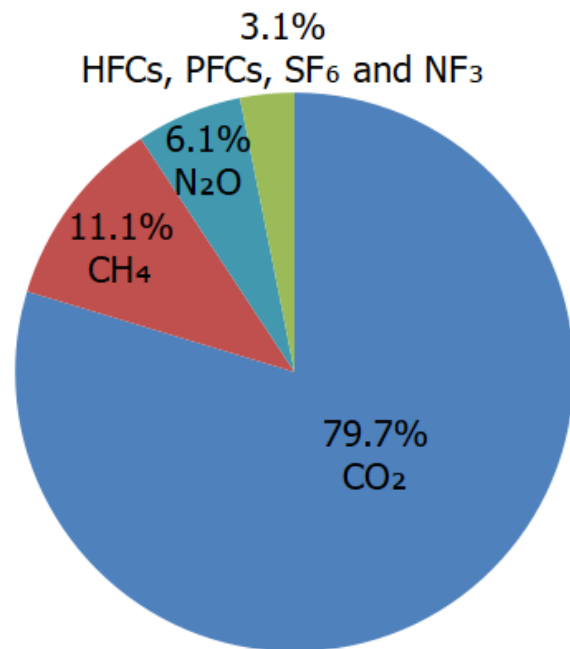


Visual Analytics for Methane Emissions Monitoring: Integrating Multi-Scale Data for Enhanced Detection and Mitigation

Parisa Masnadi¹, Wolfgang Jentner², Binbin Weng¹, Chenghao Wang¹, Xiao-Ming Hu¹, and David Ebert^{1,2}
University of Oklahoma¹, University of Arizona²

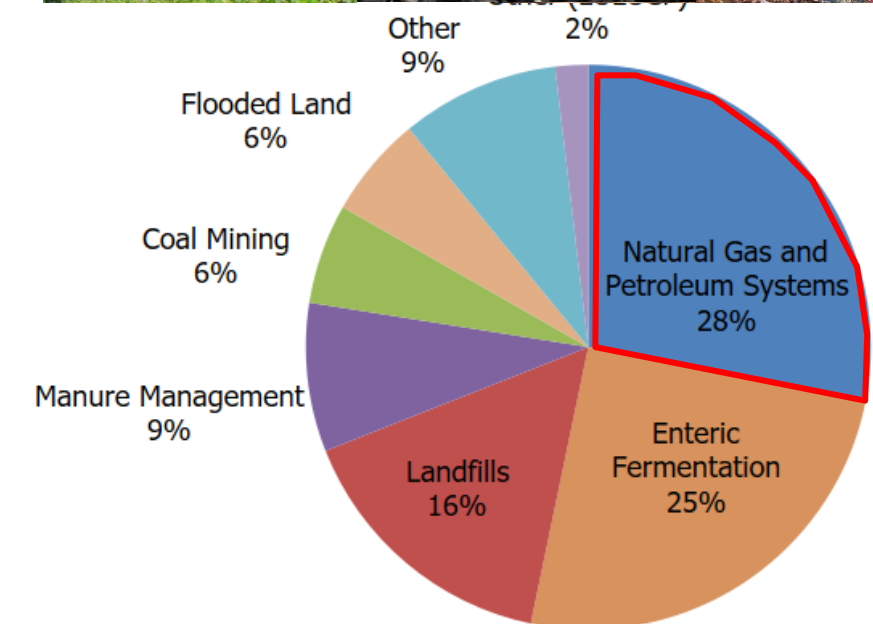
Environmental Impact and Regulatory Landscape



- Methane (**CH₄**)'s **lifetime** is much **shorter** than carbon dioxide (**CO₂**), but CH₄ is more efficient at trapping radiation than CO₂.
- The **impact** of **CH₄** is **28 times** greater than that of **CO₂** over **100 years**.

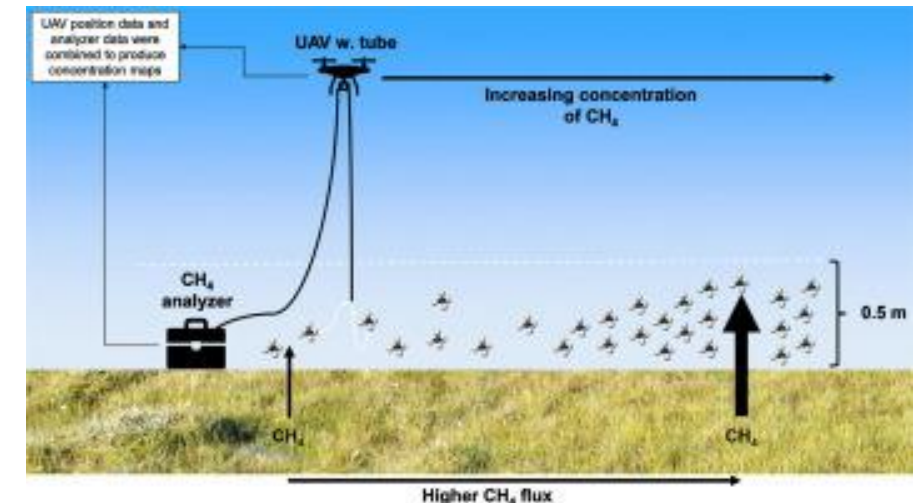
Environmental Impact and Regulatory Landscape

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- The **impact** of **CH₄** is **28 times** greater than that of **CO₂** over **100 years**.
- **CH₄** Driven by both **human** activities and **natural** processes.

