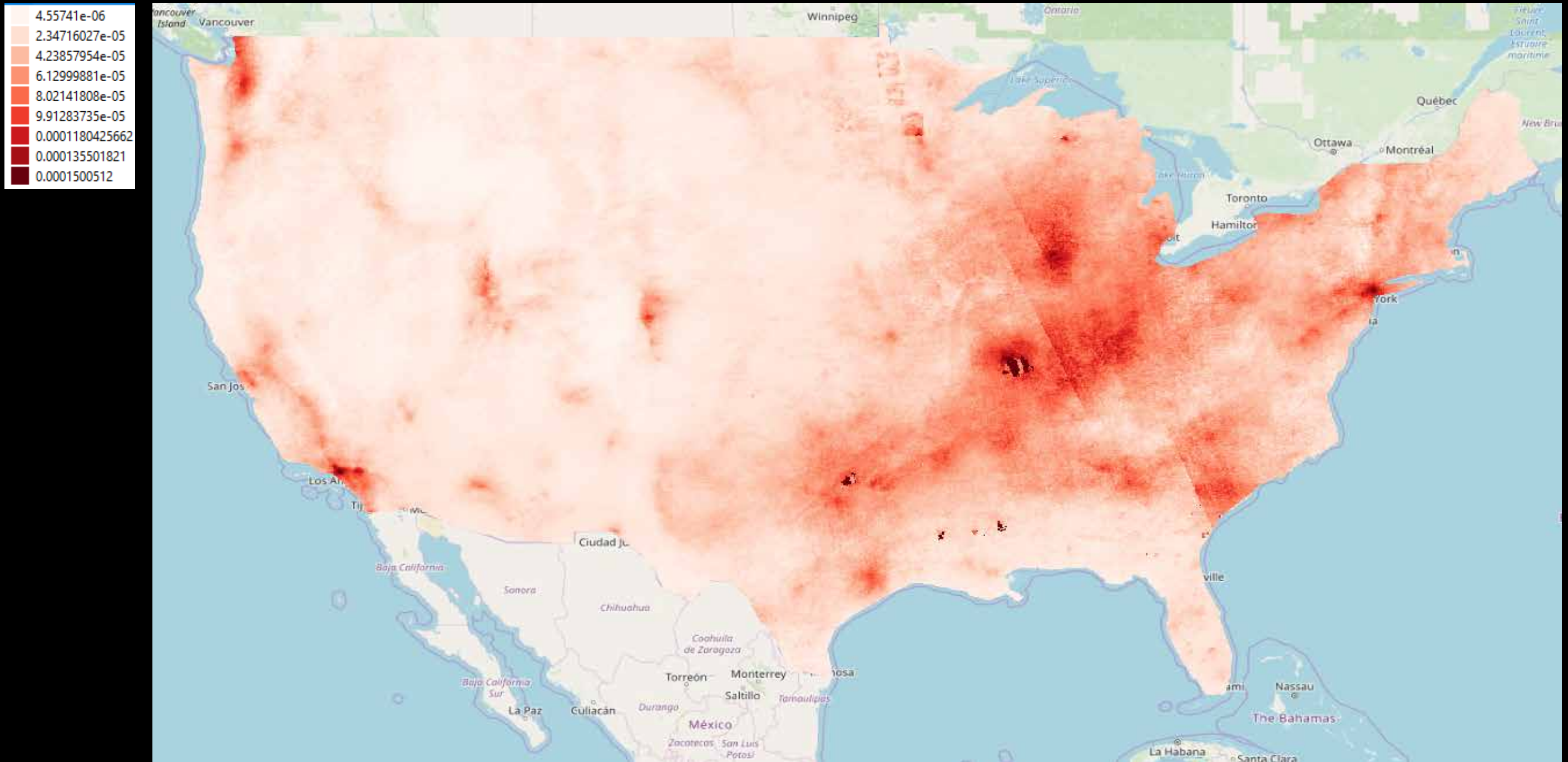


Download as csv

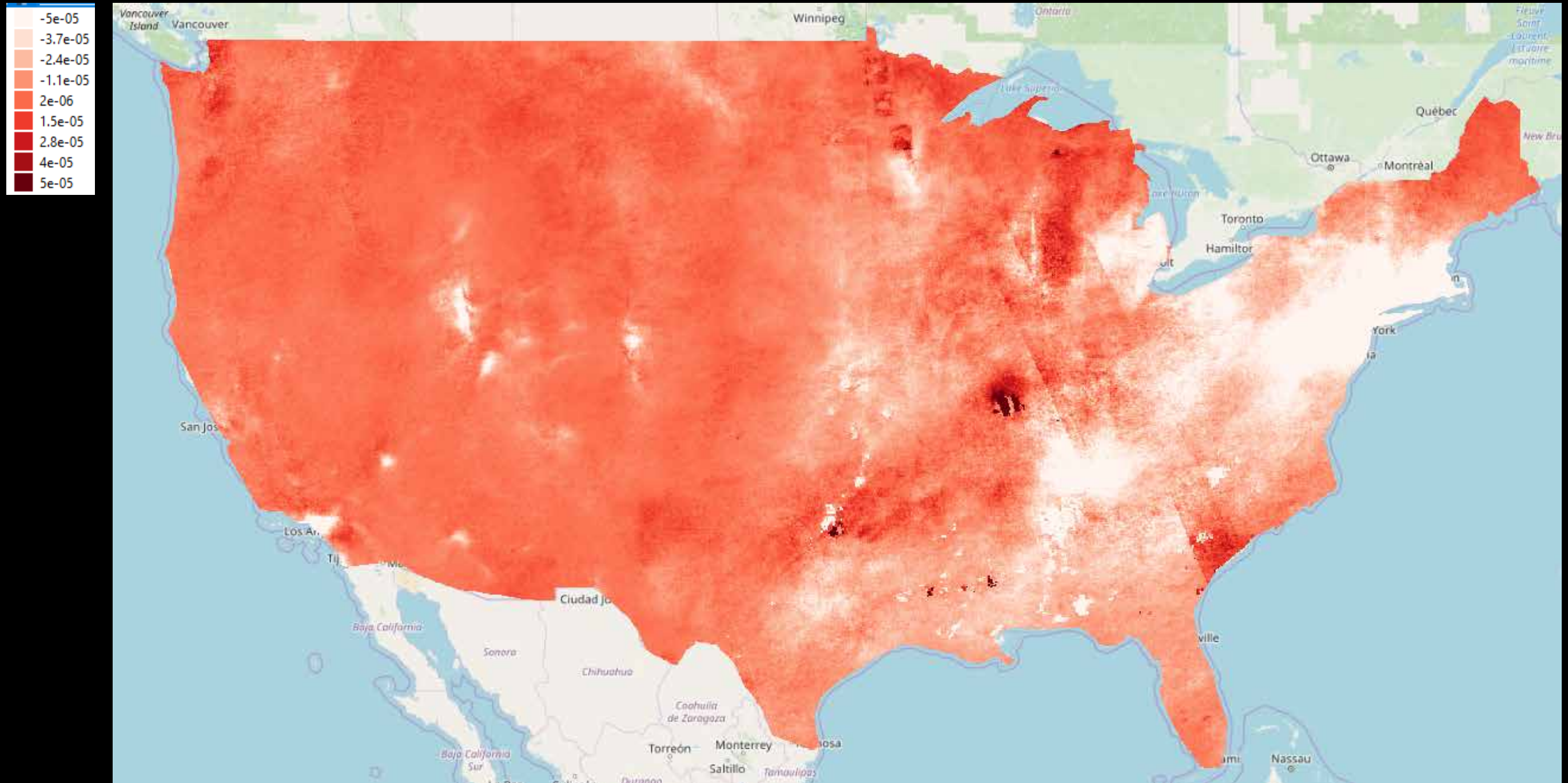
Economic activity monitored by NO2 emission-year to date



