

Urban Rainfall Modification as Future Water Resource Solutions

Dev Niyogi

University of Texas at Austin

Also representing UNESCO- UT City CoLab (Endorsed by WWRP) and
WCRP Atmospheric Urban Digital Twins (AUDT) / Digital Earth Lighthouse Activity

William Stamps Farish Chair Professor and UNESCO Chair on AI, Water, and Cities
University of Texas Extreme Weather and Urban Sustainability (TExUS) Lab

<https://texuslab.org/>

<https://utcitycolab.org/> <https://Niyogi.dev>

Email: happy1@utexas.edu

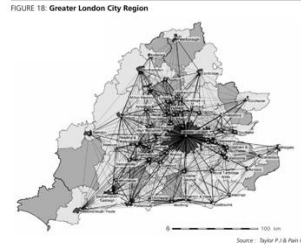
University of Texas at Austin

City

Civitas- organized community

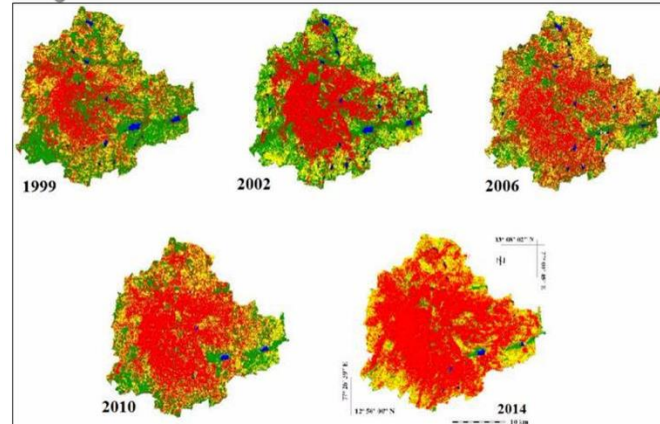


The Global City – New York's GDP was USD 2.63 trillion in 2009. Its economy is larger than some countries' national economy such as Italy, Spain, Canada, Russia, South Korea, Brazil, and India.
Photo © UN-HABITAT/X. Q. Zhang