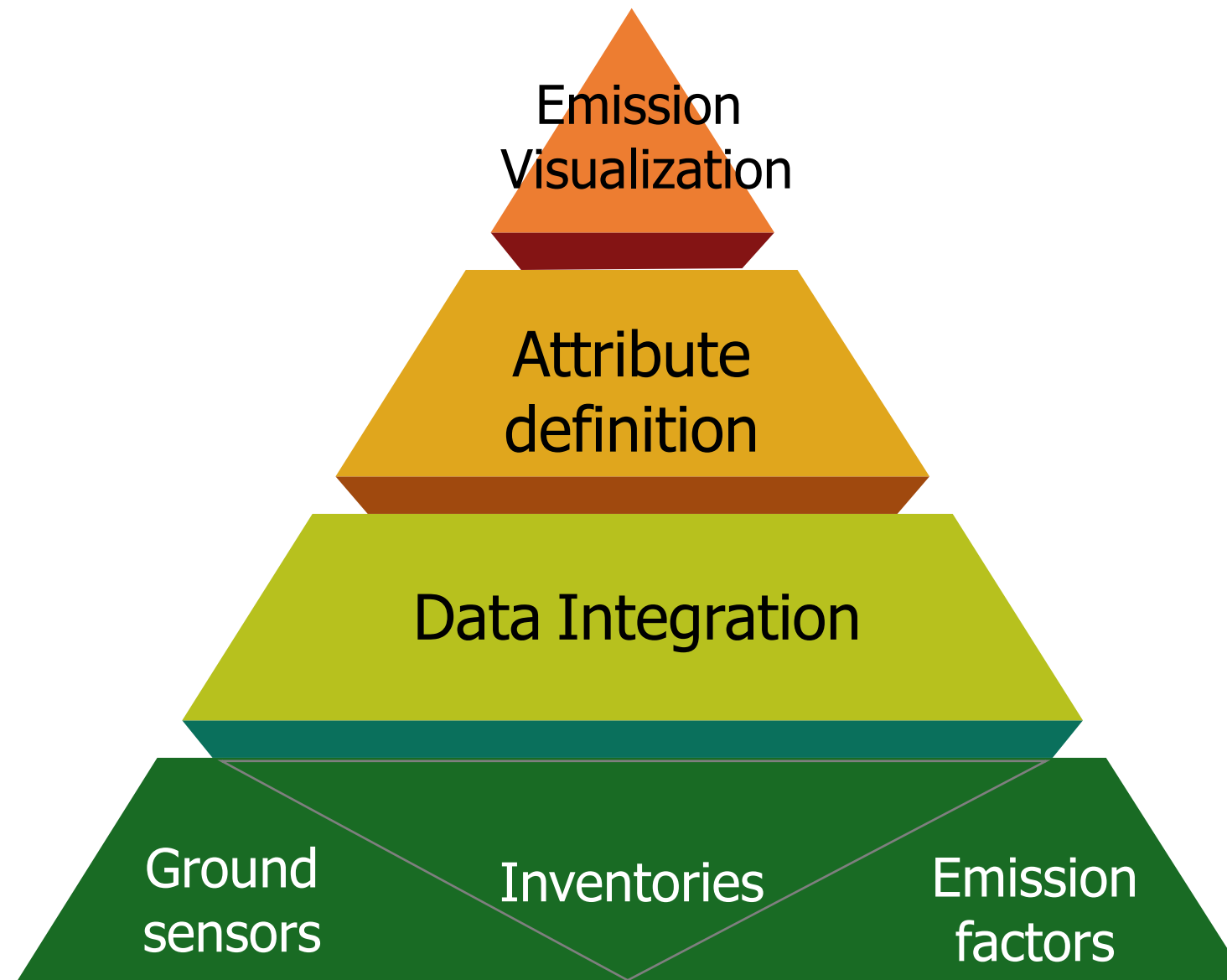


Current Monitoring Methods & Gaps

- Two main methods:
 - Bottom-Up
 - Ground sensors and inventory measurement
 - Top-Down
 - Atmospheric measurement and consideration
- Detailed explanation and challenges on the next slide.