Economic Activity by NO2-last 5 days

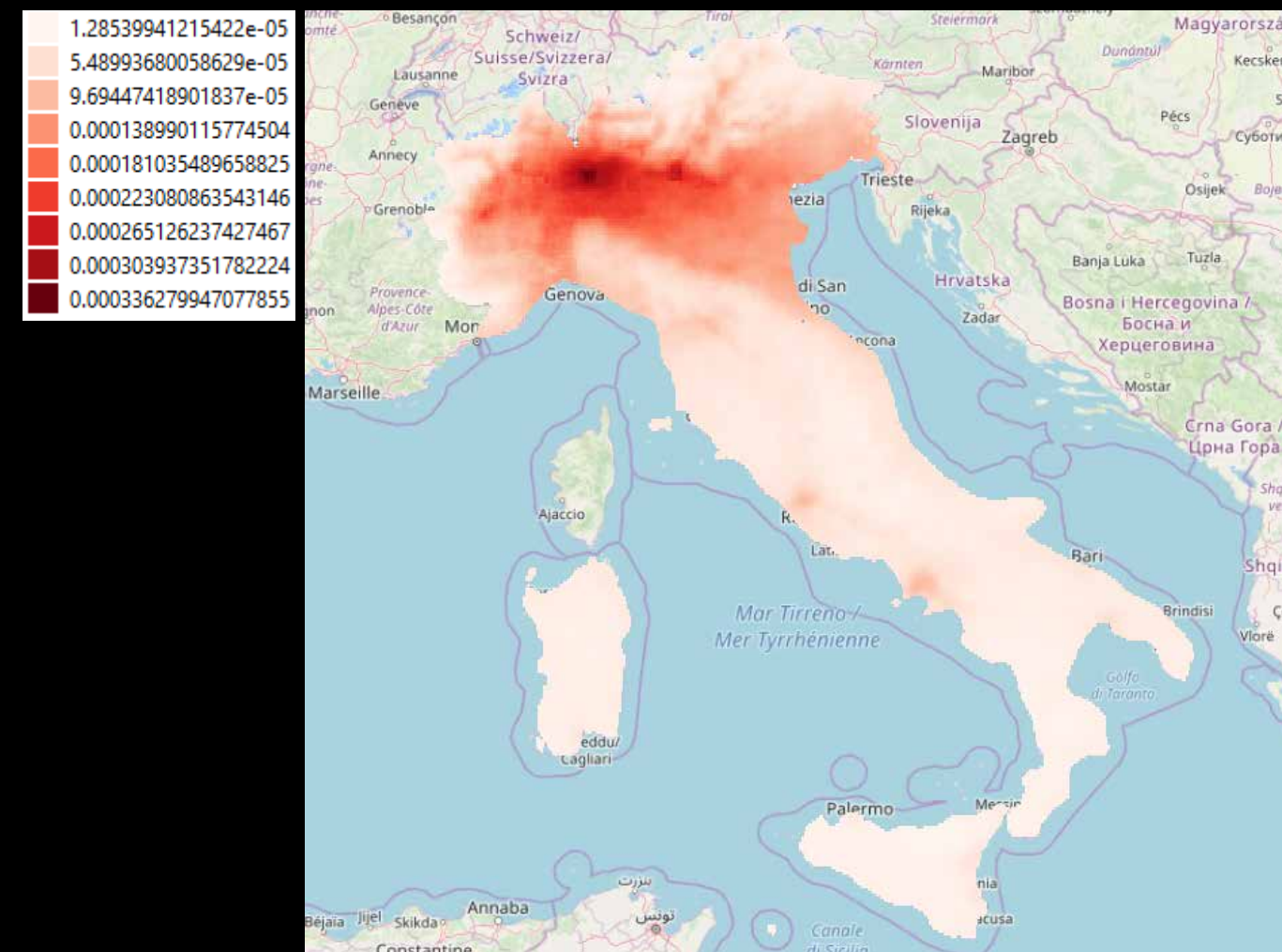


Reduction in NO₂ around quarantined areas

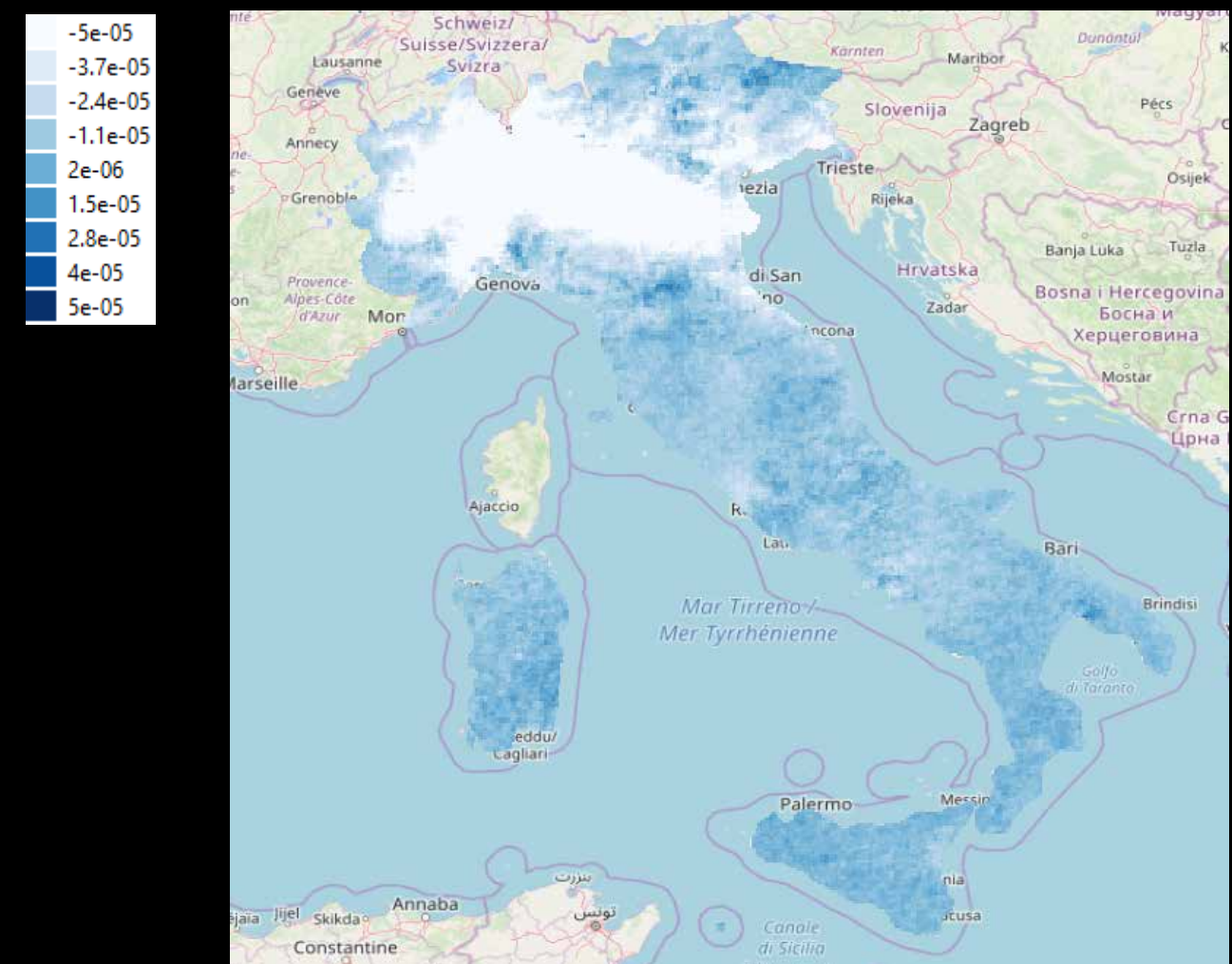


Economic activity from NO2-Italy