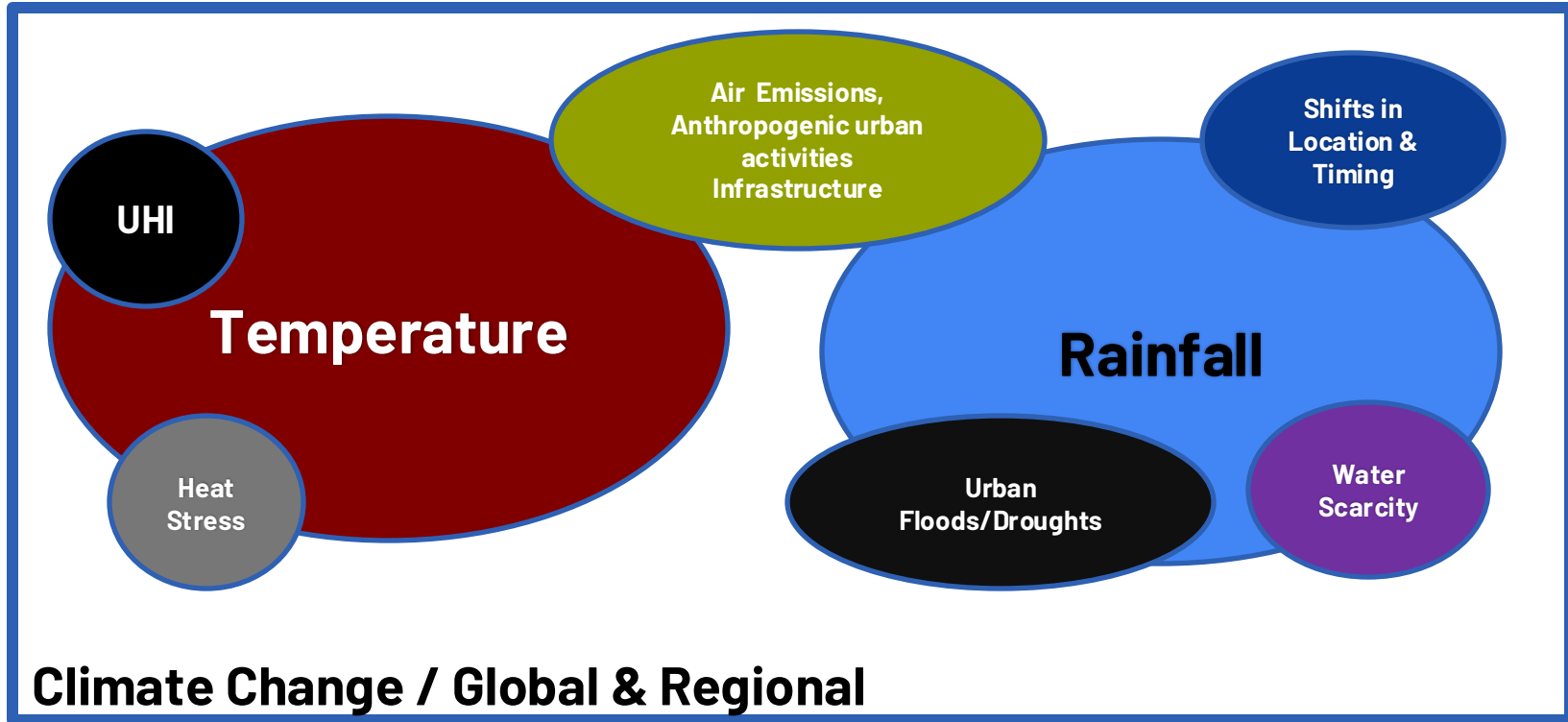


<http://atlasofurbanexpansion.org/cities/view/London>

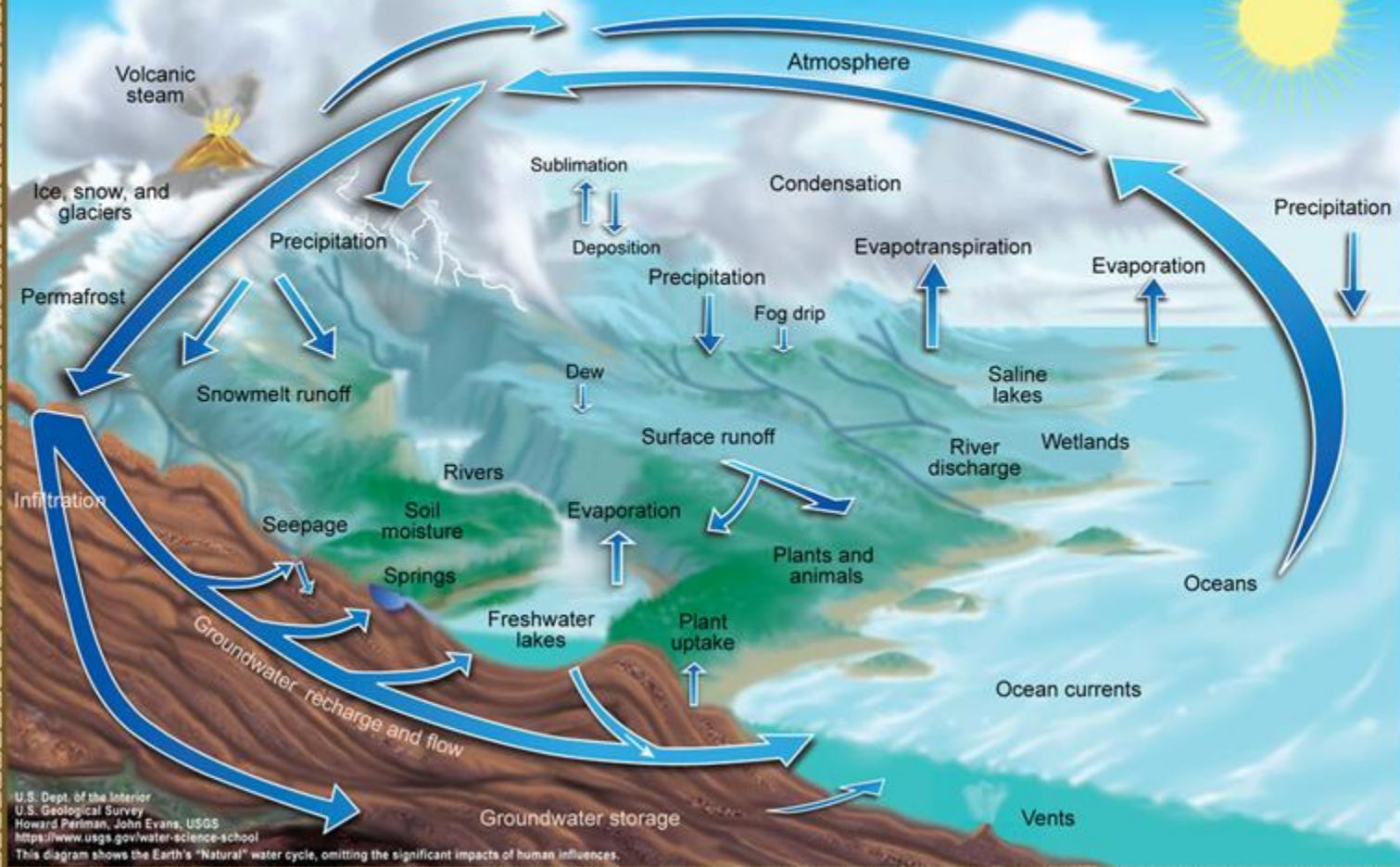
Bangalore city - Urbanization

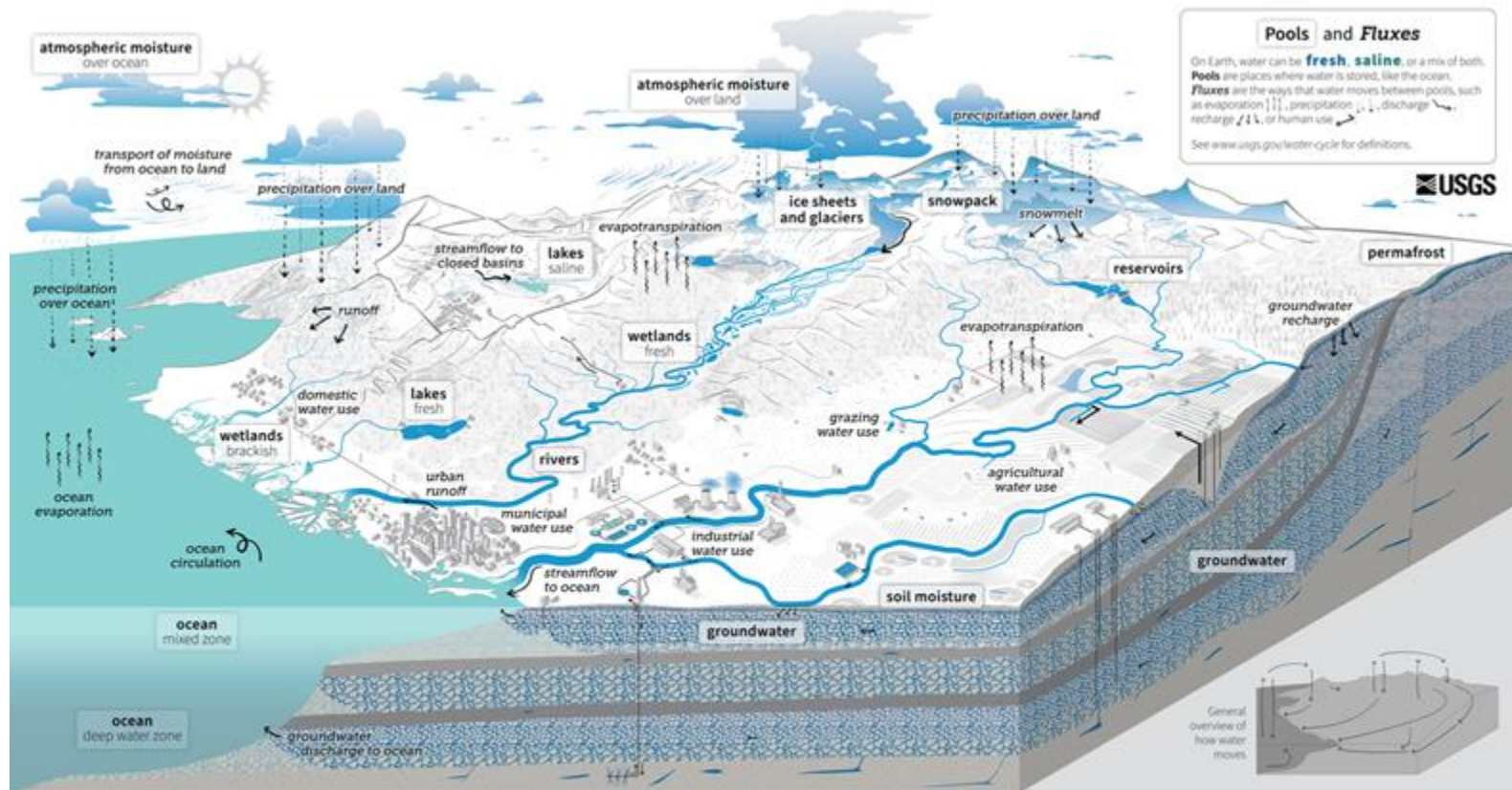


Conceptual diagram of emergent Urban Risks



The Water Cycle





The Water Cycle

The water cycle describes where water is found on Earth and how it moves. Water can be stored in the atmosphere, on Earth's surface, or below the ground. It can be in a liquid, solid, or gaseous state. Water moves between the places it is stored at large scales and at very small scales. Water moves naturally and because of human interaction, both of which affect where water is stored, how it moves, and how clean it is.

Liquid water can be fresh, saline (salty), or a mix (brackish). Ninety-six percent of all water is saline and stored in **oceans**. Places like the ocean, where water is stored, are called **pools**. On land, saline water is stored in **saline lakes**, whereas fresh water is stored in liquid form in **freshwater lakes**, artificial **reservoirs**, **rivers**, **wetlands**, and in soil as **soil moisture**. Deeper underground, liquid water is stored as **groundwater** in aquifers, within the cracks and pores of rock. The solid, frozen form of water is stored in **ice sheets**, **glaciers**, and **snowpack** at high elevations or near the Earth's poles. Frozen water is also found in the soil as **permafrost**. Water vapor, the gaseous form of water, is stored as **atmospheric moisture** over the ocean and land.

As it moves, water can transform into a liquid, a solid, or a gas. The different ways in which water moves between pools are known as **fluxes**. **Circulation** mixes water in the oceans and transports water vapor in the atmosphere. Water moves between the atmosphere and the Earth's surface through **evaporation**, **evapotranspiration**, and **precipitation**. Water moves across the land surface through **snowmelt**, **runoff**, and **streamflow**. Through infiltration and **groundwater recharge**, water moves into the ground. When underground, groundwater flows within aquifers and can return to the surface through **springs** or from natural **groundwater discharge** into rivers and oceans.

Humans alter the water cycle. We redirect rivers, build dams to store water, and drain water from wetlands for development. We use water from rivers, lakes, reservoirs, and groundwater aquifers. We use that water (1) to supply our **homes and communities**; (2) for **agricultural** irrigation and **grazing** livestock; and (3) in **industrial** activities like thermoelectric power generation, mining, and aquaculture. The amount of available water depends on how much water is in each pool (water quantity). Water availability also depends on when and how fast water moves (water timing), how much water is used (water use), and how clean the water is (water quality).

Human activities affect **water quality**. In agricultural and urban areas, irrigation and precipitation wash fertilizers and pesticides into rivers and groundwater. Power plants and factories return heated and contaminated water to rivers. Runoff carries chemicals, sediment, and sewage into rivers and lakes. Downstream from these types of sources, contaminated water can cause harmful algal blooms, spread diseases, and harm habitats. **Climate change** is also affecting the water cycle. It affects water quality, quantity, timing, and use. Climate change is also causing ocean acidification, sea level rise, and extreme weather. Understanding these impacts can allow progress toward sustainable water use.



Domestic



Recreation



Mining



Livestock



Hydropower



Forestry



Public supply



Industrial



Fracking



Thermoelectric Power



Aquaculture



Irrigation



Science to Engineering Solutions

How to move from science to engineering?

Continued understanding of processes and scale interactions

- offer sustained evidence
- “similar to pharma drug discovery”

Principles of early drug discovery

[JP Hughes](#),¹ [S Rees](#),² [SB Kalindjian](#),³ and [KL Philpott](#)³

► [Author information](#) ► [Article notes](#) ► [Copyright and License information](#) ► [PMC Disclaimer](#)

Associated Data

► [Supplementary Materials](#)

Abstract

[Go to:](#) ►

Developing a new drug from original idea to the launch of a finished product is a complex process which can take 12–15 years and cost in excess of \$1 billion. The idea for a target can come from a variety of sources including academic and clinical research and from the commercial sector. It may take many years to build up a body of supporting evidence before selecting a target for a costly drug discovery programme. Once a target has been chosen, the pharmaceutical industry and more recently some academic centres have streamlined a number of early processes to identify molecules which possess suitable characteristics to make acceptable drugs. This review will look at key preclinical stages of the drug discovery process, from initial target identification and validation, through assay development, high throughput screening, hit identification, lead optimization and finally the selection of a candidate molecule for clinical development.

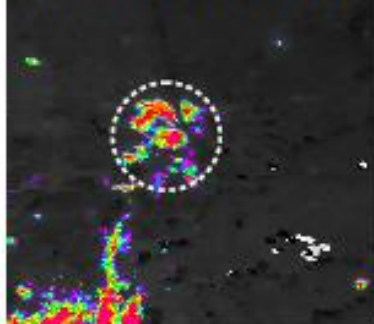
Keywords: drug discovery, high throughput screening, target identification, target validation, hit series, assay development, screening cascade, lead optimization

**12- 15
years!**

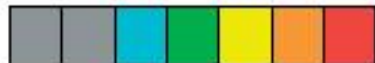
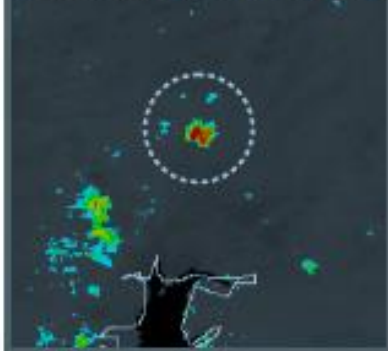
Likely similar time period
needed for science to
implementation to regional /
engineering solutions in our
domain

Nighttime

New Delhi [28.5 N, 77.2 E]



Ahmedabad [23.0 N, 72.7 E]



