

# The Challenge of Current and Future Climate Data in the Era of Digital Agriculture

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PRISCILA COLTRI

RESEARCHER AND PROFESSOR AT UNIVERSITY OF CAMPINAS (UNICAMP)  
DIRECTOR - CENTER FOR METEOROLOGICAL AND CLIMATIC RESEARCH APPLIED TO  
AGRICULTURE (CEPAGRI)  
BRAZIL

# Summary

1. Climate Data and Agriculture
2. Challenges and Opportunities:
  - a) Data Accessibility
  - b) Data Type
  - c) Data Quality
  - d) Data Integration
  - e) Data Understanding
  - f) Ethics
3. Projects Examples

# Climate Data and Agriculture

Agriculture highly dependent on Weather and Climate conditions

Climate: has an impact on planning activities for long-term actions - for example, what, where and when to grow a crop

In addition, Climate change could also be an issue, understanding the impacts for production and planning activities, and also generating an huge amount of data for models and future scenarios

## Climate Data

Given this dependency:

- a) Monitoring and Forecasting weather and climate has always been a challenge
- b) Climate data is really needed - we have a **wide range of sources for climate data**

In the era of digital agriculture, we are producing more data than ever before, and (especially) climate data.

# Climate Data - Challenges

Data  
Accessibility

Data Type

Data  
Quality

Data  
Integration

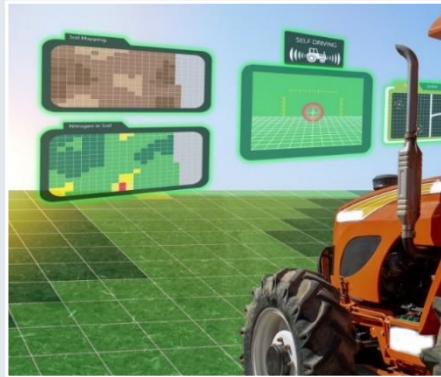
Data  
Understanding

Ethics

Challenges that data science and artificial intelligence could address

# Data Accessibility

## Different Infrastructure for data collection



Farm level

Micro Scale

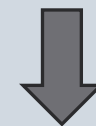


Data is usually at local/farm level  
The data belong to the farmer; meteorological station or sensors inside the tractors and machinery

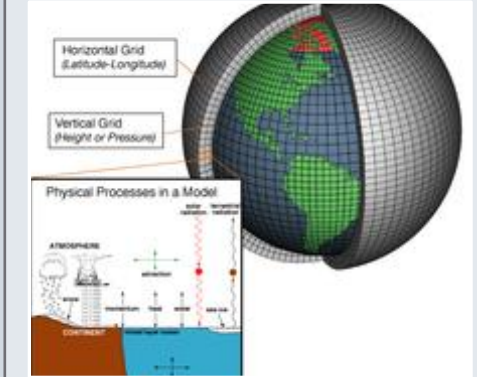


Meteorological Station

Meso Scale



Public Institutions in Brazil;  
data at meteorological station level  
Free access