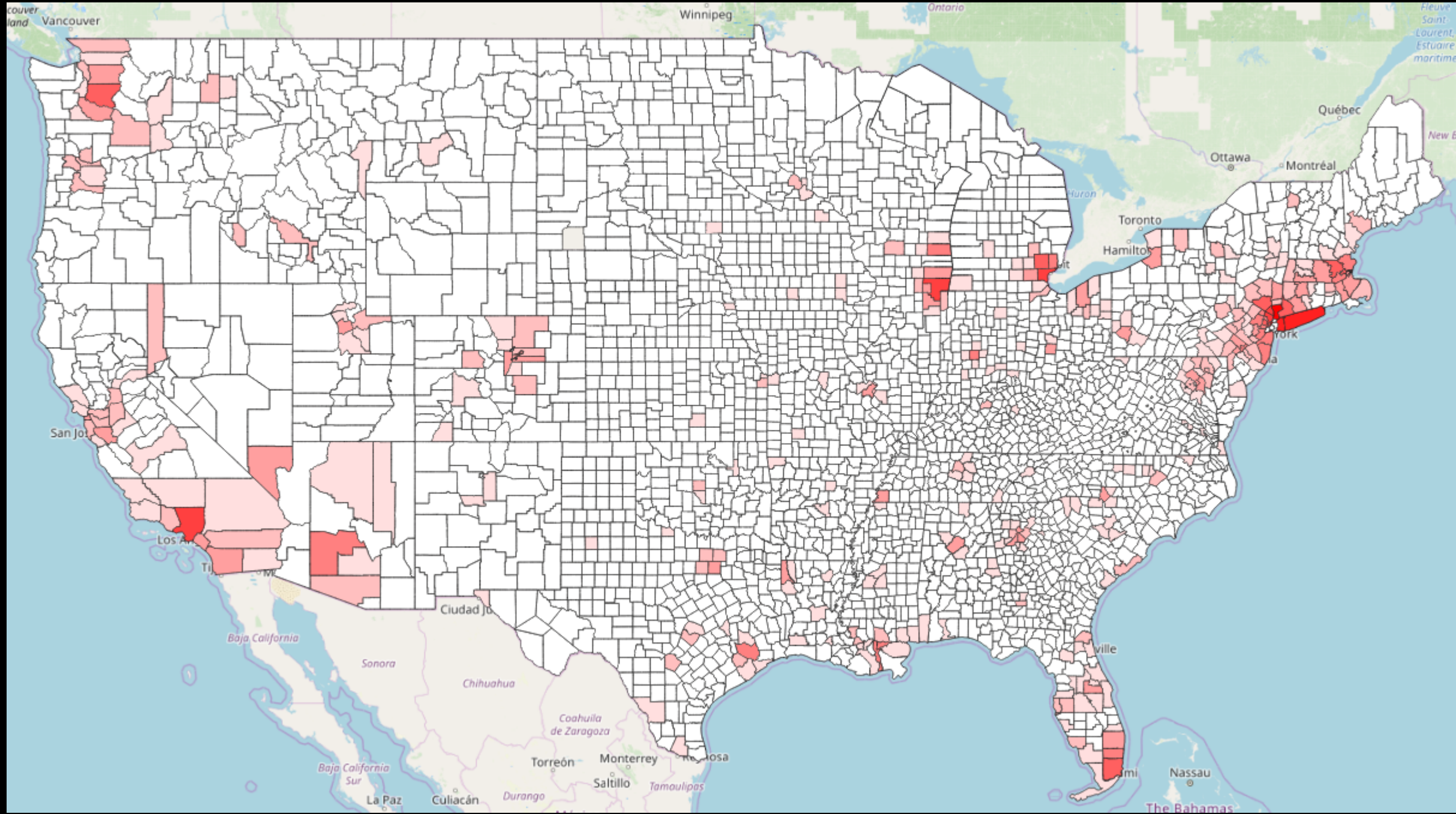
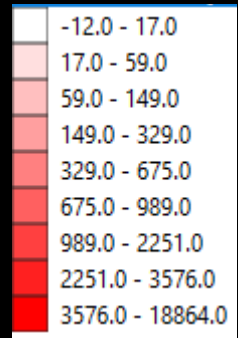
Average NO2-year to date



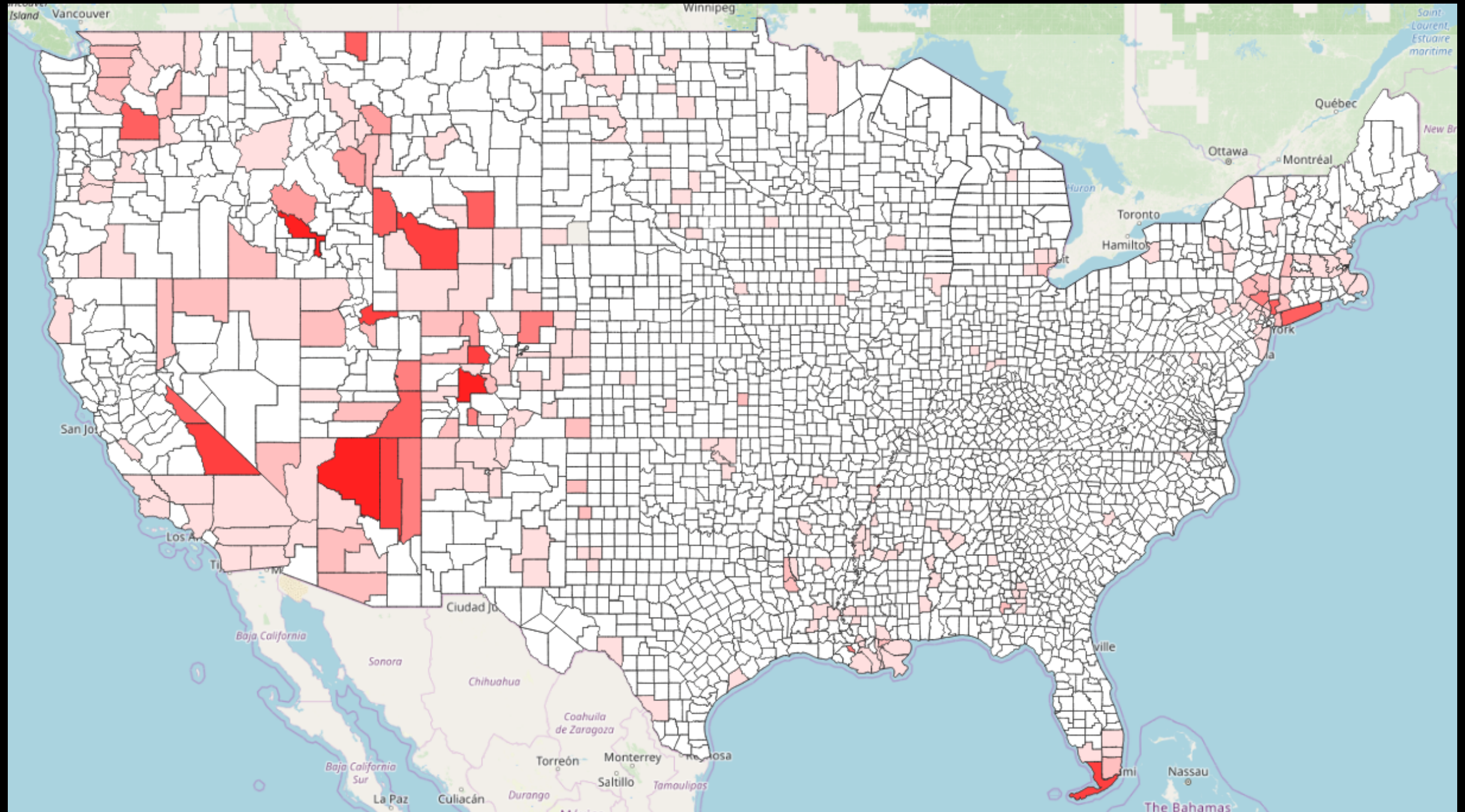
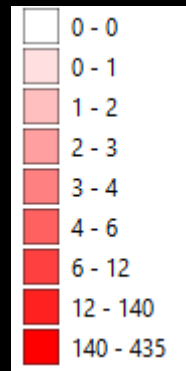
Change in NO2-last 5 days