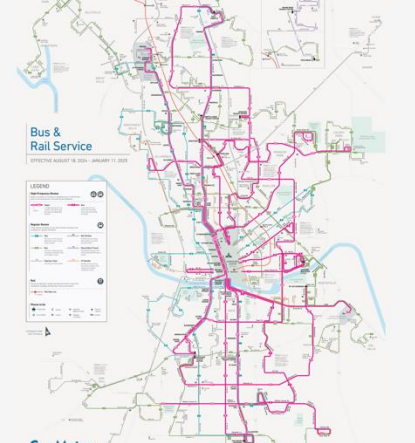
<27

28

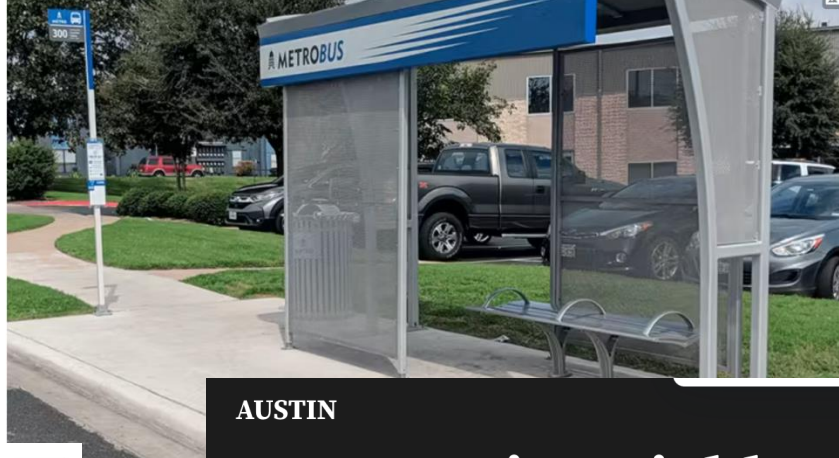
29

30°C

How can we Speed-up “Disruption” or R20 in
Urban Weather and Climate Sciences?



transportation



AUSTIN

East Austin neighbor says CapMetro bus stop needs more shade coverings; officials say they're working on it

by: Candy Rodriguez

Posted: Jul 15, 2022 / 09:50 AM CDT

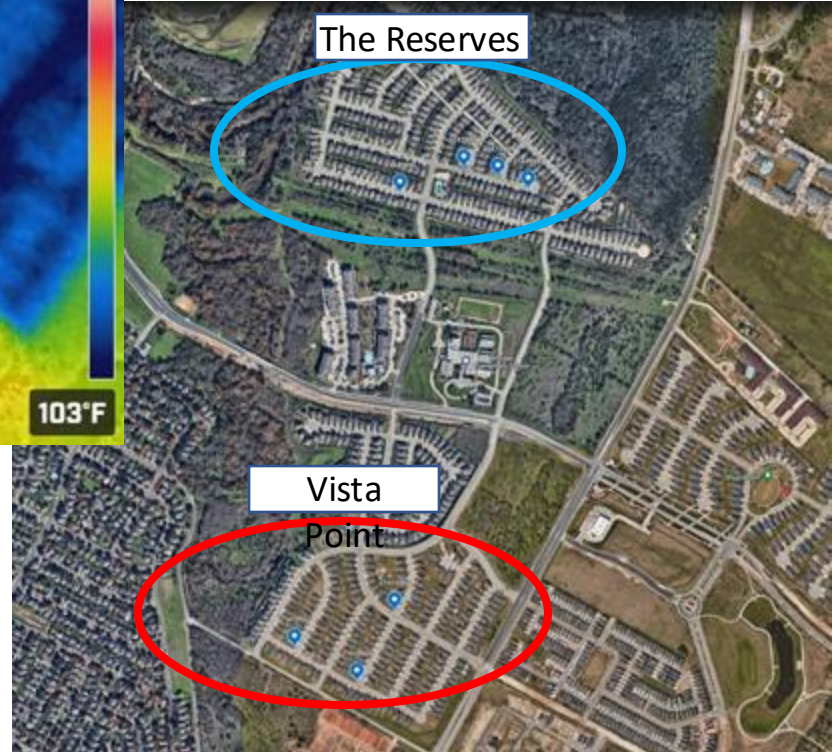
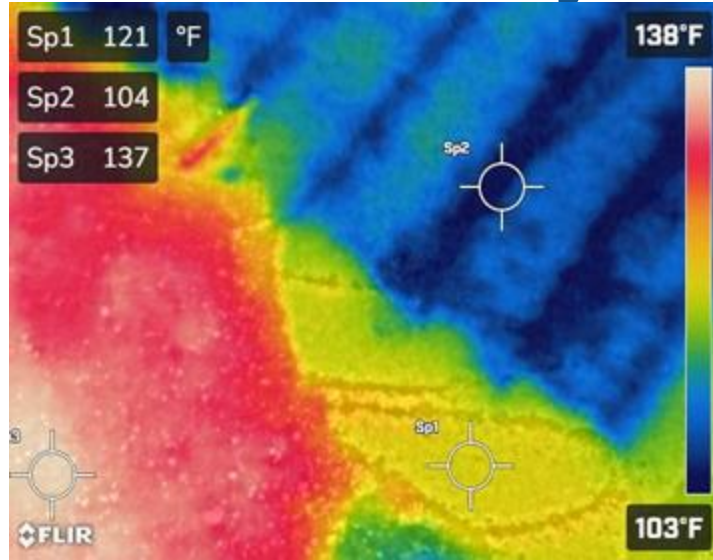
Updated: Jul 15, 2022 / 10:37 AM CDT



<https://www.kxan.com/news/local/austin/east-austin-neighbor-says-capmetro-bus-stop-needs-more-shade-coverings-officials-say-theyre-working-on-it/>

https://www.reddit.com/r/sanantonio/comments/w33994/the_bus_stops_in_this_city_are_sad_one_has_no/

Cool Pavement Priority



Atmospheric And Urban Digital Twins

- AUDTs are digital twins that capture the dynamic interplay between the urban scape and atmospheric elements.
- UTwin is a digital twin of the UT Austin campus.
- It provides historic and real-time energy use data, as well as energy demand forecasts

NSF, DOE, Bentley
Systems, WCRP Digital
Earth Lighthouse
Activity



UTwin

THERMALSCAPE of Austin

tinyurl.com/colabthermalvr



Paris 2024 Research Demonstration Project



Experimental Forecasts from UT Austin: Jackson School of Geosciences/TACC Lab

This is an experimental/research model study. The model runs are on TACC compute resources at UT. This experimental forecast is not for public advisory or use in any decision making and is only updated here for the lab and project teams to test the models. No liability is assumed. The official forecasts are available from NOAA/NWS: <https://www.weather.gov/par> and <https://www.weather.gov/par>.

TEXAS Geosciences
The University of Texas at Austin
School of Geosciences

ABOUT RESEARCH ACADEMIES

HOME NEWS UT RESEARCH LABS IN TACC

UT Scientists Use AI to Forecast Weather at Paris Olympics

JULY 29, 2024

Twitter Facebook LinkedIn

The 2024 Paris Olympics are in full swing. While the world's eyes are on the athletes, event organizers are keeping a close watch on something else: the weather.

A University of Texas at Austin research team led by Professor Dev Niyogi and distinguished postdoctoral fellow Manmeet Singh, is assisting on that front by using AI tools to provide a daily forecast of weather conditions in Paris.

The forecast includes the usual rain chance, wind speed, temperature and humidity, as well as a



The screenshot shows the Research Demonstration Project Paris 2024 Olympics website. The header includes the title 'Research Demonstration Project Paris 2024 Olympics' and a navigation bar with links: Home, About RDP, Science Questions, Communications, Meetings, Data, and Interconnection. The main content area has a 'Home' section with the following text: 'The strategic objective of the Research Demonstration Project (RDP) is to focus on the Olympic Games of Paris in 2024 in order to advance meteorological research on the theme of the "future Weather Forecasting systems at 100m (or finer) resolution for urban areas". Such systems would prefigure the numerical weather prediction at the horizon 2030.' Below this, it states: 'The international research team is composed of meteorological services and universities of many countries, including Canada, China, USA, United Kingdom, Sweden, France, Australia, Austria, Japan. The RDP is endorsed by the World Weather Research Program of the World Meteorological Organization (WMO), the special agency of the United Nations for weather, climate and water. It is also supported by the GURME (Global Atmospheric Watch Urban Research Meteorology and Environment) project, also from WMO.' At the bottom, there is a row of logos: METEO FRANCE, CIRM, CNRS, WMO, WWRP (World Weather Research Programme), and GURME.

OBSERVER

BUSINESS | FINANCE | TECH | MEDIA | LIFESTYLE | ARTS | ENT

BUSINESS - MEDIA

Scientists Are Using A.I. to Forecast Weather at the Paris Olympics

Scientists at the University of Texas at Austin are forecasting weather conditions at the summer games in Paris with the help of A.I. tools.

By Alexandra Brummett, Property, 07/29/24, 10:00am

1 2 3 4



taccutexas 07/29/2024

A UT Austin research team led by Dev Niyogi and Manmeet Singh in [@geosciences](#) is using AI tools to provide a daily forecast of weather conditions at the Olympics in Paris. The test requires significant computing power, which is carried out by HPC systems at TACC.