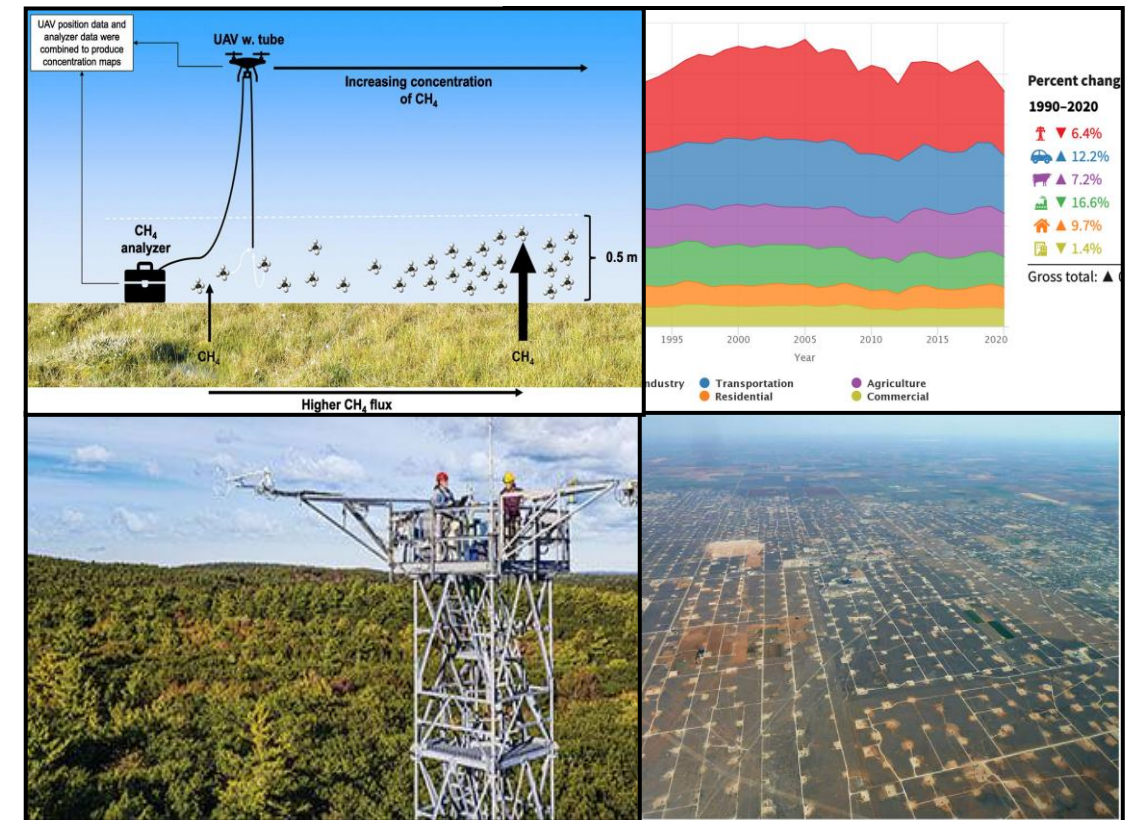


Bottom-Up Approach in a Glance

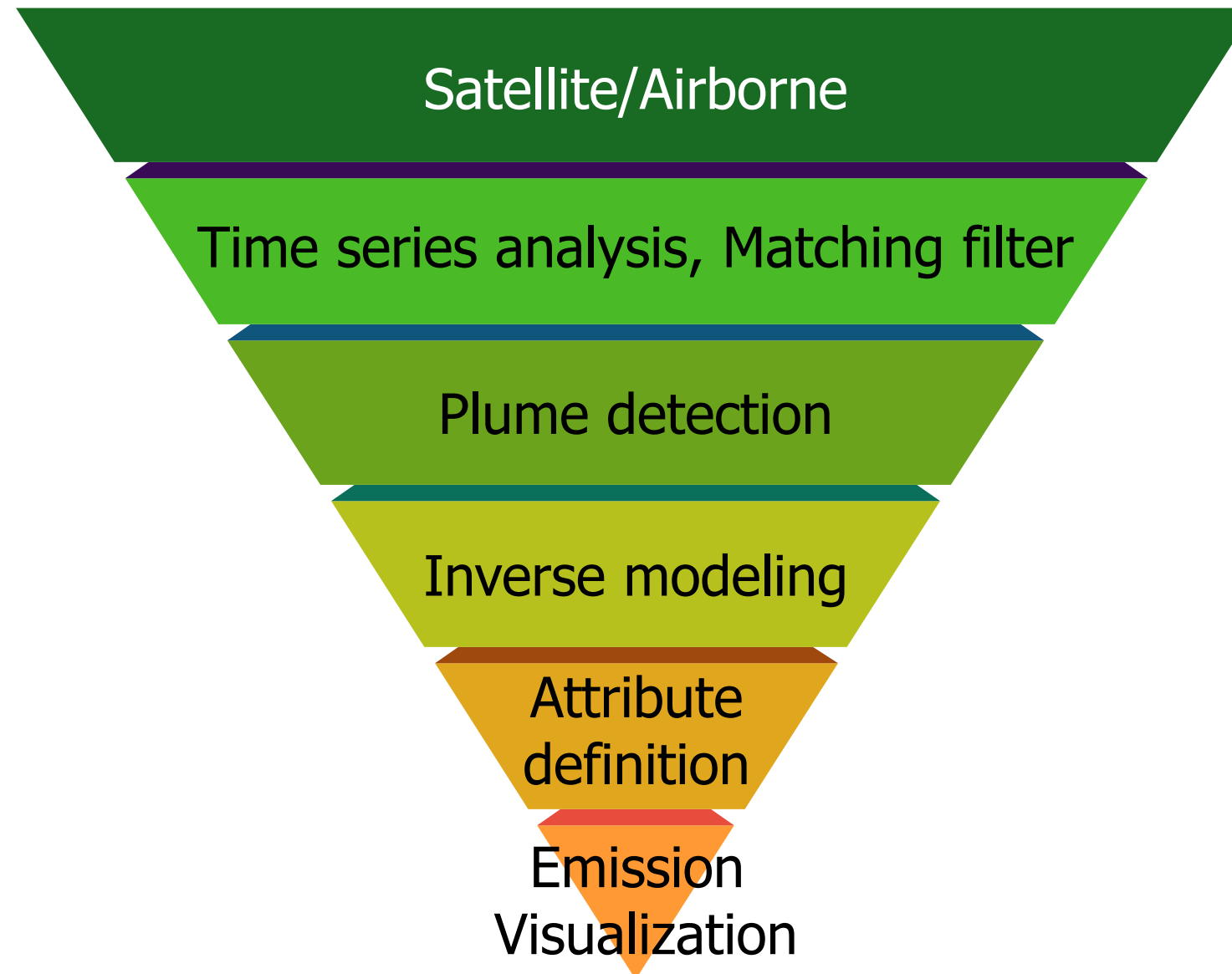


Bottom-Up Limitation

- **Infrastructure required** for high-resolution data
- **Infrequent** inventory updates
- **Challenging** data integration and validation
- **Uncertain** emission estimates
- **Lack** of accurate Infrastructure information