Models

Macro Scale



Climate models  
reanalyses model  
Satellite images

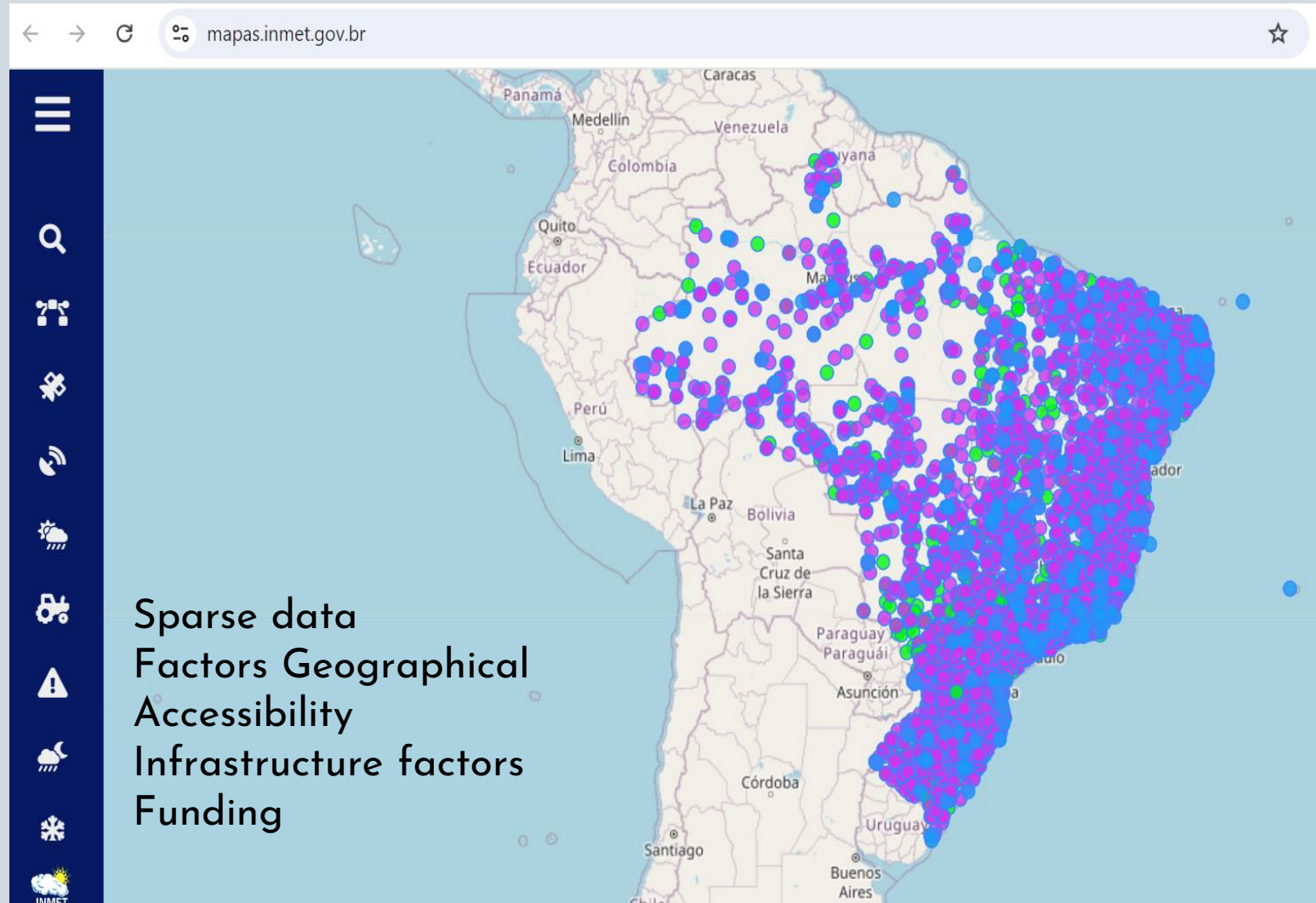
So we have different sources of data with different scales and different meanings.

# Climate Data - Challenges

INMET - Instituto Nacional de Meteorologia  
(National Institute of Meteorology)