Congratulations to the 30 Olympic athletes who are from [@taccutexas](#)

Learn more: [tacc.utexas.edu](#)

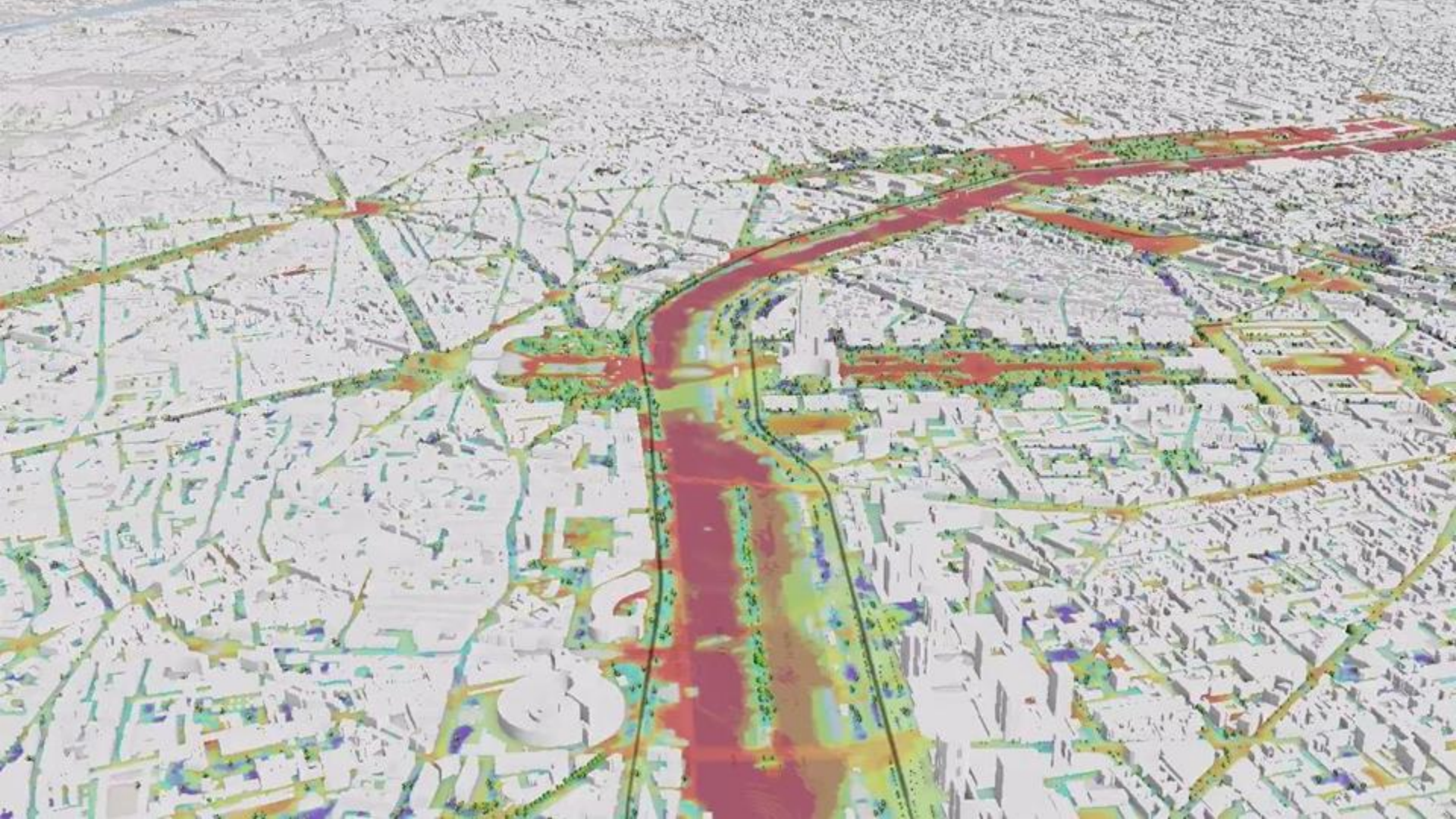
[paris2024](#) #olympics #whatstamazing #ai



only on twitter

UT Scientists Use AI to Forecast Weather at Paris Olympics

1 2 3 4



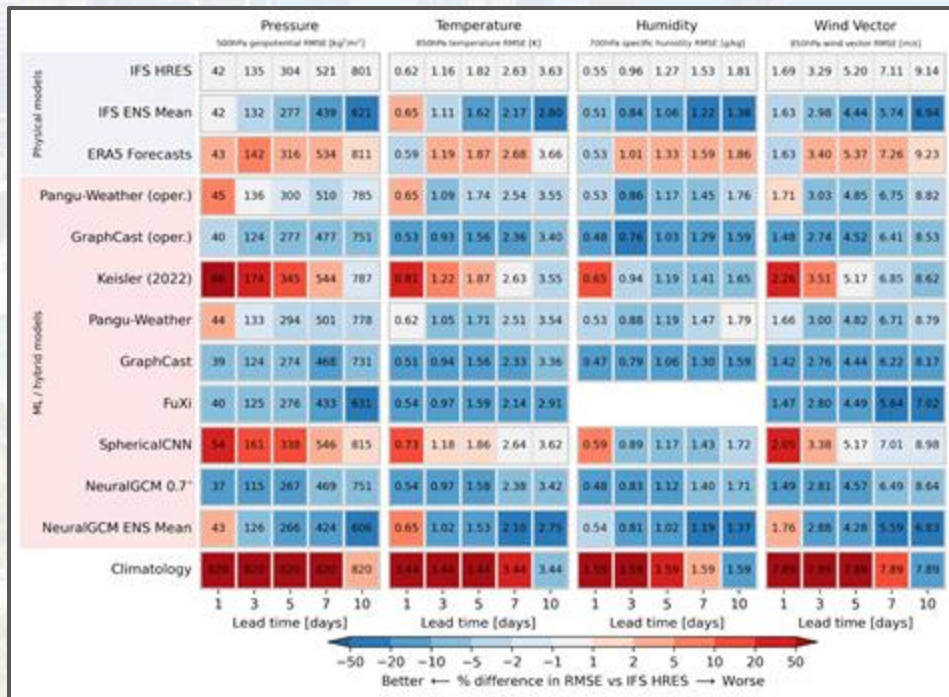
UT-HindCast: Google Graphcast based 45 year, global, hindcast Dataset from The University of Texas at Austin

Hindcast Generated from AI model (1979–2024)

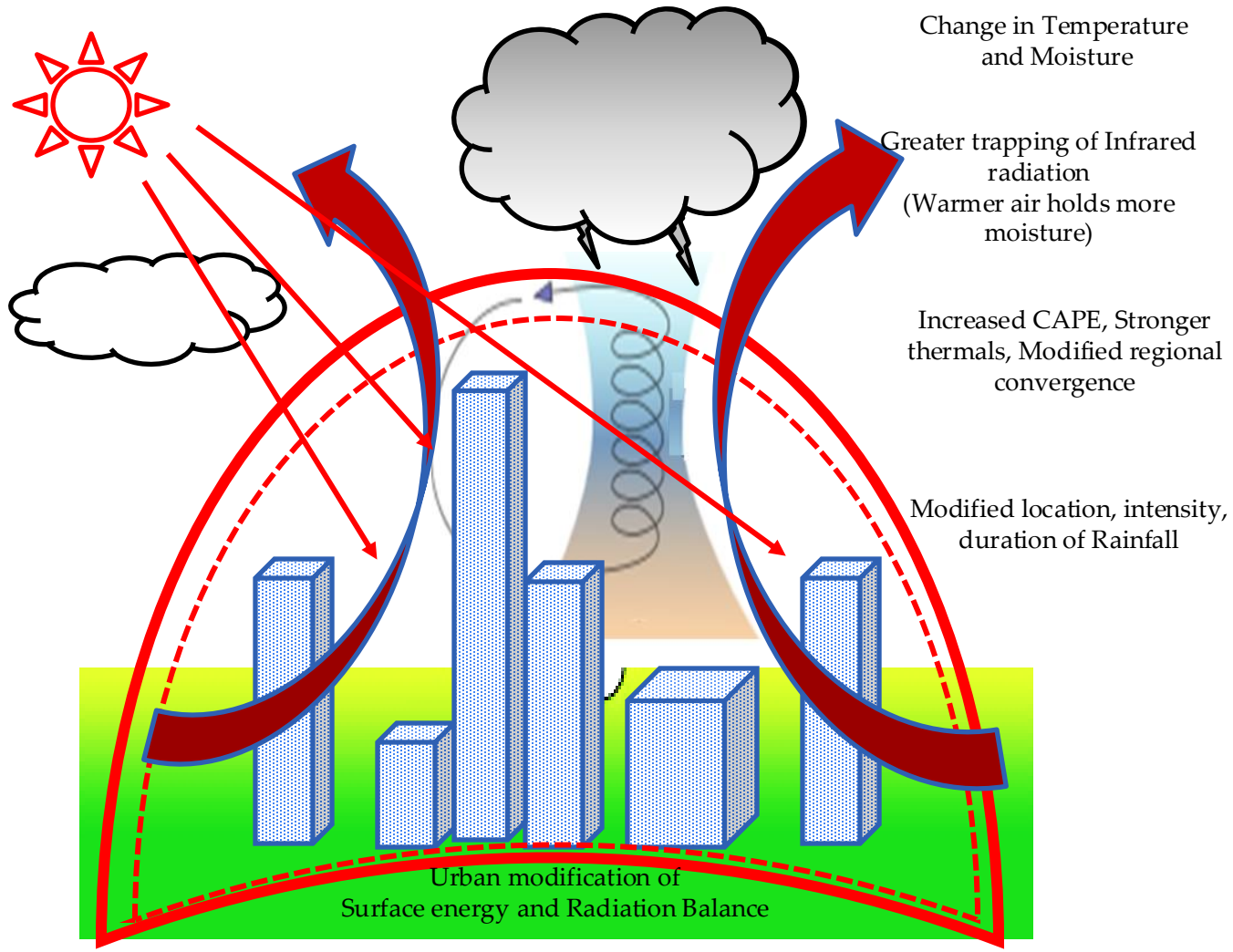
- Daily 15-day forecasts, initialized at 00 UTC ERA5.
- Produced at $0.25^\circ \times 0.25^\circ$ resolution (global).
- Uses Graphcast operational model

Computational Performance

- Texas Advanced Computing Center's NVIDIA H100 GPU.
- <4 minutes to complete a 15-day forecast.