Rate of COVID cases in last 5 days



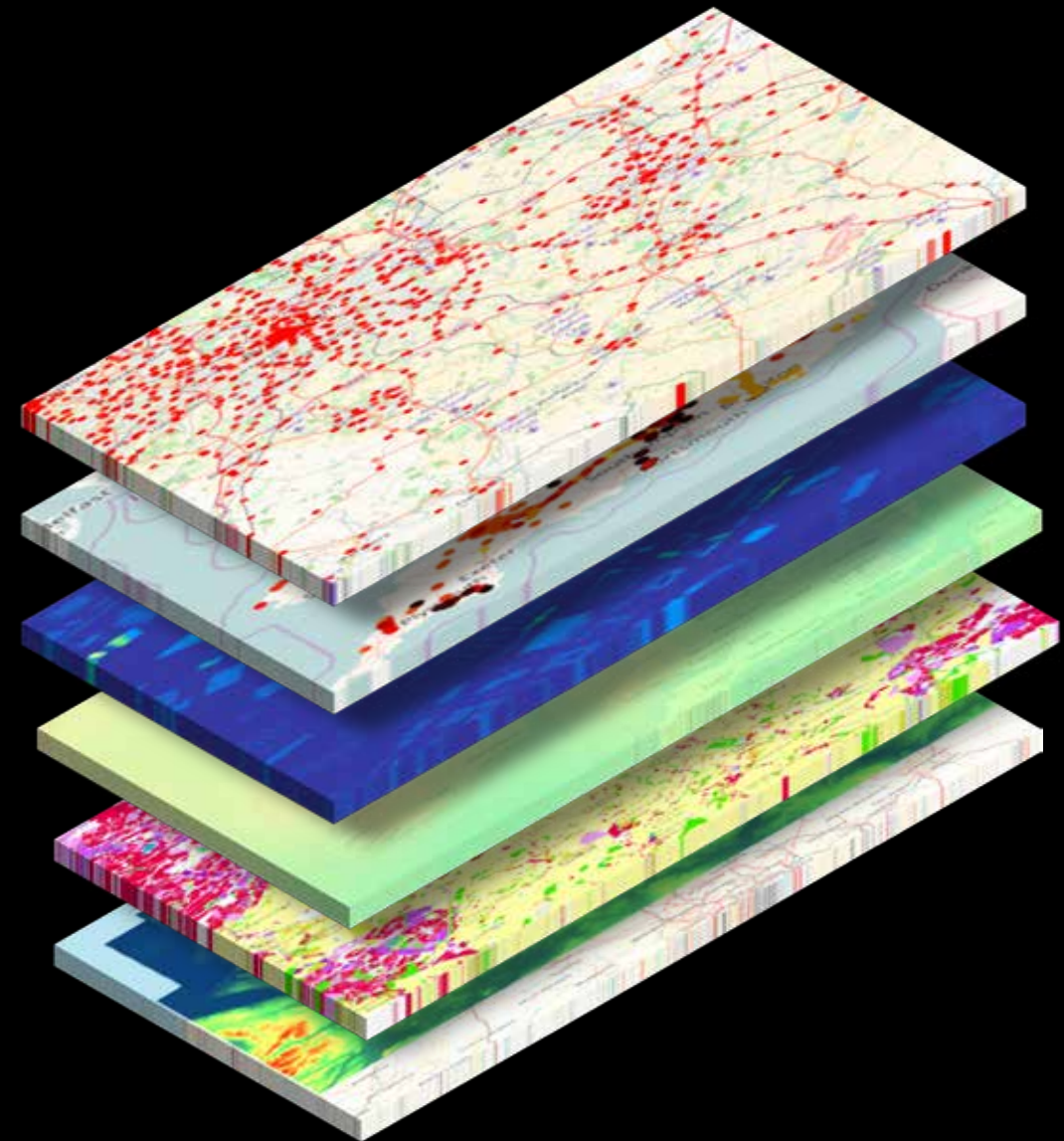
Five days rate of change per population density



Geospatial-temporal analytics on heterogeneous data

Combination of heterogeneous
“Geospatial-temporal” can enable large
scale analytics:

- ü Satellite
- ü Drones
- ü IoT/Mobile device
- ü Radar
- ü Lidar
- ü IoT/Sensors
- ü Weather
- ü Survey
- ü Social media
- ü

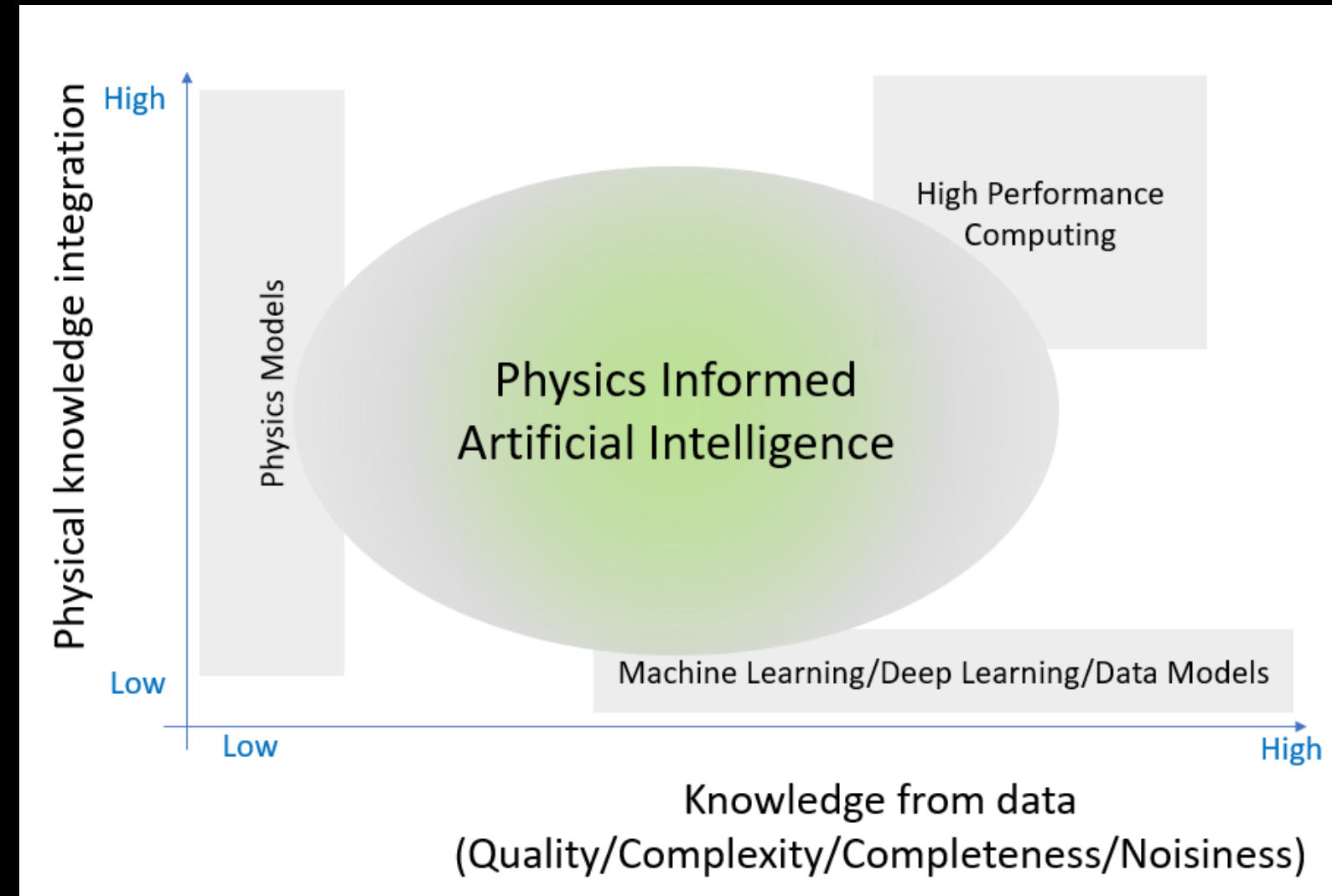


Physics Informed Artificial Intelligence

Increase learning rate and build robustness in future predictions.