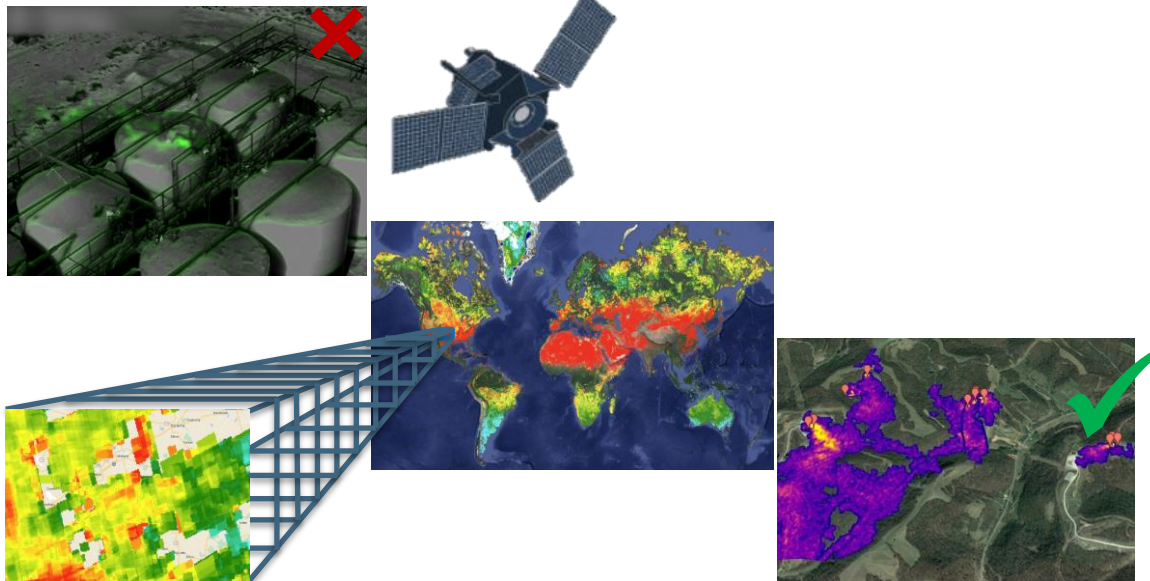


Top-Down Approach in a Glance

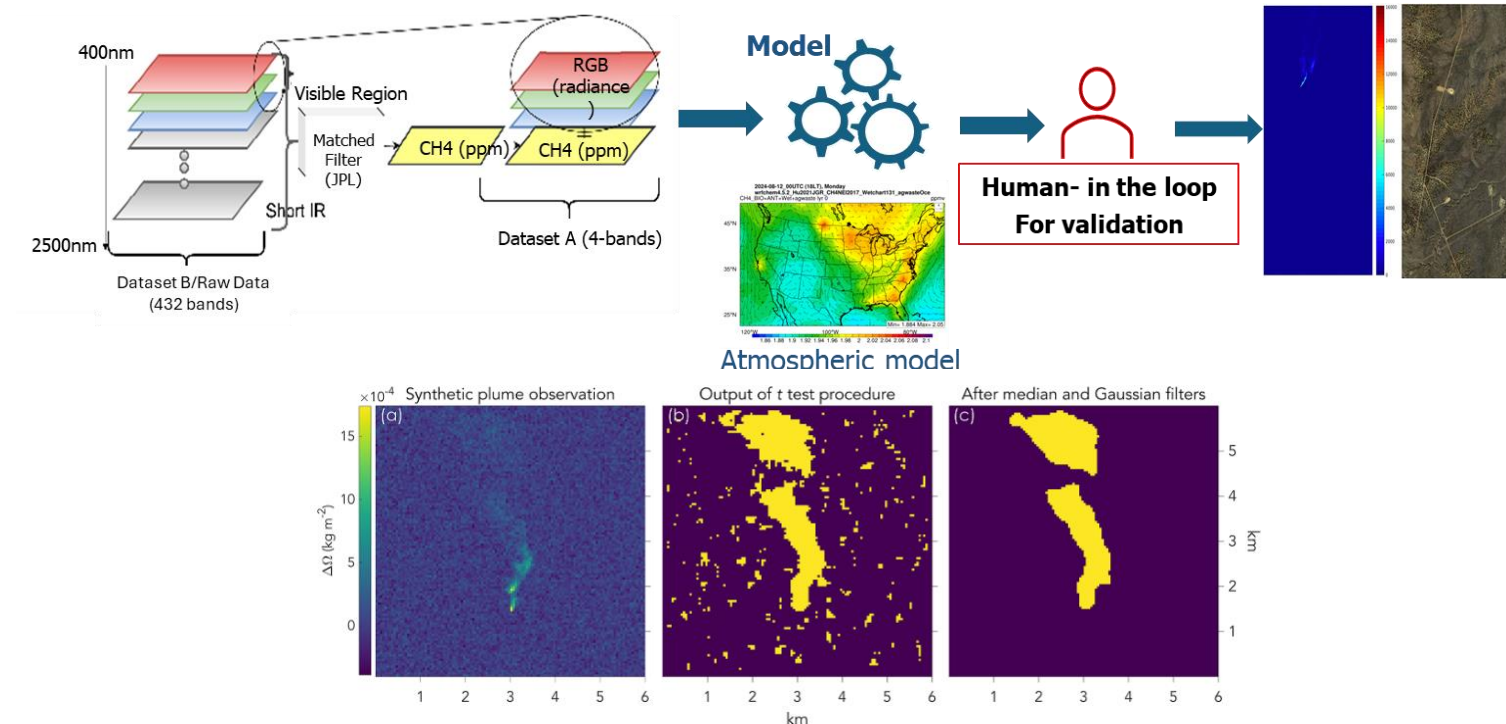


Top-Down Limitation

- **Challenges in Detecting** Low-Rate Emissions
- **Low** spatial **resolution** and **weather** sensitivity
- **Revisit limitations** for intermittent emission detection

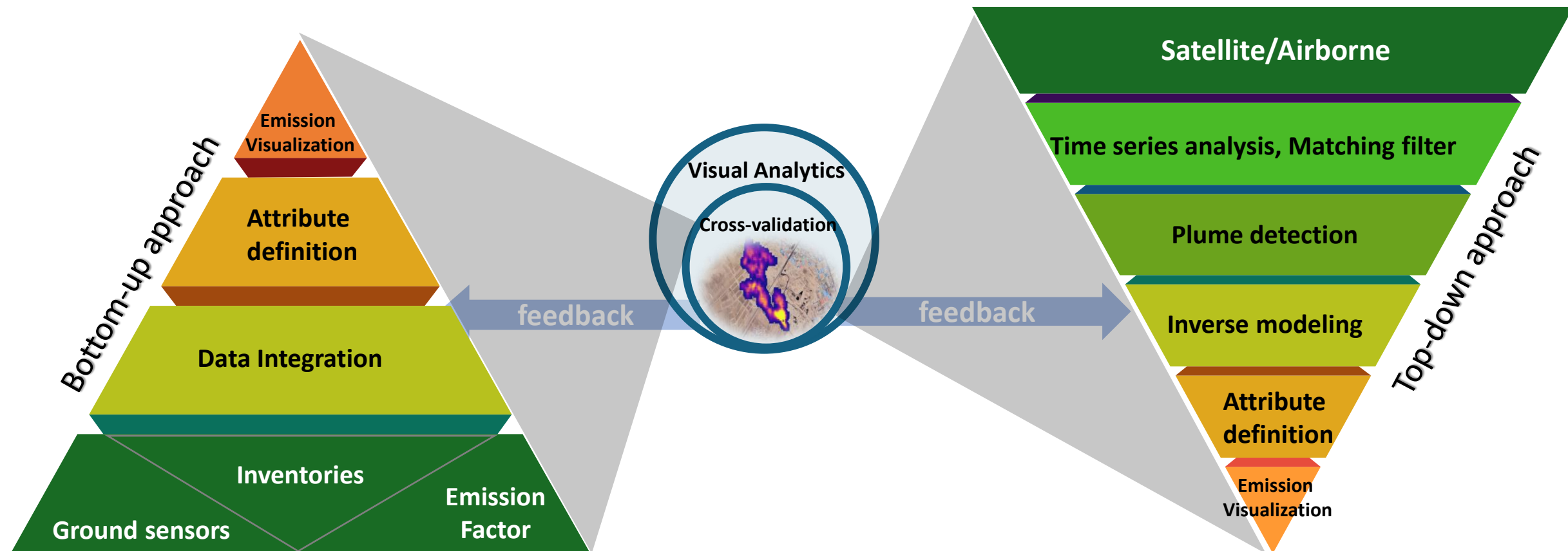


- **Matched filter** techniques require **humans** to filter out false detections.
- **Inversion methods** depend on **local wind**



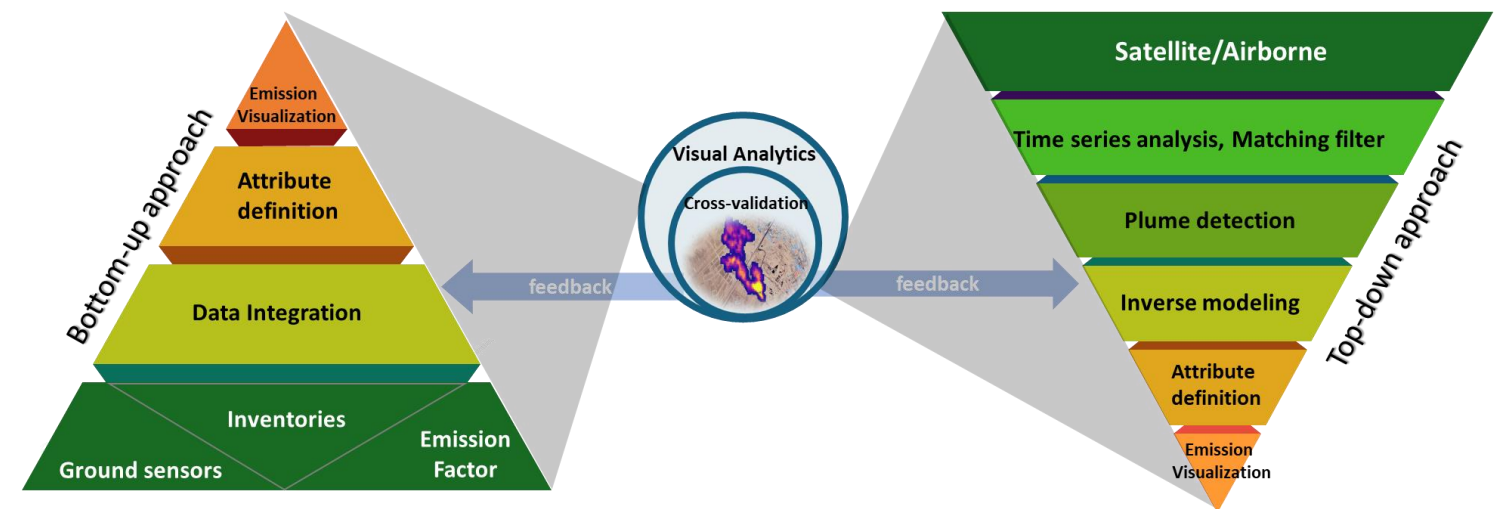
Integration approach and visual analytics solution

Integrated Monitoring System (IMS)



How can IMS Help?