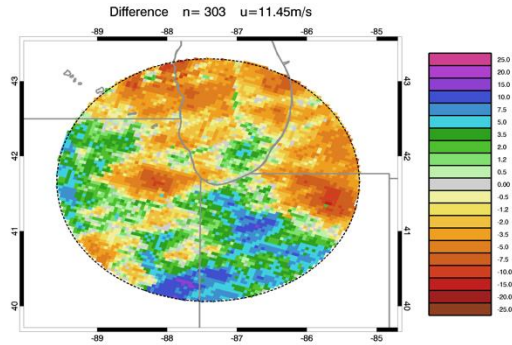


Performance of AI models (Source: weatherbench 2)
1979- 2017 global data
(Models have different resolutions)

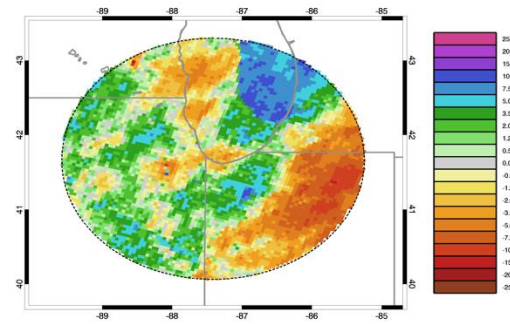


Chicago/ La Porte Observational Analysis (Reassessment with new knowledge and technology)

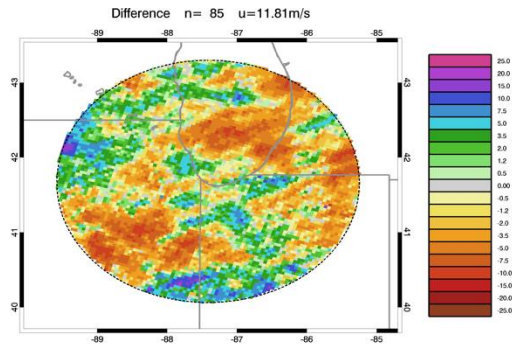
NW to SE moving → STRONG anomaly



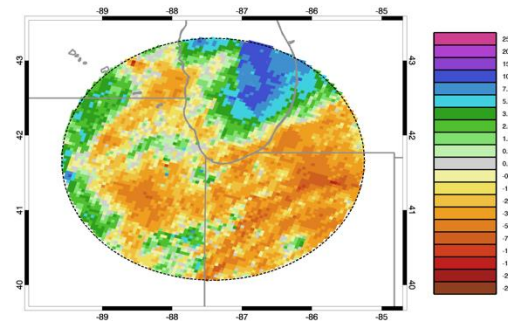
SW Wind Weekday → Anomaly present



W to E moving → weaker anomaly

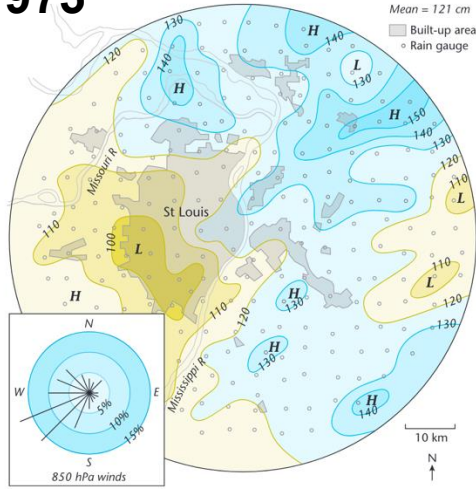


SW Wind Weekend → NO ANOMALY

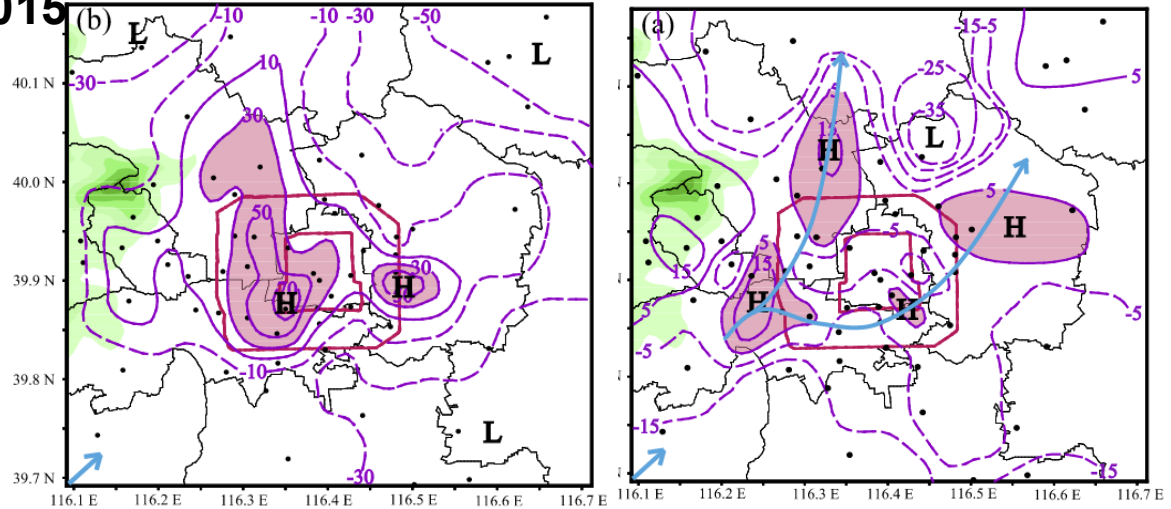


Urban Precipitation and Urban Heat are interlinked

1975



2015



High UHI

Low UHI

Huff et al., 1971–1975 Summary of METROMEX Volume 1

Dou et al., 2015 *Journal of Applied Meteorology and Climatology*

- Urban boundary layer (UBL) influence on convective precipitation has been studied for >50 years, but is under researched
- METROMEX (inland St. Louis): Urban modification *does* exist, combination of **urban heat island (UHI)**, **mechanical turbulence** by buildings, and/or industrial **aerosol production**
- Beijing (inland): urban precipitation is modulated by UHI intensity

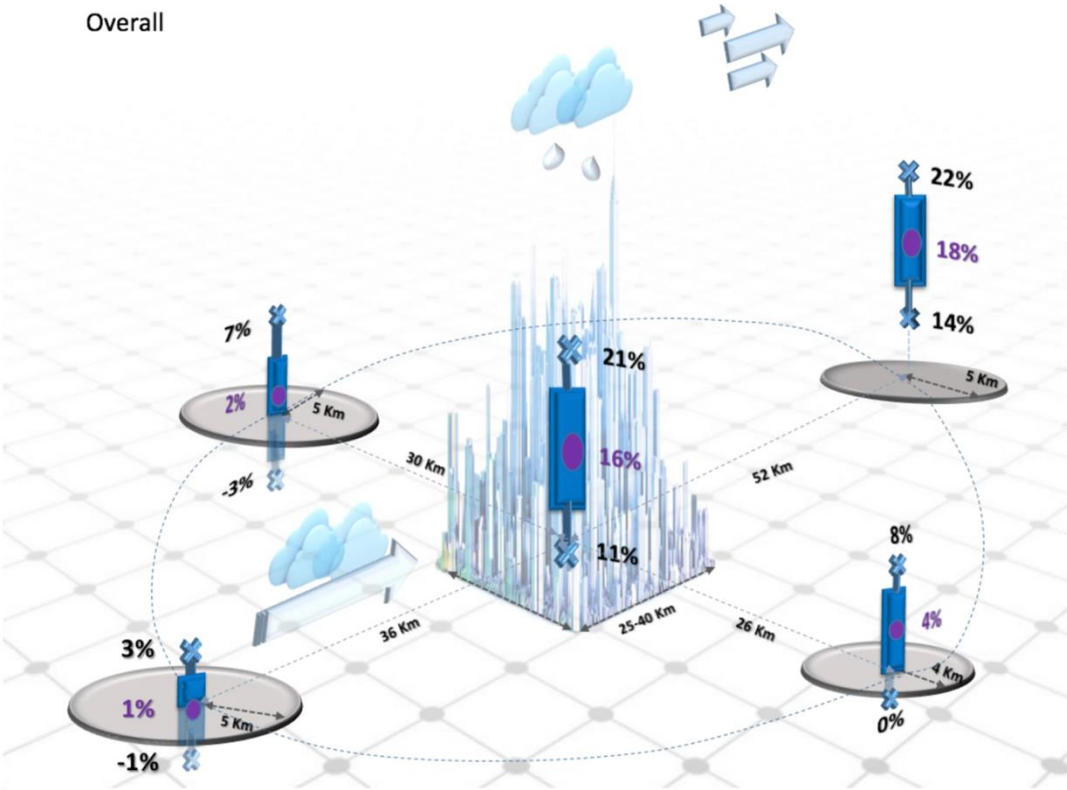
Meta-analysis of urbanization impact on rainfall modification

Jie Liu & Dev Niyogi

Scientific Reports 9, Article number: 7301 (2019) | Cite this article

Figure 2

From: [Meta-analysis of urbanization impact on rainfall modification](#)



Precipitation changes over urban areas and for surrounding landscape. The bars indicate the sample standard deviation for the precipitation change, and circles correspond to the mean change in precipitation location. On average, urban areas and the surrounding region experienced precipitation increases. The largest signal noted in a number of studies, was prominently in the downwind region of the city and experienced the highest rainfall change: 18% increase on average, (a range of 14 to 22% with one standard deviation). The distance over which these changes occurred (mostly increases in rainfall) is approximately 52km downwind, and about 31 to 41km upwind.