Model maintain:

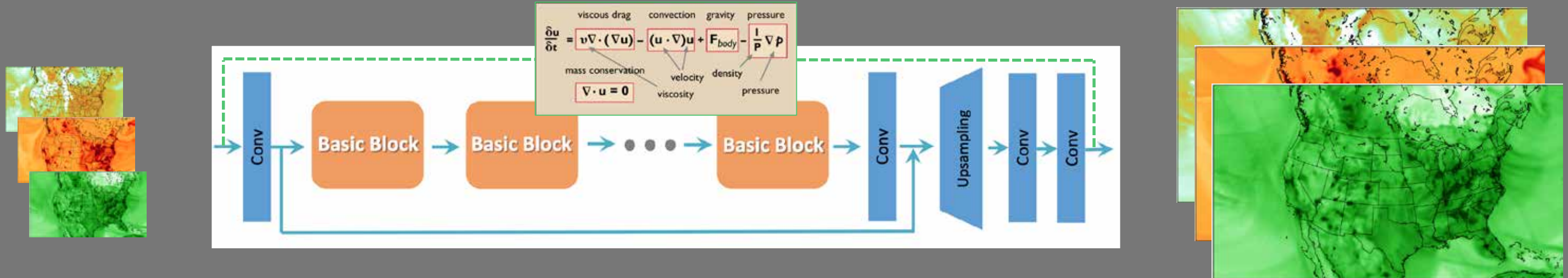
- fidelity to the data
- the predictions must satisfy at conservation laws of physics
- Integrate explainability through physical laws



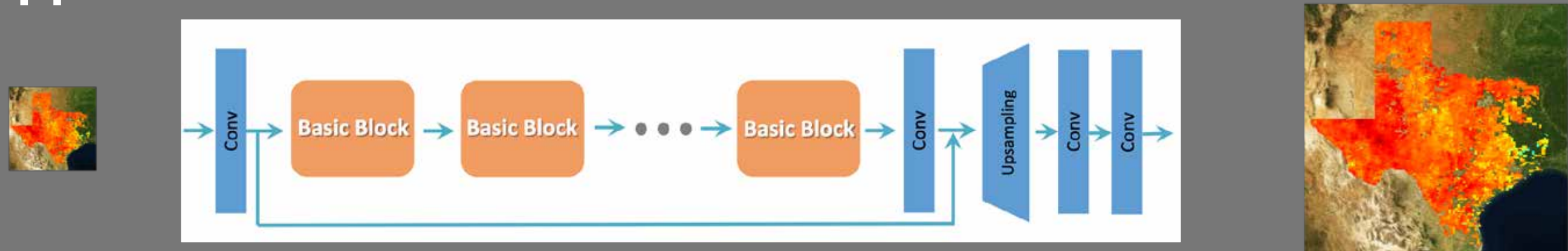
Data generation

- Simple plume simulation
- ERA5 weather data
- NASA GMAO Composition Forecast (https://fluid.nccs.nasa.gov/cf/classic_geos_cf/)

PIAI model training

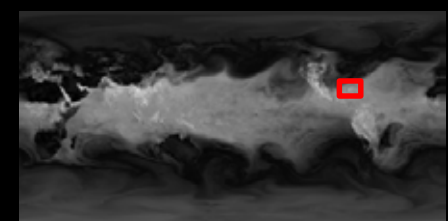
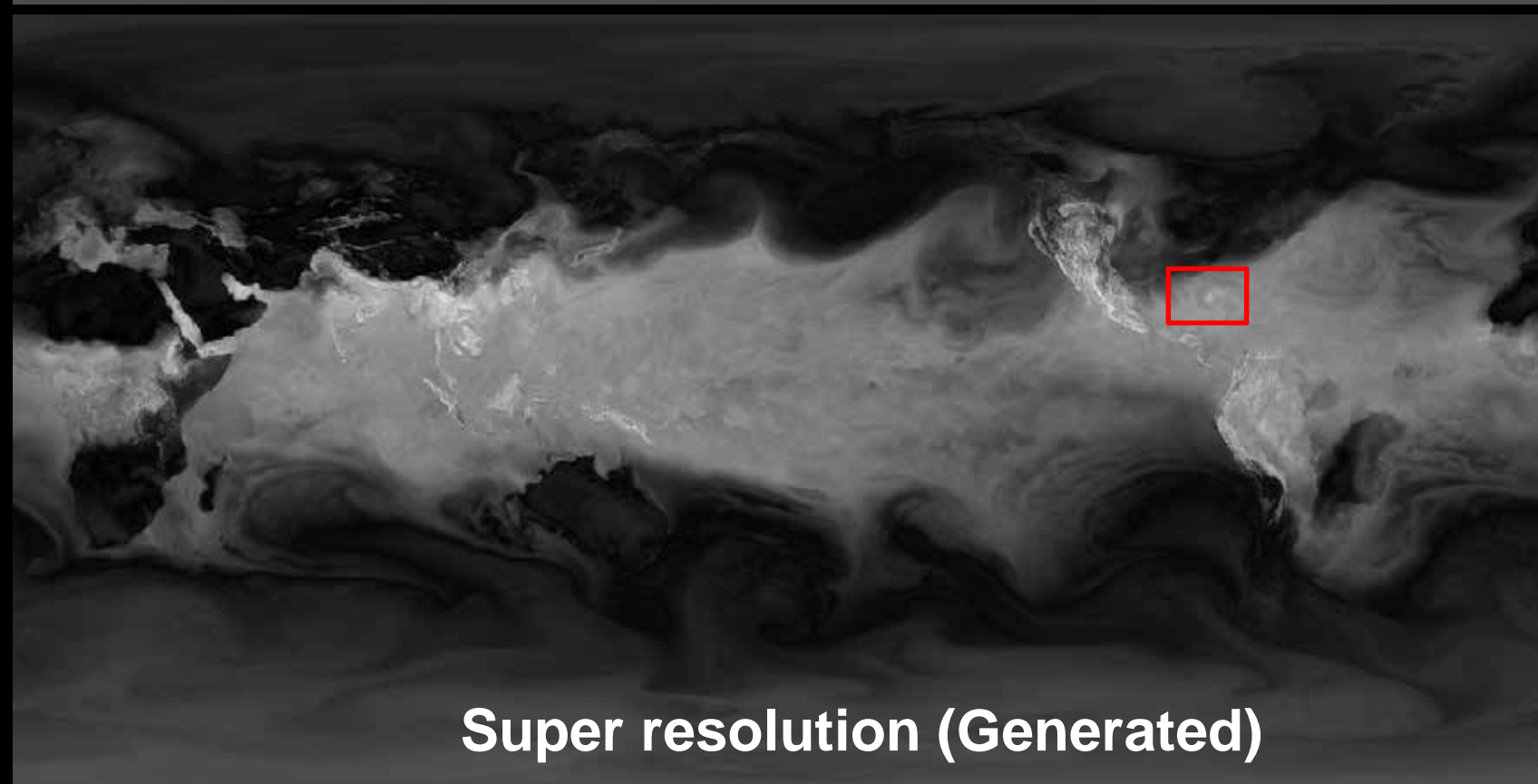
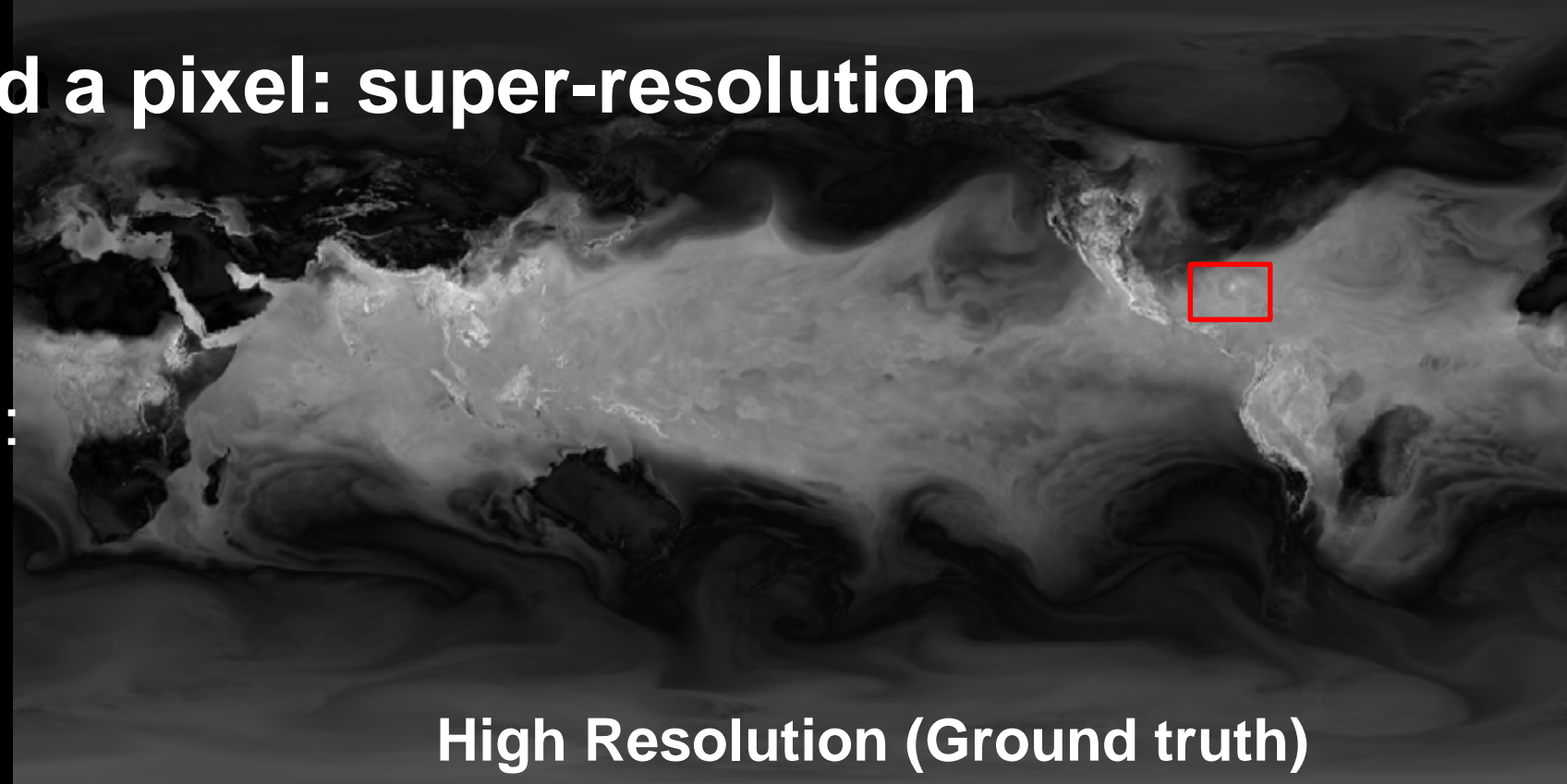