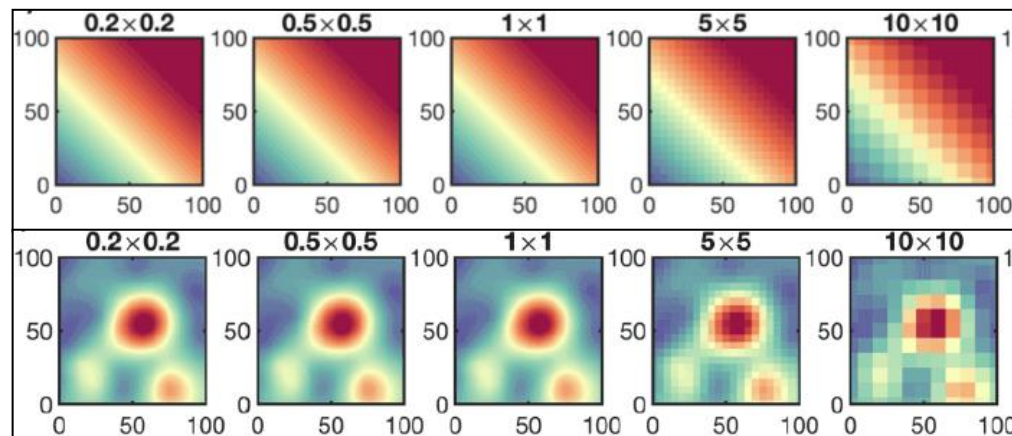
- Enable data comparison and **cross-validation**
- Identify data **discrepancies**, anomalies, and measurement **errors**
- **Improve** the accuracy of **emission volume** and **source identification**
- Enhance the process with:
 - Human-in-the-loop interactions
 - ML in VA combination
 - Data exploration techniques



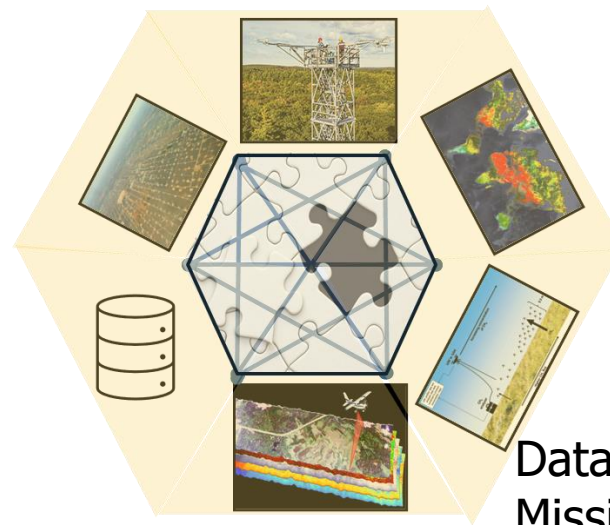
- Detect specific areas for **target mitigation**

IMS Challenges

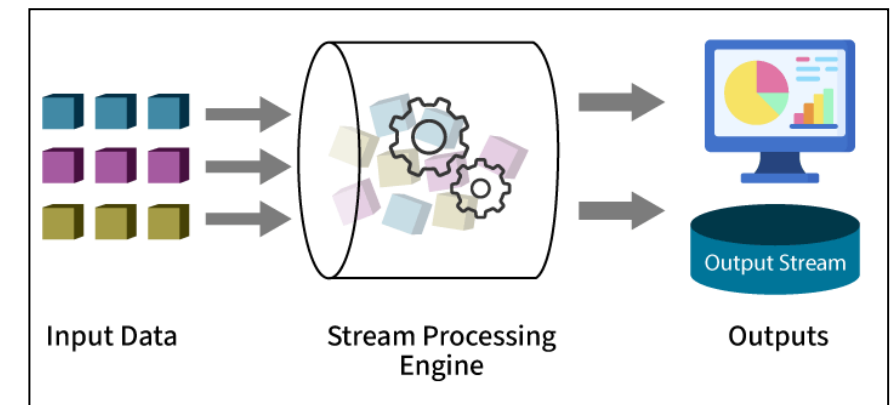
- **Data integration:** Heterogeneous, multi-dimensional data with semantic differences
- **Quality: Alignment** issues and **missing values** from environmental conditions and equipment failures
- With all these conditions, the whole procedure should be processed in **real-time**



Resolution differences

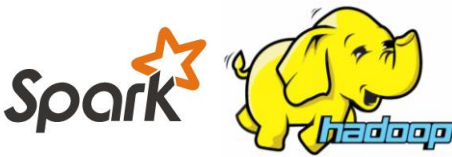


Data Alignment
Missing value



Data surge real-time processing

IMS Requirements

- **Robust Framework:** 
 - Data **credibility, validation,** and **regulatory compliance**
- **Data Fusion**
 - **integrating** different data sources with varying quality, timing, and resolution
 - Critical for **creating a unified, reliable dataset** from **heterogeneous inputs**
- **Visual Analytics**
 - Essential for **stakeholder engagement** and **evidence-based decision processes**
 - Enables **anomaly detection,** result verification, and **multi-dimensional data exploration**