Global scale assessment of urban precipitation anomalies

Xinxin Sui^a, Zong-Liang Yang^b, Marshall Shepherd^c, and Dev Niyogi^{a,b,1}

Edited by Karen Seto, Yale University, New Haven, CT; received July 24, 2023; accepted June 7, 2024

September 9, 2024 | 121 (38) e2311496121

Significance

This research reports a global analysis of urban precipitation anomalies encompassing over one thousand cities worldwide. While earlier studies have focused on the impact of urbanization on precipitation for specific cities or isolated thunderstorm cases, our research breaks innovative ground by mapping global urban precipitation hotspots over the past 20 y. This study provides global evidence of noticeable urban precipitation anomalies, especially in hot and humid climates. Beyond the anticipated influence of local climate, our findings reveal that higher levels of urbanization enhance these urban precipitation anomalies. This research not only deepens our understanding of how cities shape precipitation but also establishes the groundwork for incorporating urbanization considerations into future precipitation projections.

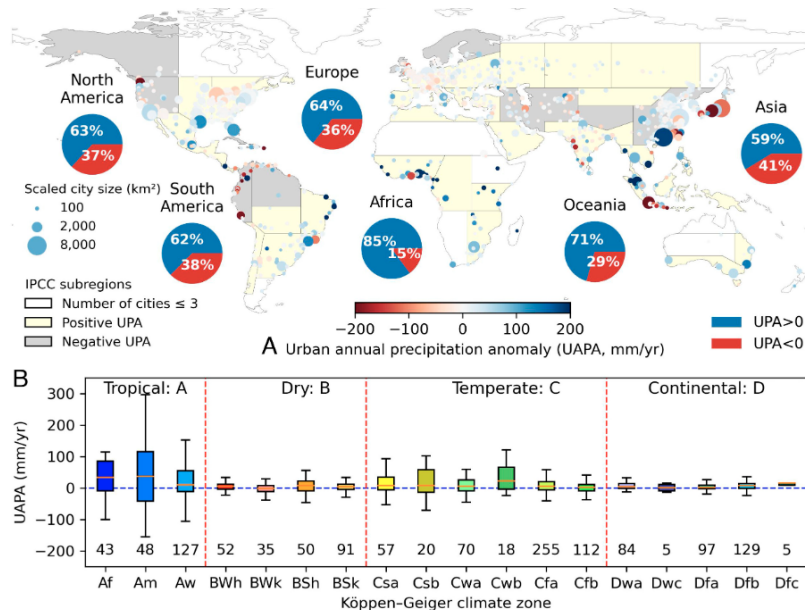


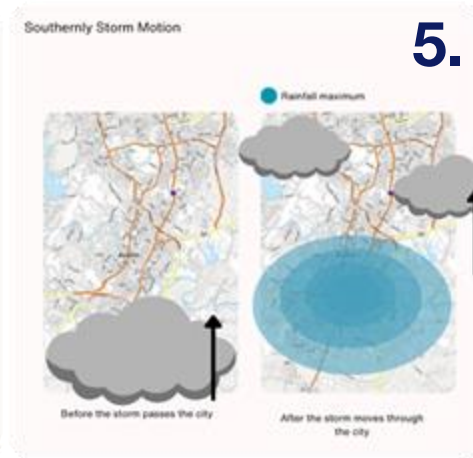
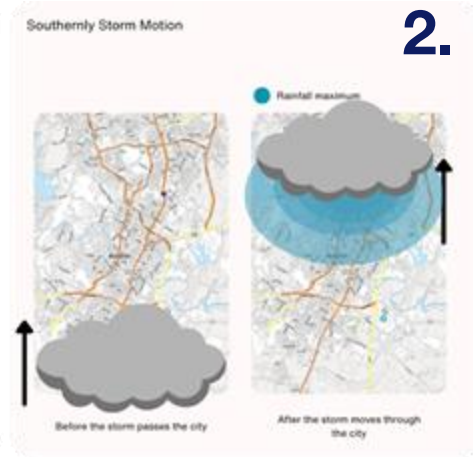
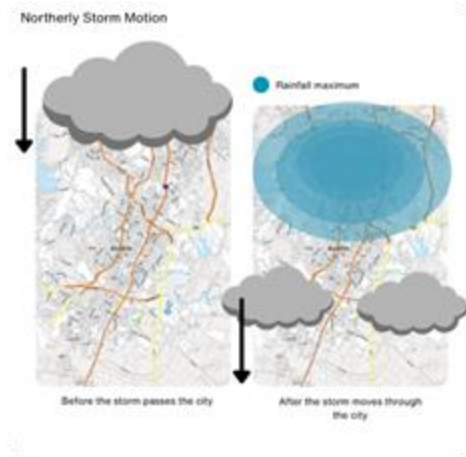
Fig. 1. Global urban annual precipitation anomalies. The urban annual precipitation anomalies according to continents and climate zones. (A) The color of the base map shows that the average of urban precipitation anomalies in the IPCC subregion is positive or negative. Each dot on the base map indicates one city, and the size and color of the dot describe the size and precipitation anomaly extent of the city. The pie charts show the percentage of cities with positive and negative (more or less precipitation over urban grids) urban precipitation anomalies in each continent (the pie charts for each IPCC subregion are shown in *SI Appendix, Fig. S15*). (B) The box plot for urban annual precipitation anomalies for cities in different climate zones. The numbers above the axis are the number of cities in that climate zone.

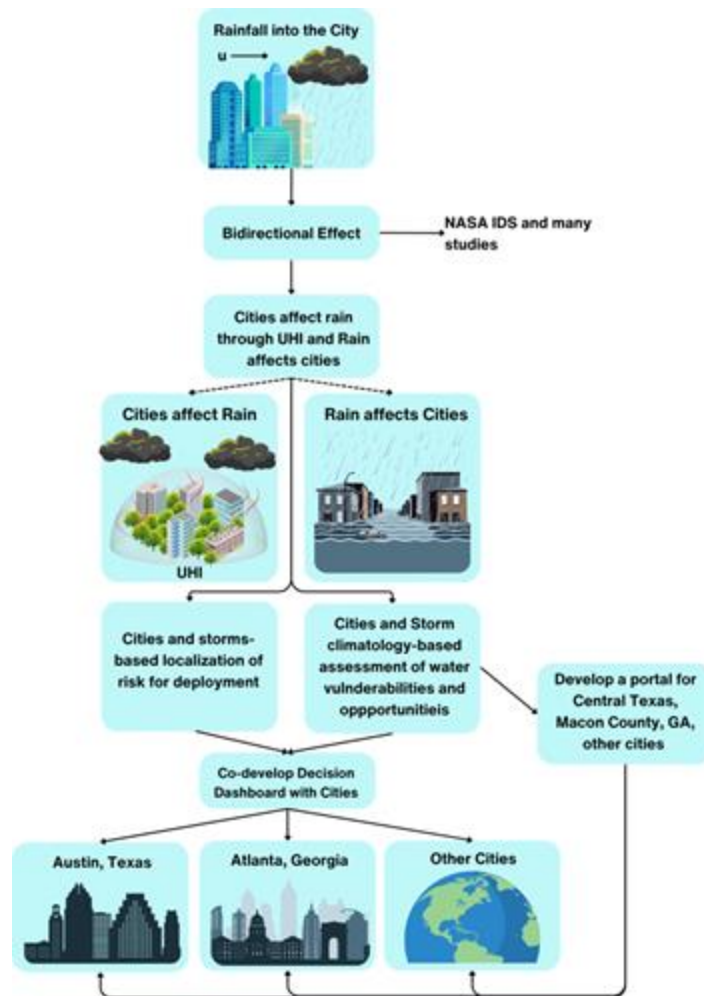
The Washington Post
Democracy Dies in Darkness

Environment Climate Weather Climate Solutions Animals Climate Lab Green Living

Why cities are getting more rainy

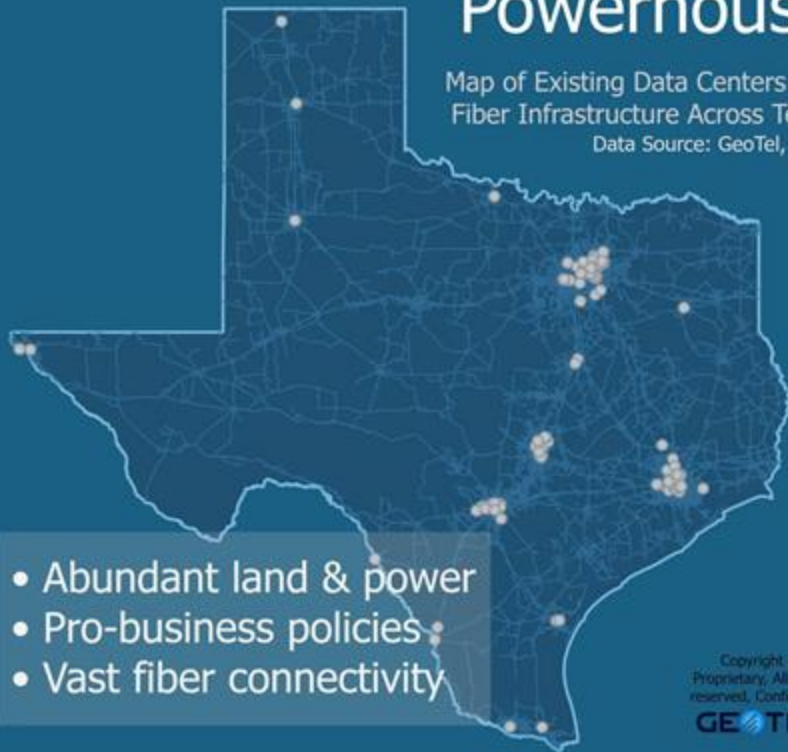
A study has found most cities receive significantly more rain than nearby rural regions, an effect that has become more pronounced over the past two decades.