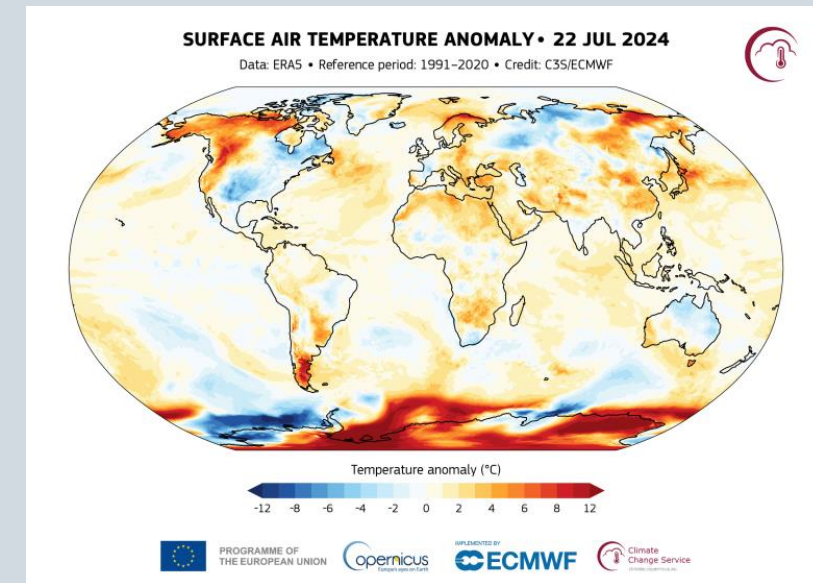
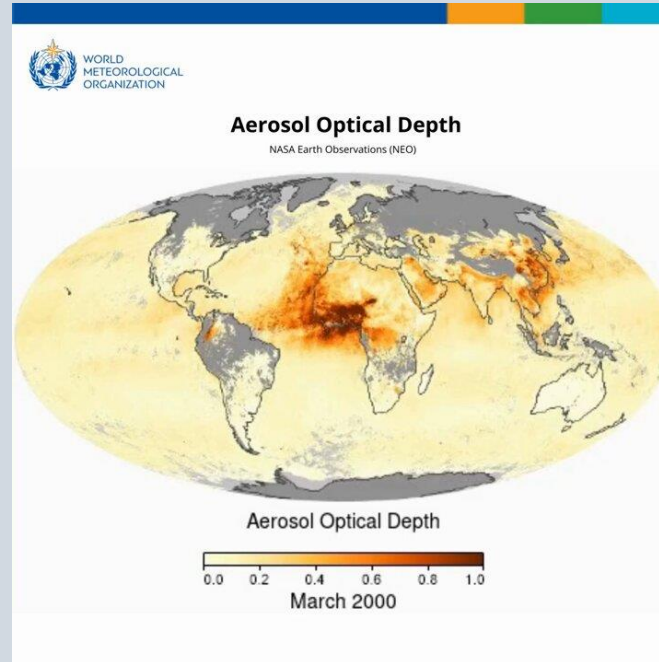
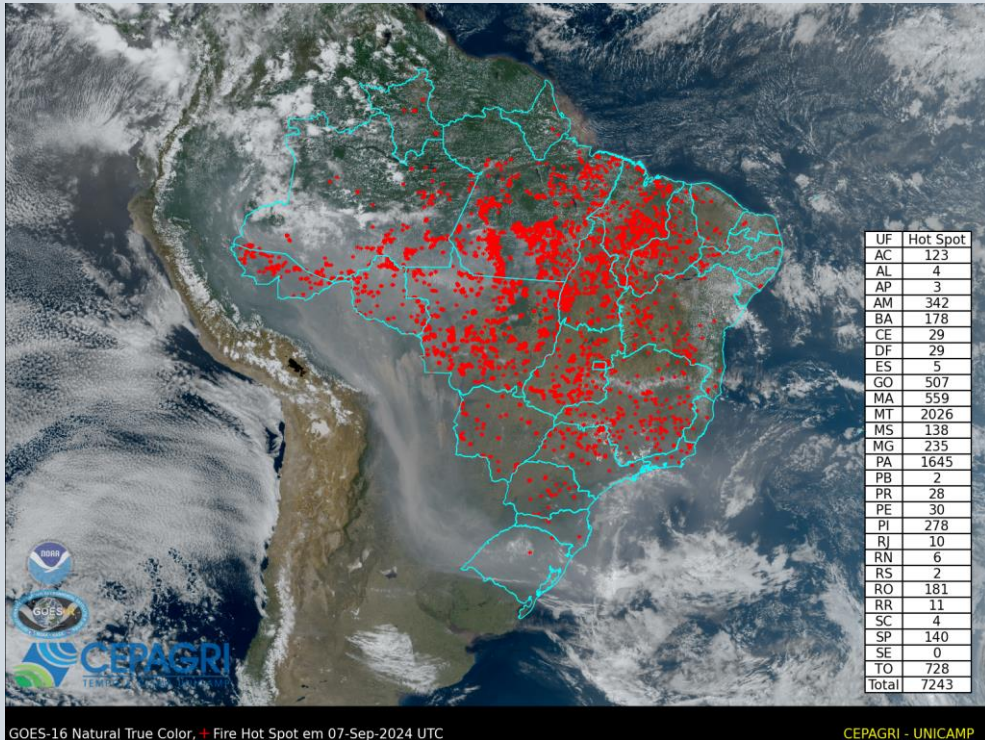
## Data Accessibility