Application

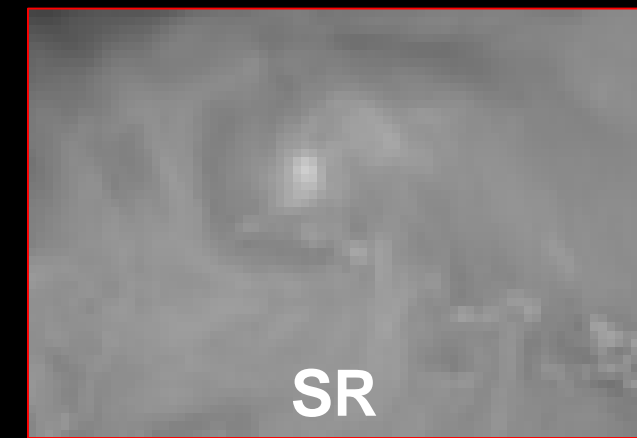


Seeing beyond a pixel: super-resolution

Physics Constraints:
-Bernoulli equation
-surface friction
-Navier-Stokes
equation...

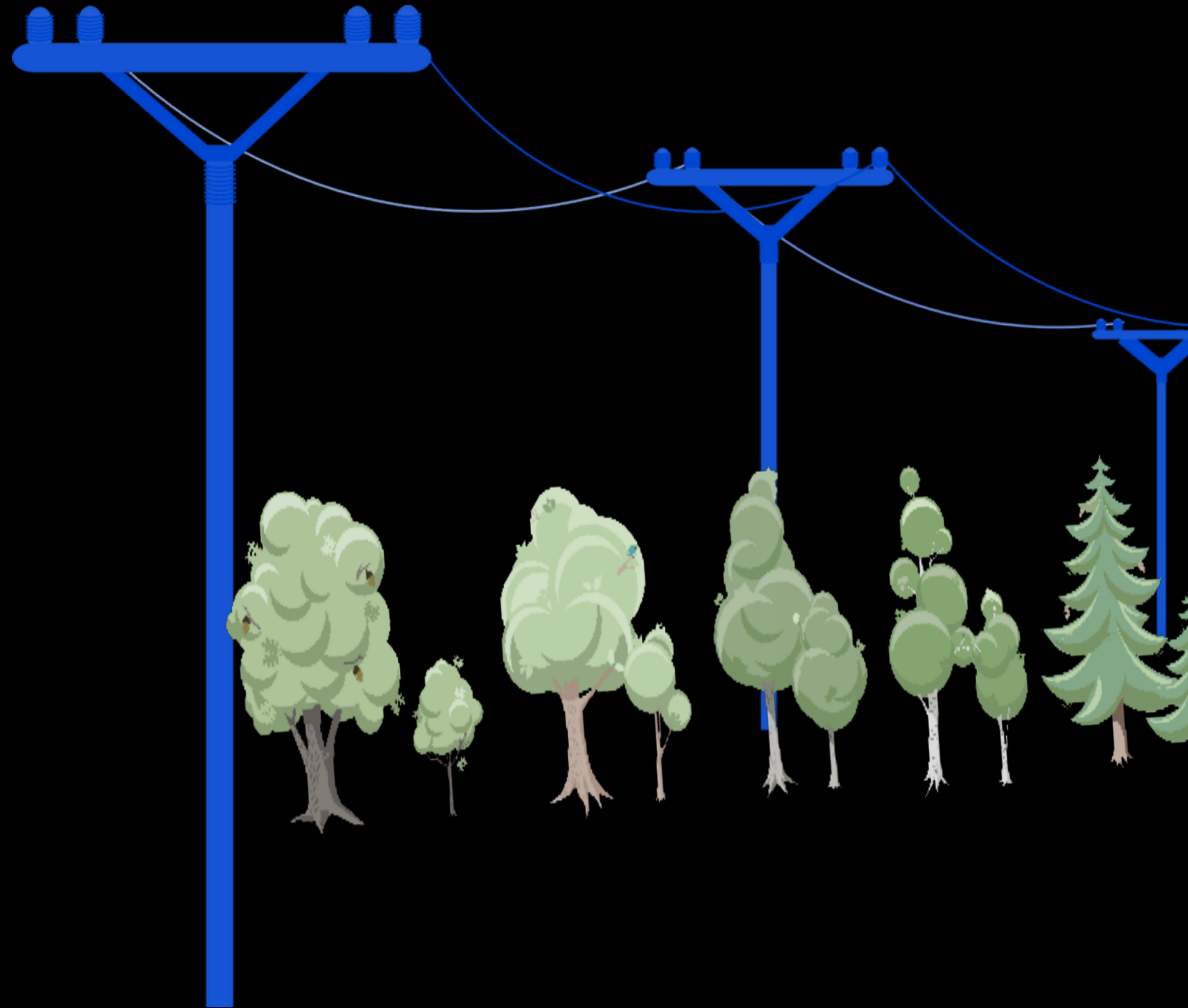


Low Resolution
(Input)