Texas as a Data Center Powerhouse

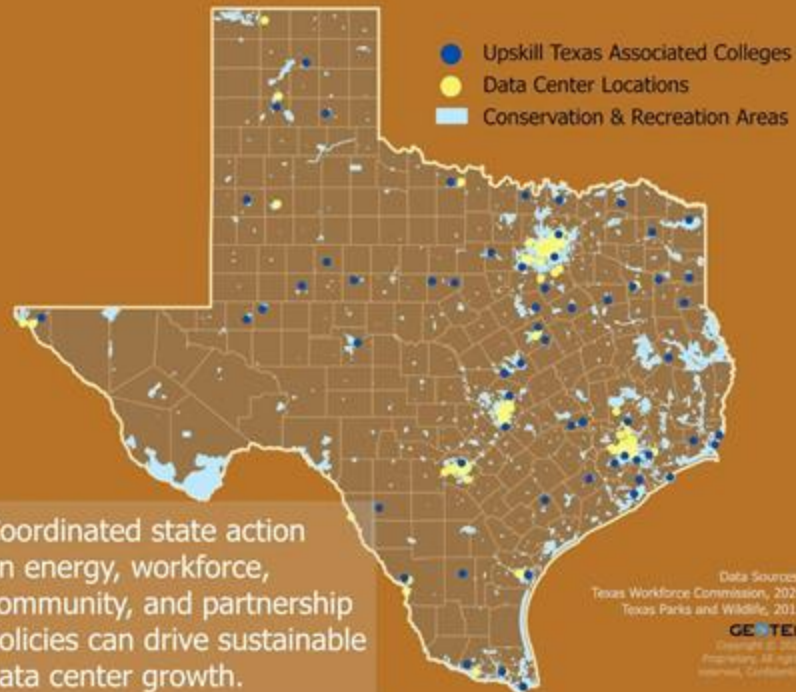
Map of Existing Data Centers and
Fiber Infrastructure Across Texas
Data Source: GeoTel, 2025



- Abundant land & power
- Pro-business policies
- Vast fiber connectivity

Copyright ©
Proprietary. All rights
reserved. Confidential
GEOTEL

Guiding Texas' Digital Growth

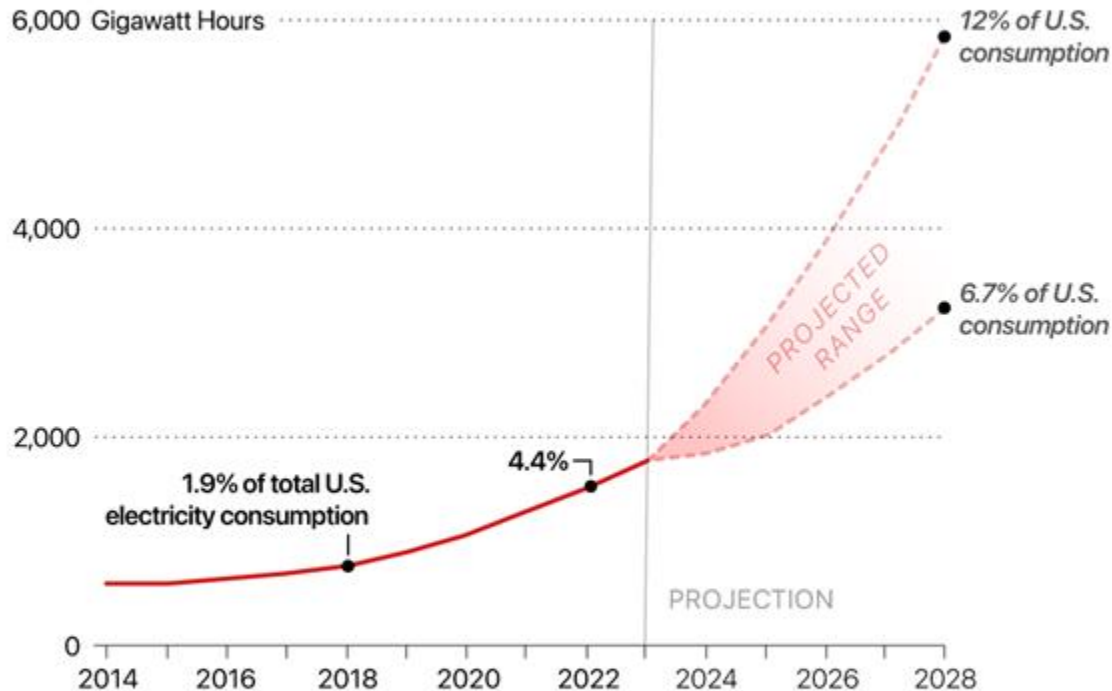


Coordinated state action
on energy, workforce,
community, and partnership
policies can drive sustainable
data center growth.

Data Sources:
Texas Workforce Commission, 2024
Texas Parks and Wildlife, 2012
GEOTEL
Copyright © 2025
Proprietary. All rights
reserved. Confidential

Data centers claiming a larger share of power use

TOTAL DATA CENTER ELECTRICITY CONSUMPTION



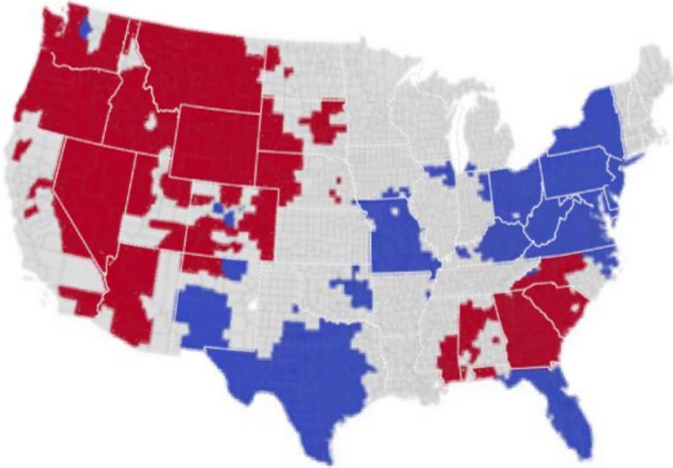
Source: 2024 United States Data Center Energy Usage
Report, Lawrence Berkeley National Laboratory

& the West

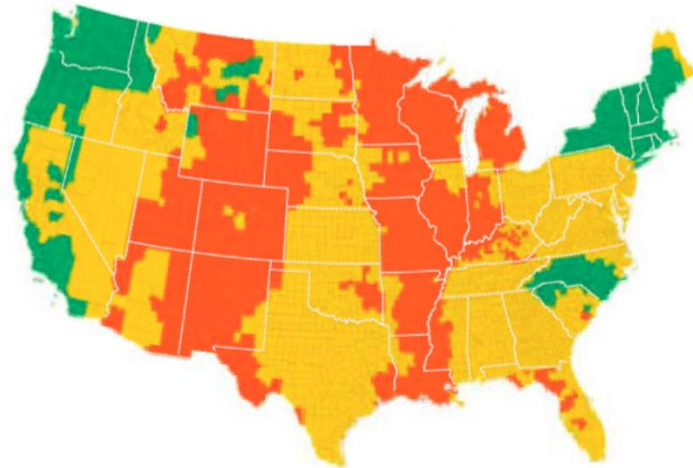
How much water use and pollution do data centers cause? Location matters.

Two measures of the intensity of resource-use by data centers look at factors associated with the electricity needed to power them. **Water consumption intensity** measures the quantity of water needed to cool the power stations sending electricity to the grid (thus it does not include water used to cool the servers themselves). **Greenhouse gas emissions intensity** reflects the type of power plant supplying the data center; fossil-fuel powered plants generate more planet-warming emissions in the process of creating electricity.

WATER CONSUMPTION INTENSITY (LITERS/KILOWATT HOUR)

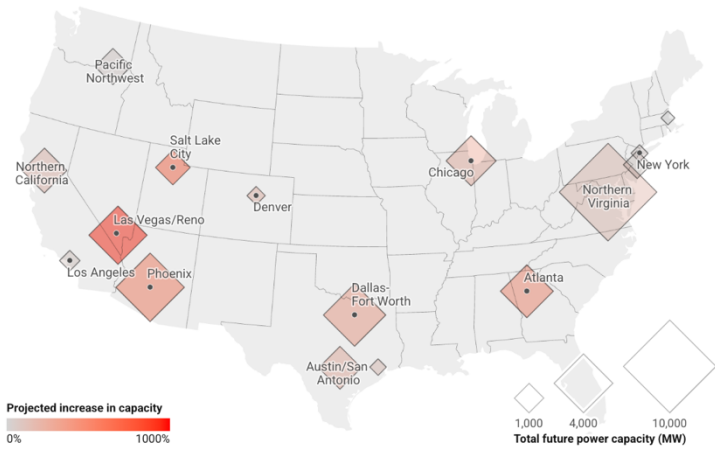


GREENHOUSE GAS EMISSIONS INTENSITY (KG/KILOWATT HOUR)



Data Center Hot Spots in the U.S.