- ✓ Meteorological stations is the most popular data- freely available;
- ✓ Northern region we have few stations because of the difficulty of access
- ✓ Even in the other regions where we have a network of stations, we still have problems with funding and infrastructure, so there are gaps in the data series.



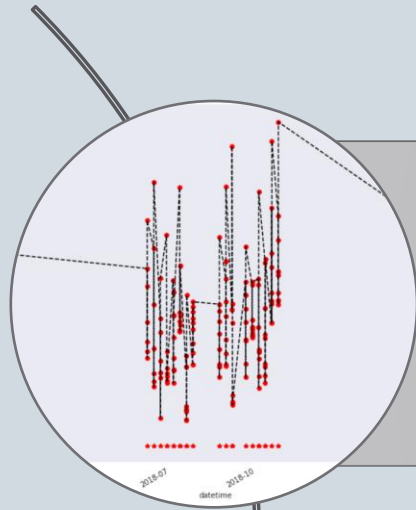
# Climate Data - Challenges

## Macro Scale Examples

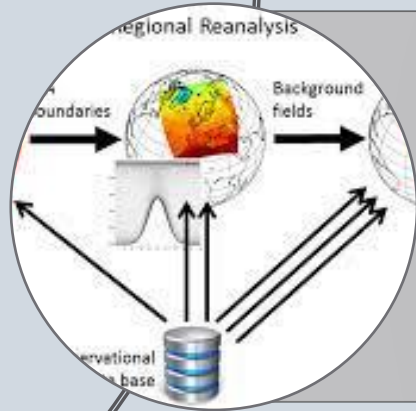


# Climate Data - Challenges

## Data Quality/ Consistence



Meteorological Stations present historical missing data and local measurements



Model x measured data: require studies to understand how the model is performing local/regional/national climate