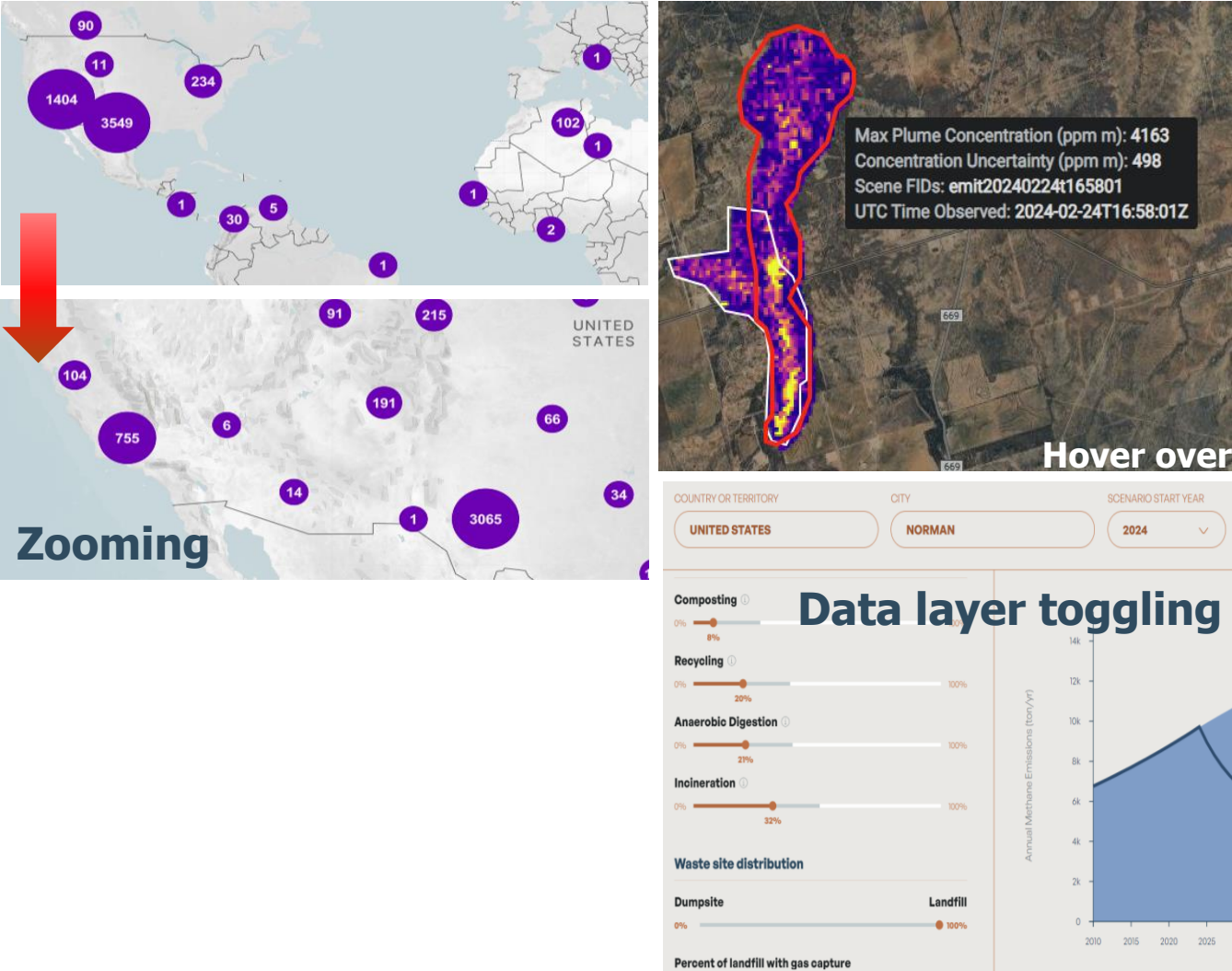
Challenges in Data Integration, Monitoring, and Exploration of Methane Emissions: The Role of Data Analysis and Visualization



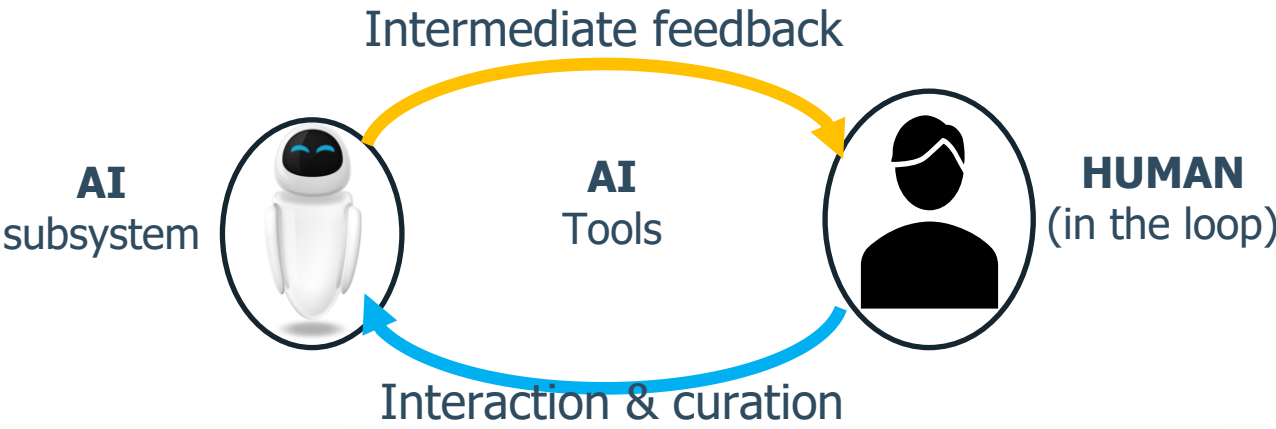
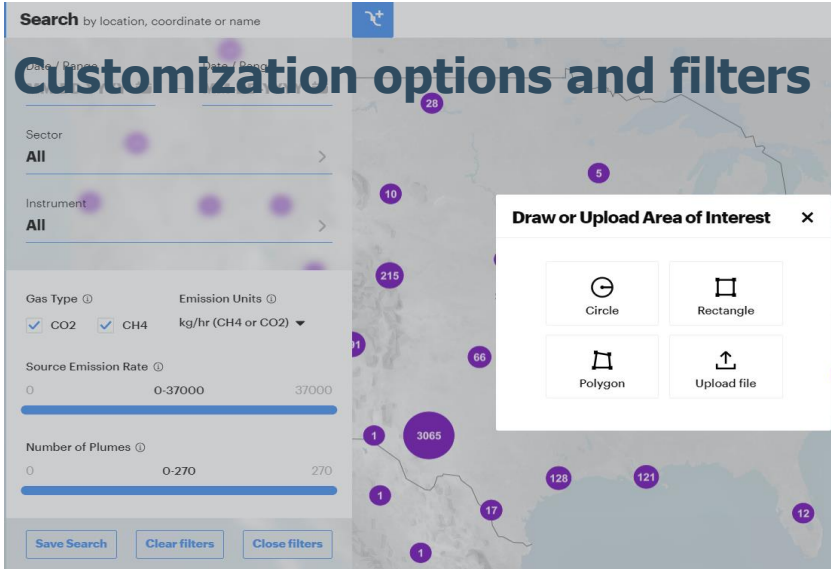
The screenshot shows the IEEE Xplore digital library interface. At the top, there are navigation links for IEEE.org, IEEE Xplore, IEEE SA, IEEE Spectrum, and More Sites. The main header includes the IEEE Xplore logo, a 'Browse' dropdown, 'My Settings', and 'Help'. A search bar is present with a dropdown menu set to 'All' and a search button. Below the search bar, the article title 'Challenges in Data Integration, Monitoring, and Exploration of Methane Emissions: The Role of Data Analysis and Visualization' is displayed. The publisher is listed as IEEE, and there are buttons for 'Cite This' and 'PDF'. The authors are Parisa Masnadi Khiabani, Gopichandh Danala, Wolfgang Jentner, and David Ebert. The article is 132 pages long and is available in full text. The abstract is visible, discussing methane CH4 leakage monitoring and the role of visual analytics. A QR code is located in the bottom right corner of the article page.