Areas with fastest data-center growth and planned capacity



Map: & the West • Source: Upwind, JLL 2024 Data Center Report • Get the data • Download image • Created with Datawrapper

Future planned capacity relative to current capacity. Western areas are in bold

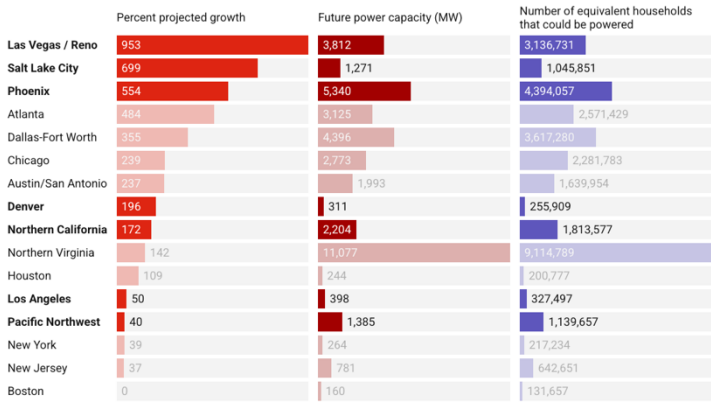


Chart: & the West • Source: EIA and JLL via Upwind • Get the data • Download image • Created with Datawrapper

Data centers in Quincy, Washington



Sources: Open Street Map (data centers); ESRI (aerial imagery);

& the West

It's not just electricity that is needed by these centers, which are now growing to

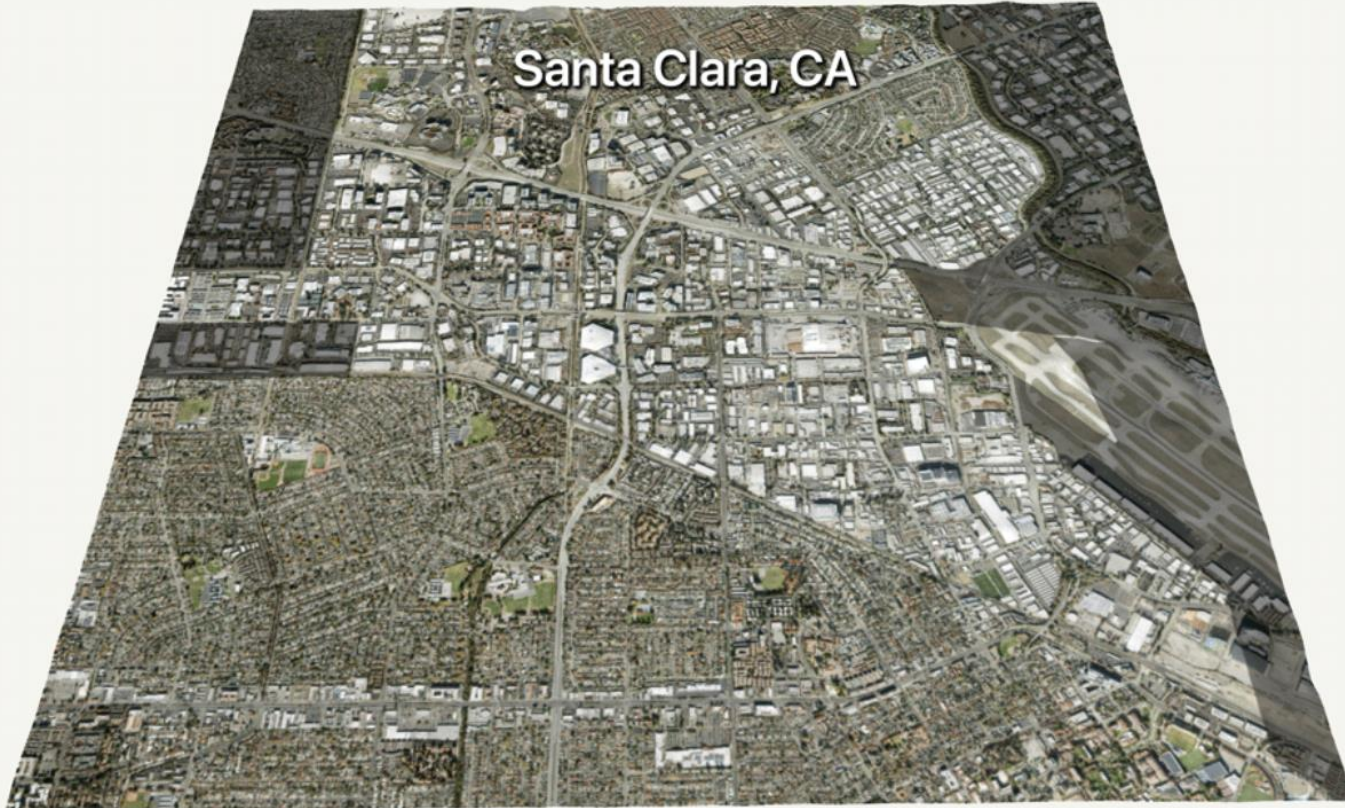
Data centers in Quincy, Washington



Sources: Open Street Map (data centers); ESRI (aerial imagery);

& the West

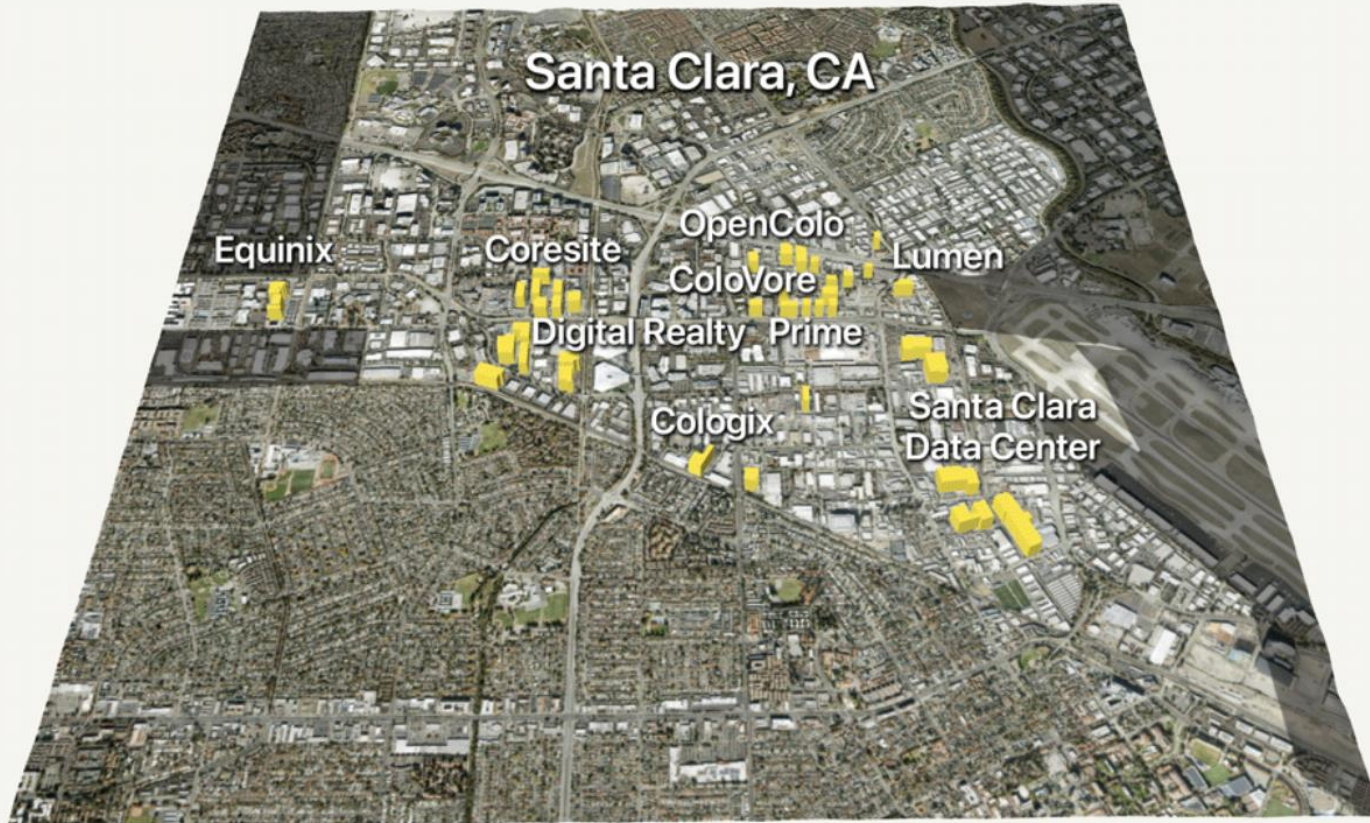
Data centers in Santa Clara, California



Sources: **Open Street Map** (data centers); ESRI (aerial imagery);

& the West

Data centers in Santa Clara, California



Sources: **Open Street Map** (data centers); ESRI (aerial imagery);

& the West

EXCLUSIVE ARTIFICIAL INTELLIGENCE [Follow](#)

A Giant New AI Data Center Is Coming to the Epicenter of America's Fracking Boom

CoreWeave and Poolside announce partnership for a data center built on a sprawling ranch in West Texas

By [Bradley Olson](#) [Follow](#)

Oct. 15, 2025 9:06 am ET

[Share](#) [AA](#) [Resize](#)



Two data centers in San Antonio have used 463 million gallons of water in the past two years.

Use Cities affect Rainfall science to build new water resources avenues that become part of future strategies for water extremes from floods to droughts.

Interested?

Contact dev.niyogi@jsg.utexas.edu
website: NIYOGI.dev

Figure resources:

<https://waterdata.usgs.gov/blog/water-cycle-release/>

<https://andthewest.stanford.edu/2025/thirsty-for-power-and-water-ai-crunching-data-centers-sprout-across-the-west/>