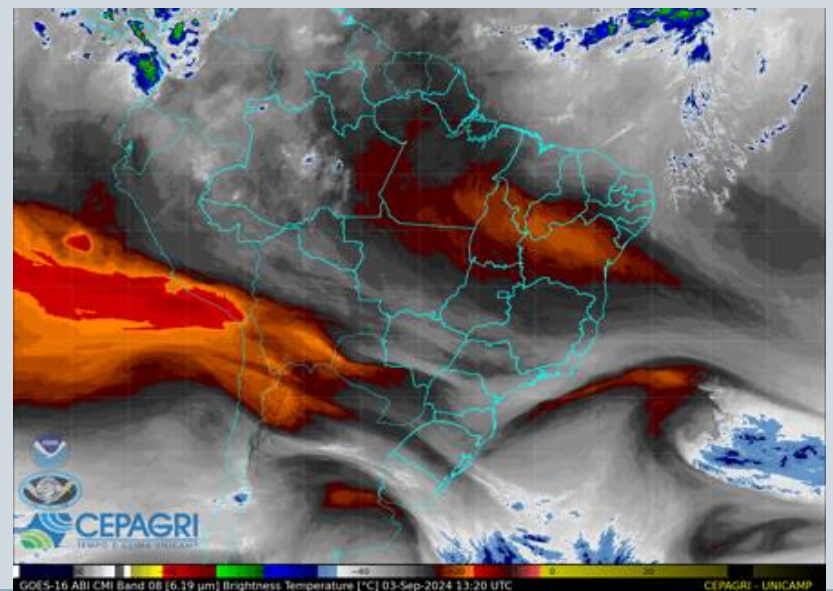
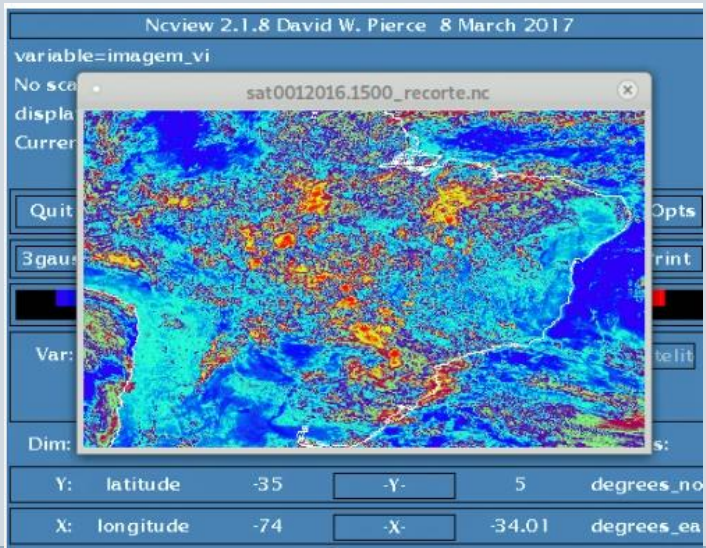
# Climate Data - Challenges

Data Type

- ✓ Each platform provides a file format
- ✓ Difficulty in working with many files: csv spreadsheets; NetCDF; TIFF
- ✓ The user is invited to choose the data source: weather station, satellite, models - the user does not always know the difference, the uncertainties

Leading us to another challenge

	Temp	W	Low	Out	Dew	Wind	Wind	W	H	W	Heat	THW	R	Heat	Cool	In	In			
	Out	Temp	Temp	Hum	Pt.	Speed	Dir	Run	Speed	Dir	Index	Index	Rate	D-D	D-D	Temp	Hum			
0600	15.8	14.1	13.5	75	9.5	0	0	0	0	0	13.8	13.5	13.5	970.7	0	0	0.187	0	20.5	74
0700	14.1	14.2	13.8	75	9.7	0	0	0	0	0	14.1	13.7	13.7	969.9	0	0	0.178	0	20.3	74
0800	13.8	14.2	13.7	75	9.5	0	0	0	0	0	13.8	13.5	13.5	969.6	0	0	0.187	0	20.2	74
0900	13.7	13.9	13.5	75	9.4	0	0	0	0	0	13.7	13.4	13.4	969.3	0	0	0.192	0	20.1	75
1000	14.6	14.8	13.8	75	10.7	0	0	0	0	0	14.6	14.2	14.2	969.2	0	0	0.157	0	19.5	76
1100	14.8	14.9	14.3	75	10.4	0	0	0	0	0	14.8	14.5	14.5	969.4	0	0	0.148	0	19.9	76
1200	15.3	15.2	14.8	75	10.7	0	0	0	0	0	15.1	14.7	14.7	969.6	0	0	0.157	0	19.5	77
1300	15.7	15.7	15.1	75	11.2	0	0	0	0	0	15.7	15.4	15.4	970.7	0	0	0.111	0	19.5	77
1400	17.3	17.3	15.7	74	12.7	0	0	0	0	0	17.3	17.2	17.2	971.1	0	0	0.042	0	20.1	76
1500	20.2	20.3	17.3	63	12.0	0 WSW	0	0.9 W	20.2	20.1	20.1	971.4	0	0	0	0.079	0	20.3	76	
1600	21.8	21.8	20.1	54	11.1	0.4 WSW	1.61	1.8 NE	21.8	21.1	21.3	971.3	0	0	0	0.144	0	20.5	77	
1700	23.3	23.6	21.7	53	11.2	0.4 WSW	1.61	1.3 SW	23.3	23.3	23.3	970.8	0	0	0	0.206	0	20.7	76	
1800	23.9	24.1	21.1	49	12.5	0.4 WSW	1.61	1.1 W	23.9	23.8	23.8	970	0	0	0	0.231	0	20.8	75	
1900	25.1	25.1	23.3	47	13	0.9 WSW	1.27	1.6 NE	25.1	24.9	24.9	969.2	0	0	0	0.282	0	21.1	72	
2000	24.7	25.2	24	47	12.6	0.4 WSW	1.61	4.5	24.7	24.5	24.5	968.3	0	0	0	0.266	0	21.2	72	
2100	21.4	21.4	21.8	51	11	0.4 WSW	1.61	4.5 SW	21.4	21.7	21.7	968	0	0	0	0.177	0	21.4	72	