Vegetation and Land Use Mapping

***Prevent
power outages
and wildfires***



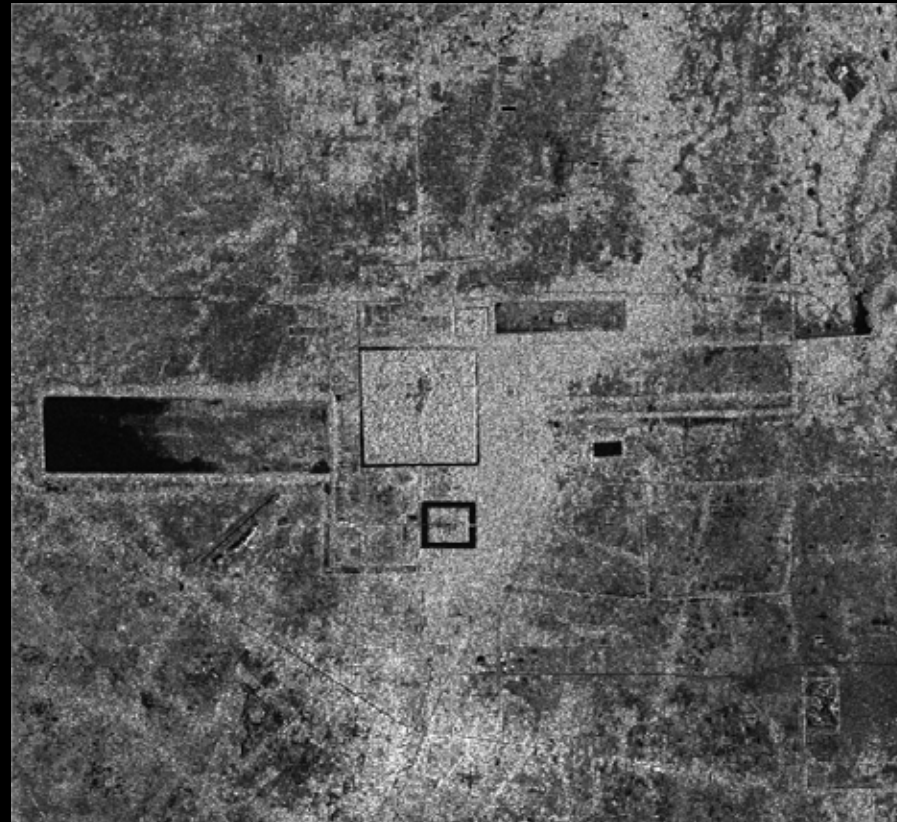
Multidimensional Data

Optical satellites (2D)



- Land classification
- Delineate trees vs grass

Synthetic Aperture Radar (2.5D)



- Change detection
- Classification

Lidar (3D)

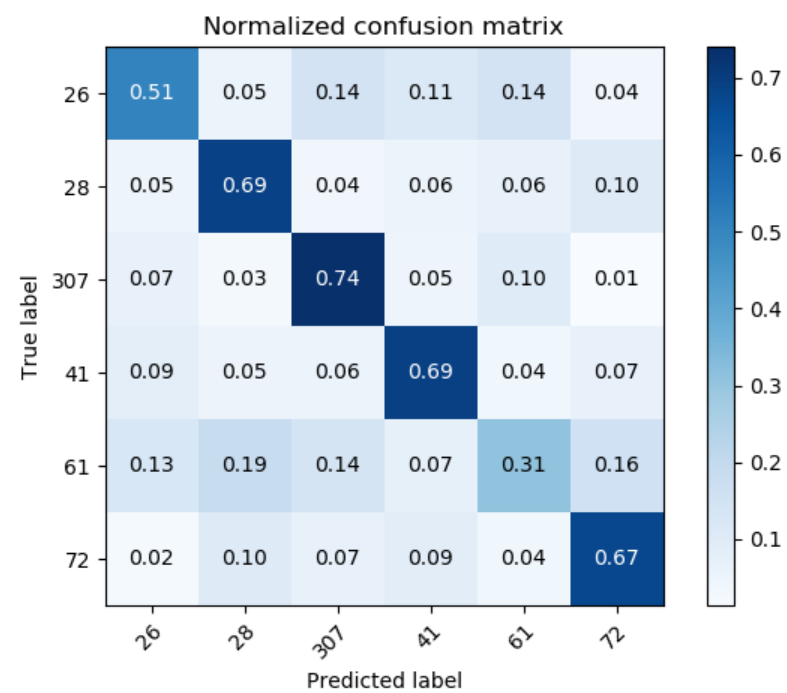


- Height calculations
- Object identification
(power lines, vegetation)