IMS - Interactive Dashboard Requirements

Data Interaction



Customization & Filtering



References: <https://data.carbonmapper.org/#1.73/30.8/50.5>
<https://earth.jpl.nasa.gov/emit/data/data-portal/Greenhouse-Gases/>
<https://wastemap.earth/map?mode=country&country=USA&city=&site=>

How Modeling Enhances Methane Detection & Quantification

Forward Modeling (Bottom-Up Enhancement)

WRF-GHG Model

Regional atmospheric transport simulation

Regional
/Facility

Large Eddy Simulation (LES)

High-resolution turbulence modeling

Facility

Predicted Concentrations

Spatial & temporal concentration patterns

Inverse Modeling (Top-Down Applications)

Atmospheric Transport Models

WRF-GHG + optimization algorithms

Regional

Optimization Process

Work backward from measurements

Estimated Emission Rates

Unknown source identification & quantification

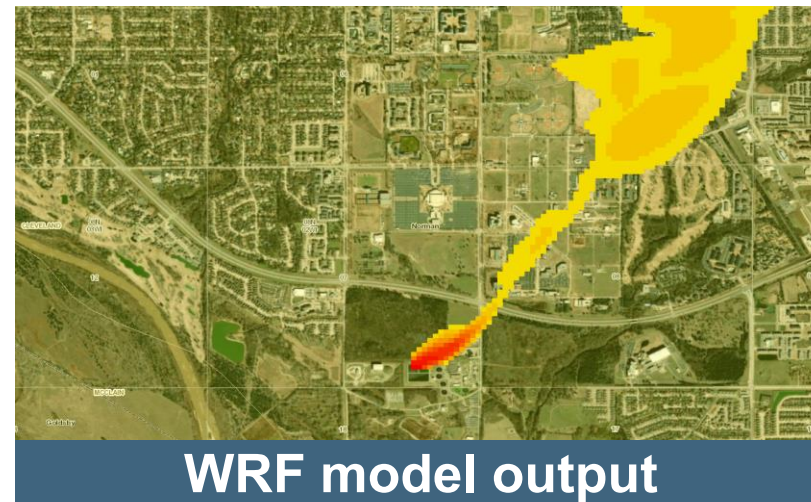
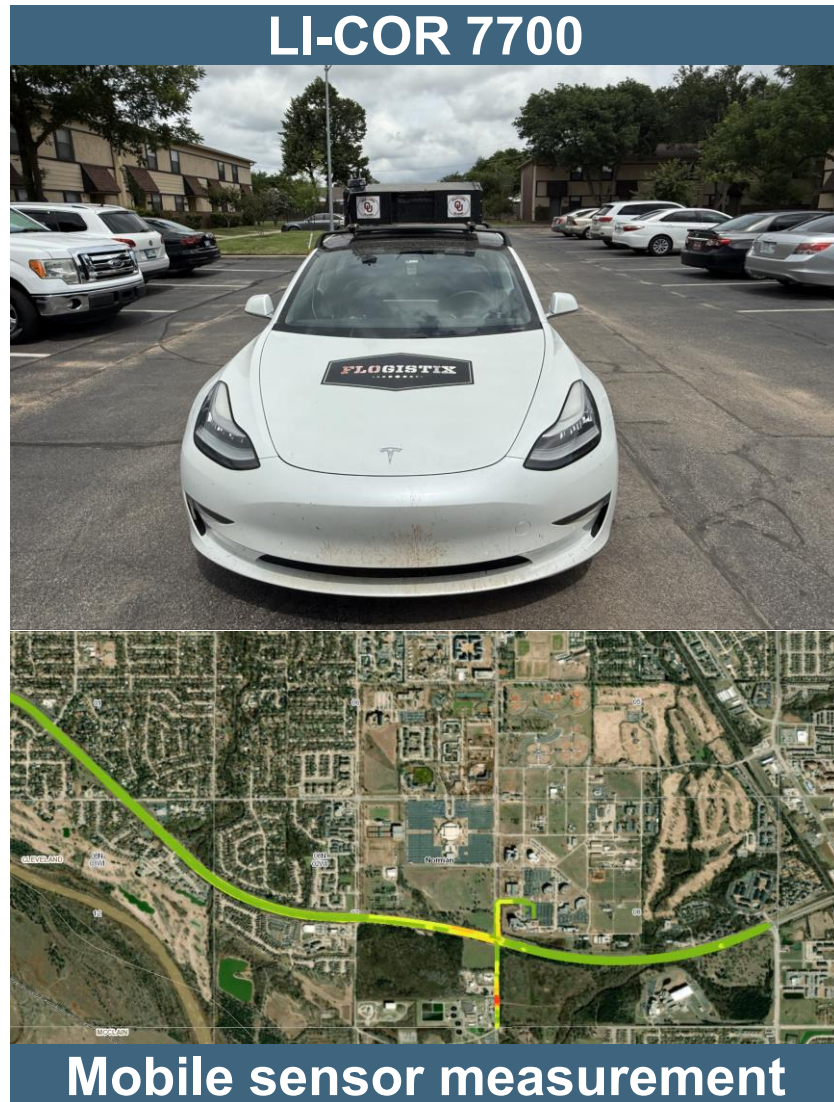
WRF-GHG Model: Weather Research and Forecasting model with greenhouse gas transport capabilities

- **Simulate** methane dispersal and regional methane transport
- **Predict** concentration patterns

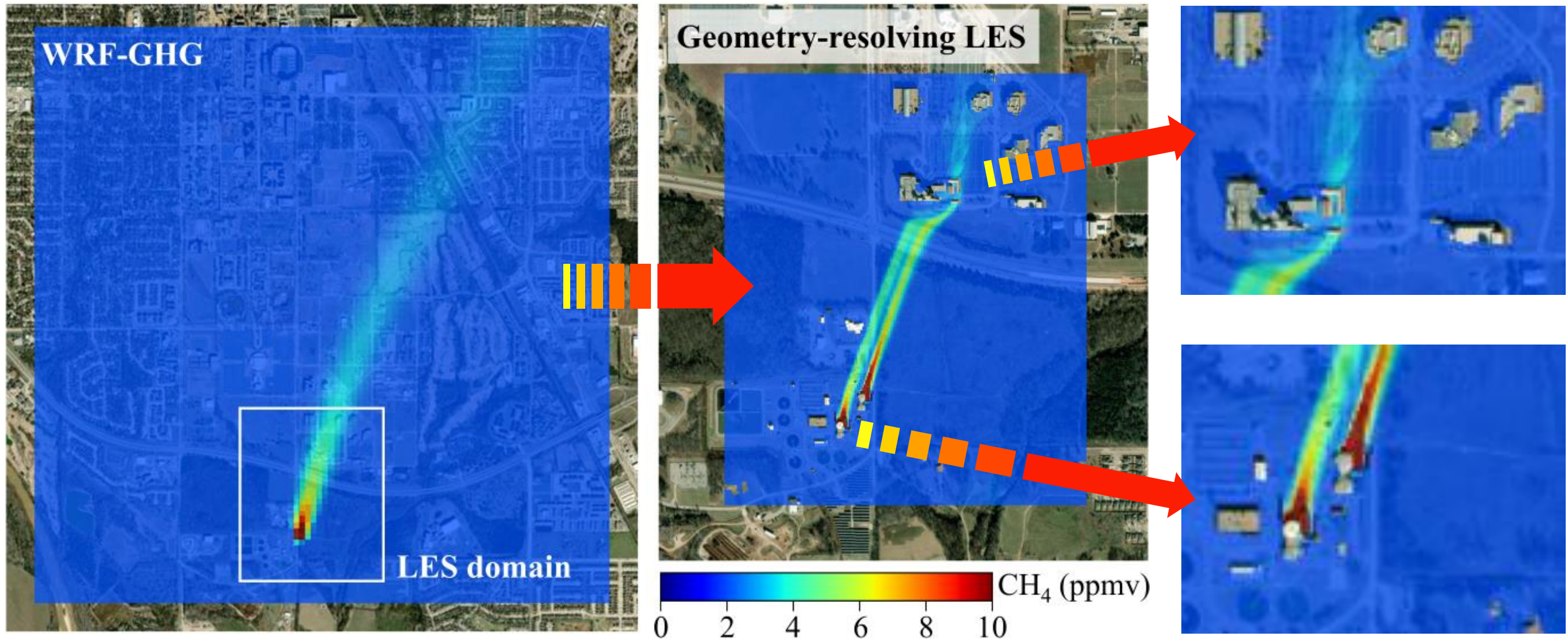
Large Eddy Simulation (LES): High-resolution turbulence modeling approach