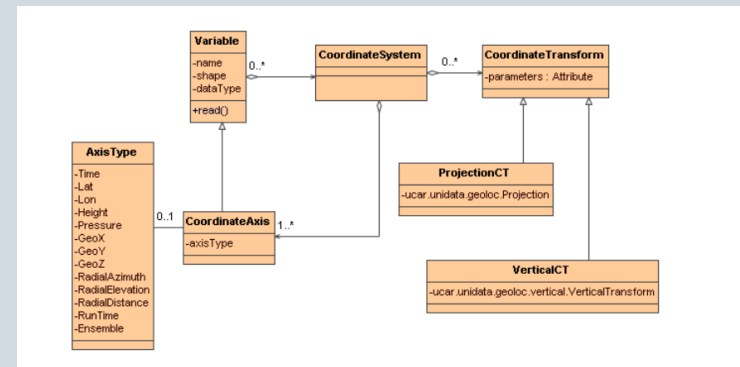


## Data Integration

- ✓ A challenge with all these differences between data files is how to integrate them with other types of data: seems to be simple when working with a small dataset, but when working with a large amount of climate data, on different temporal and spatial scales, with other databases (e.g. soil, plant or other area databases), we are faced with the challenge of integrating these data.



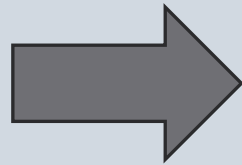
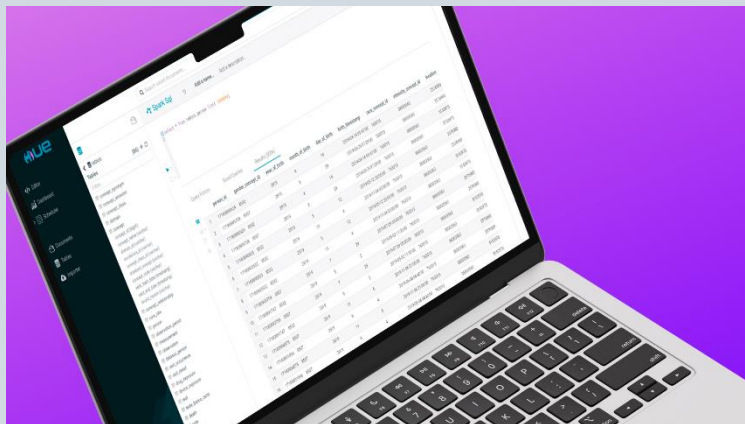
- ✓ Develop Common Climate Data Model - Assists with data description and interoperability with other databases



## Data Understanding

### Make data understandable

- ✓ Develop products for agricultural users, understanding what they need
- ✓ Each type of producer has a way of communication
- ✓ Develop products considering different spatial and temporal scales
- ✓ Present Data visualization and exploration tools
- ✓ Provide access to data sets for different society sectors (academic, agricultures, energy, health...)
- ✓ Encouraging citizen science



### Dashboard Overview

A user-friendly tool offering real-time visualization and analysis of integrated datasets, using customizable visual tools such as heat maps, time series, and predictive modeling outputs.