Tree species recognition

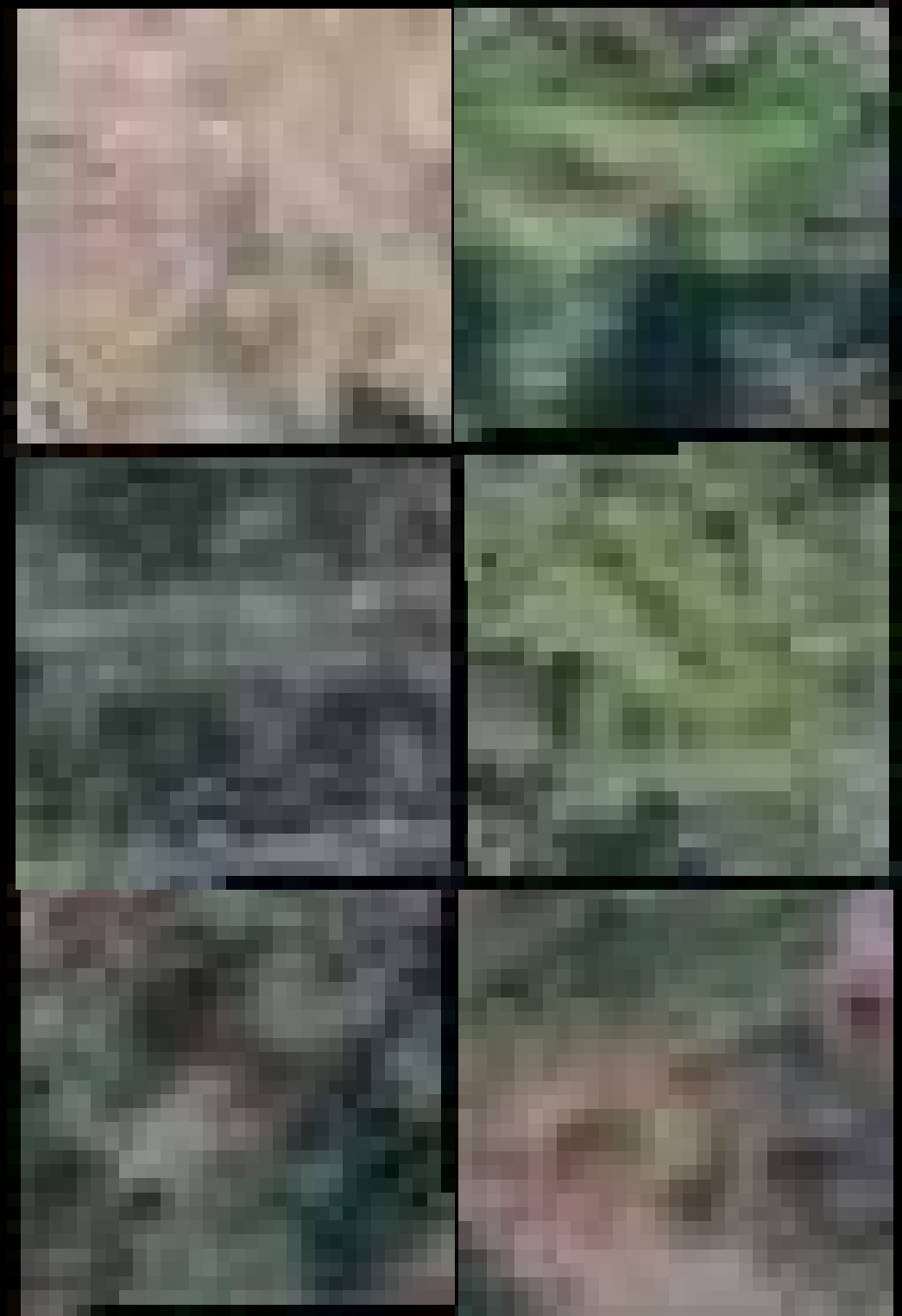
Tree classes – 6

Class	Num
26	17743
28	5014
307	14544
41	3854
61	3990
72	4697

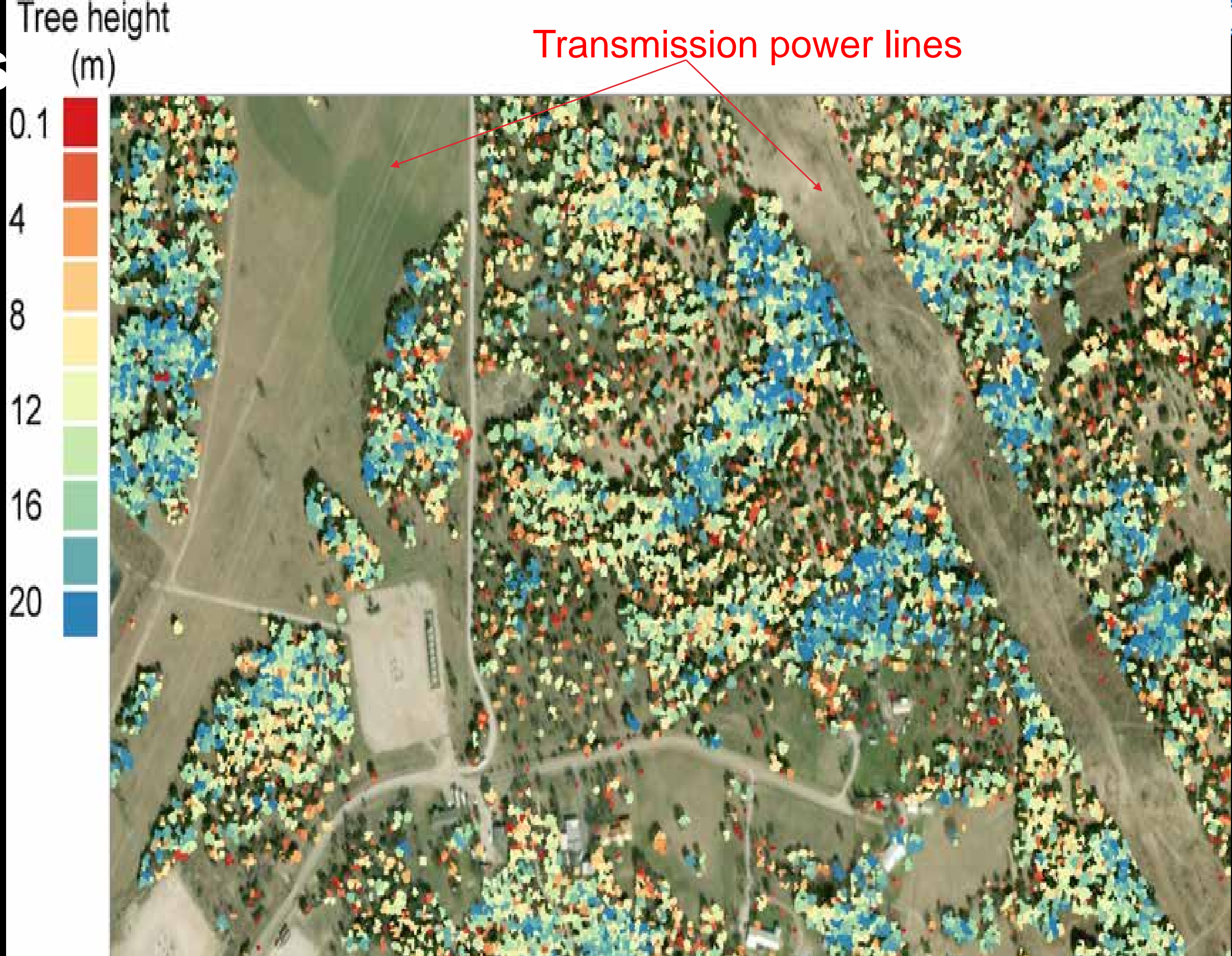


Confusion Matrix

Sample Images



Tree species and tree health detection from multi dimensional data



**Isolate
Vegetation
from satellite
and Lidar Data
around power
lines**

**Minimize
outage
prediction**



Conclusion

Data from the physical world is the fastest growing dataset allowing constant monitoring of Earth surface.

Combination of big data and AI provides unique opportunities:

- Big data improves AI and AI can improve data.
- AI powered data can providing science-based decision support based on explainable models (example: emission source mitigation).
- Big Data and AI can enable the next big challenge : climate change and its local impact.

Participants

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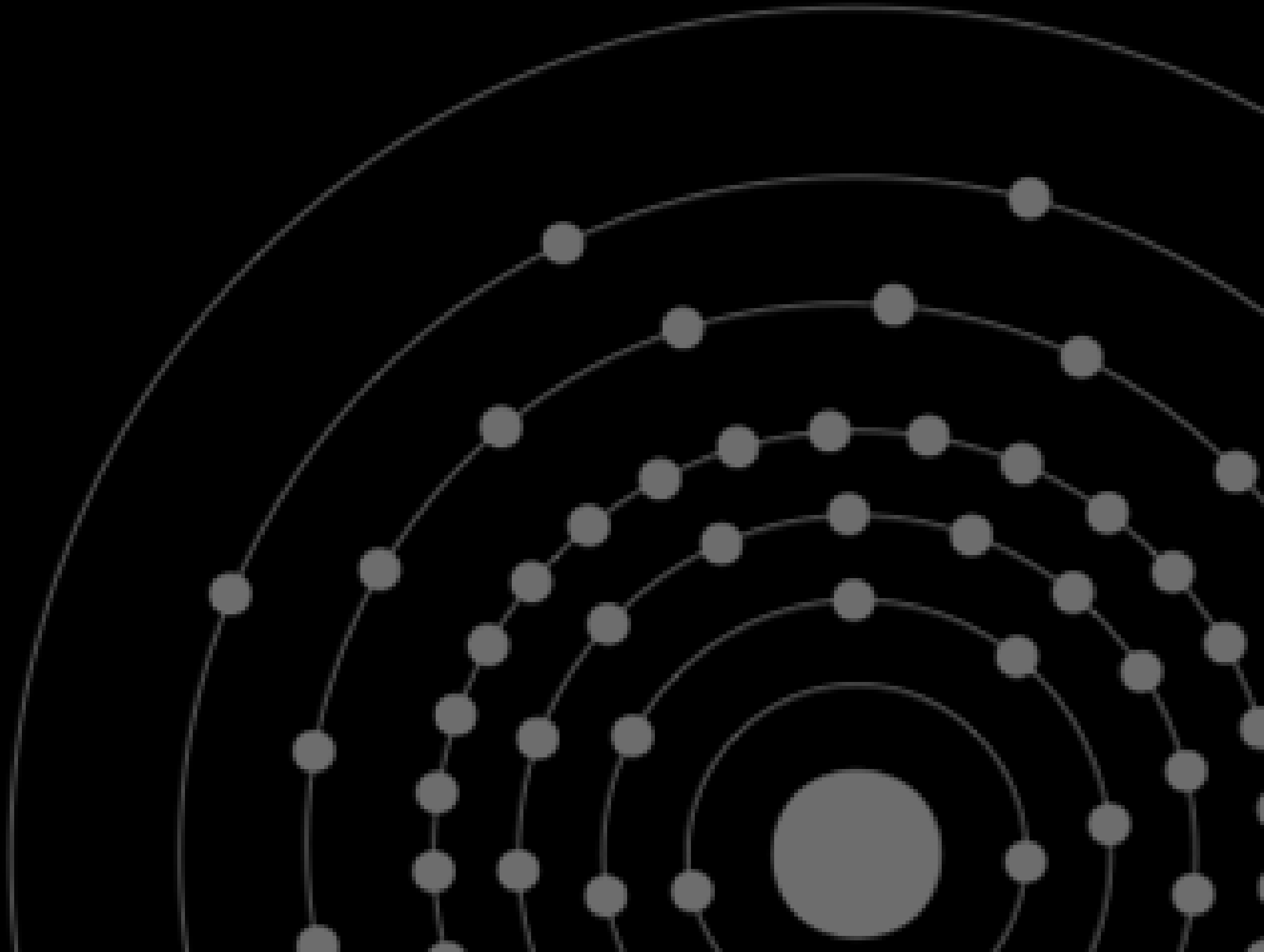
Wang Zhou

Siyuan Lu

Hendrik Hamann

Bruce Elmegreen....

IBM PAIRS team



ML that respects laws of physics (e.g. consistency model-data, convection, advection, mass and energy conservation)