# Data Governance

## Ethics



**Ethical Considerations:**  
Data for all regions, without neglecting or discriminating ; generation of too much data



**Data Security:**  
protecting data from unauthorized access- need regulations



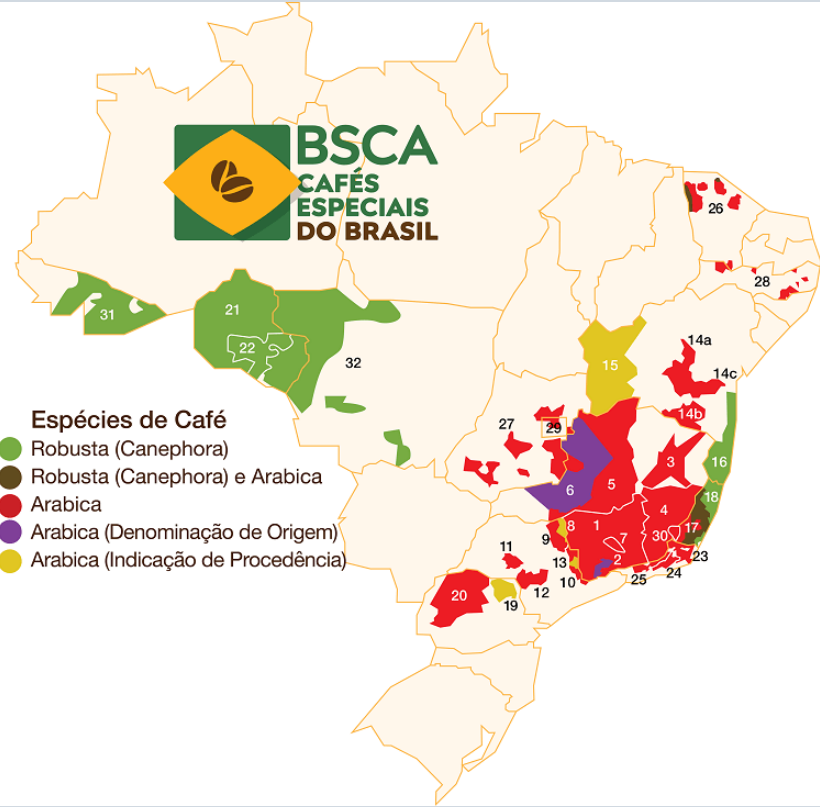
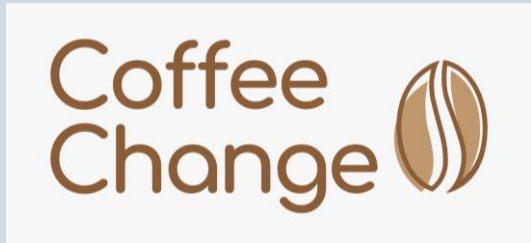
**Data Consistency - Spread of data:**  
Inconsistent data may lead to flawed models, misguided public policies



**Data Stewardship:**  
assigning responsibility for data management



**Compliance and Regulation:**  
adhering to other legal and regulatory requirements related to data management



## Research Questions:

- What has been happening in the climate of Brazilian coffee areas?
- What will happen in these areas?
- How will coffee react?
- What is the climate perception of coffee producers?



@coffeechange.unicamp

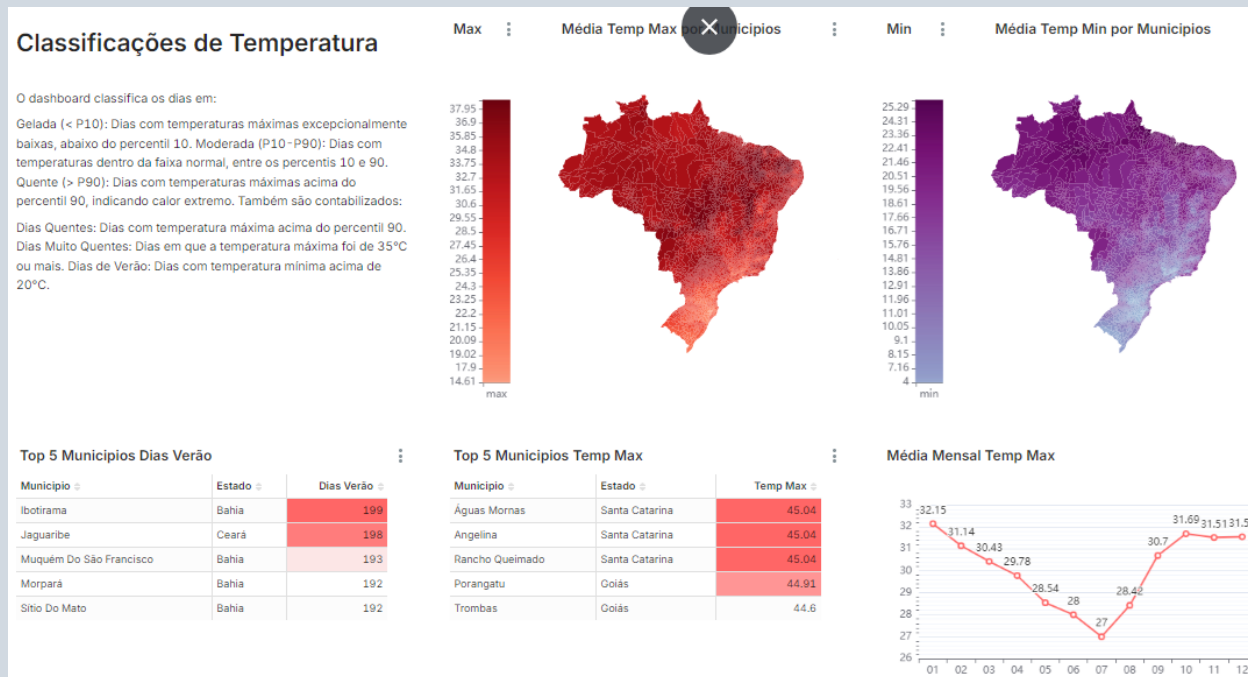
# Project Examples



## climaterna

The Climaterna project, a initiative by Brazilian Institute of Data Science (BIOS), at University of Campinas, is a cutting-edge data platform that integrates climate and maternal-perinatal health information.

This open-source based repository will serve as a permanent observatory, designed to analyze the impacts of climate change on maternal (pregnancy) and newborn health in Brazil.



# Datasets



climaterna

The dashboard is formed by several public key datasets from over 5,000 municipalities in Brazil.

## Environmental Data

Climate & Pollution Data:

Sourced from Brazilian Daily Weather Gridded Data (BR-DWGD), Climate Models and CETESB, it includes temperature, precipitation, air quality, and extreme weather events, which are crucial for identifying climate-related health risks.

## Health Data:

SIM (Mortality Information System) Provides data on maternal and perinatal mortality, enabling analysis of how climate factors correlate with mortality rates.  
SINASC (Live Birth Information System): Offers detailed birth data, essential for understanding trends in premature births and neonatal health in relation to environmental conditions.

## Demographic Data:

Captured from Census, which is a comprehensive population survey conducted by the Brazilian Institute of Geography and Statistics (IBGE). It includes information such as age, income distribution, genders, races/ethnicities, education levels, and employment status.



**climaterna**



*<https://biOs.unicamp.br/>*

<https://me-qr.com/l/climaterna>





**Thank you for your attention**

**Merci de votre attention**

[pcoltri@unicamp.br](mailto:pcoltri@unicamp.br)