- **Capture** detailed turbulent mixing around sources
- **Enable** precise facility-scale emission quantification

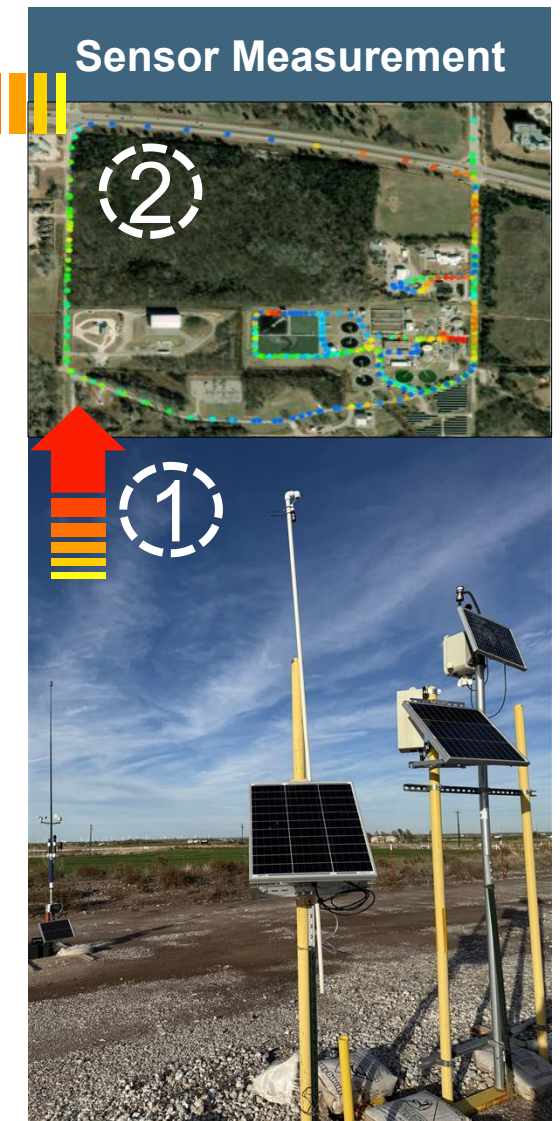
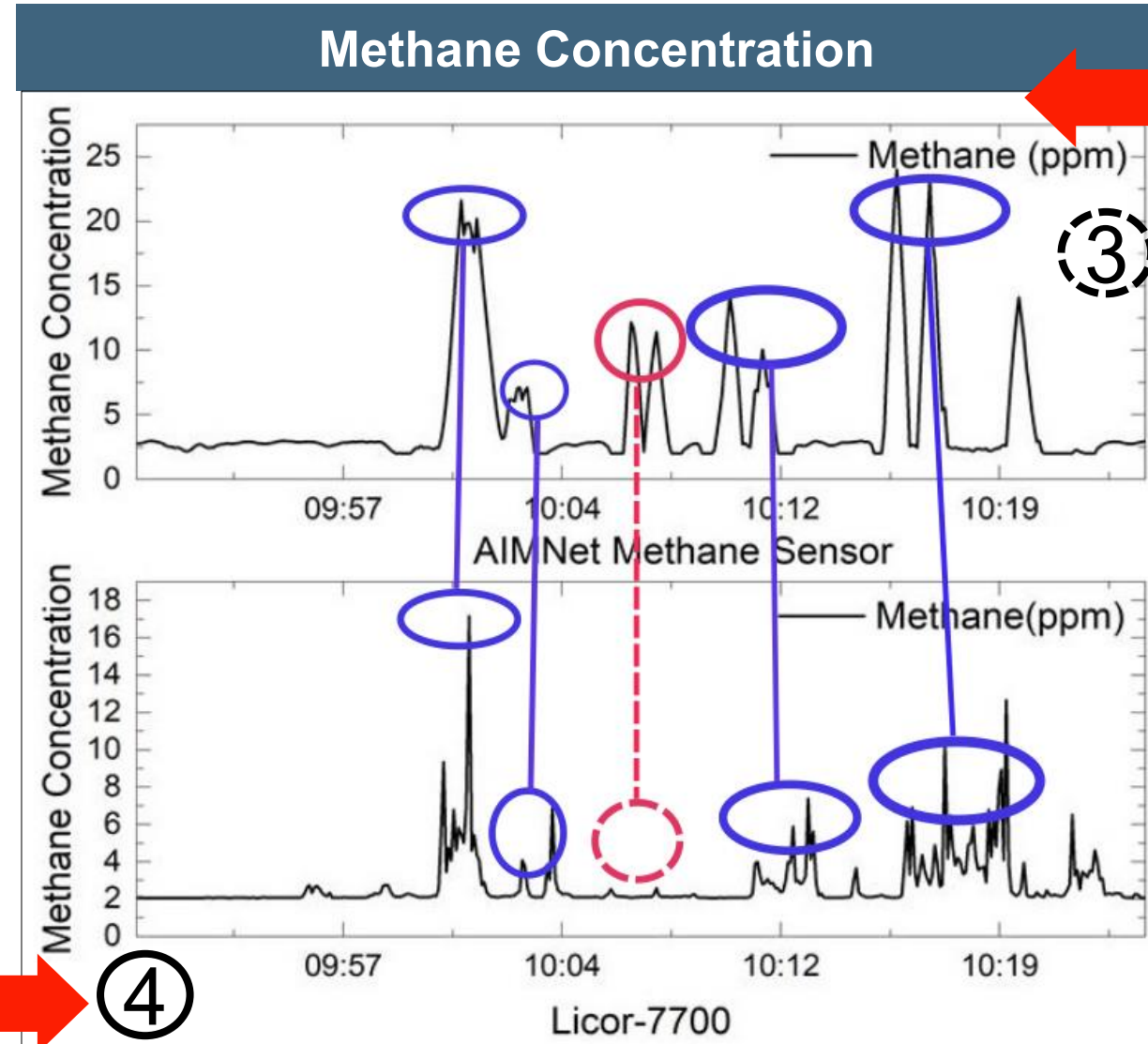
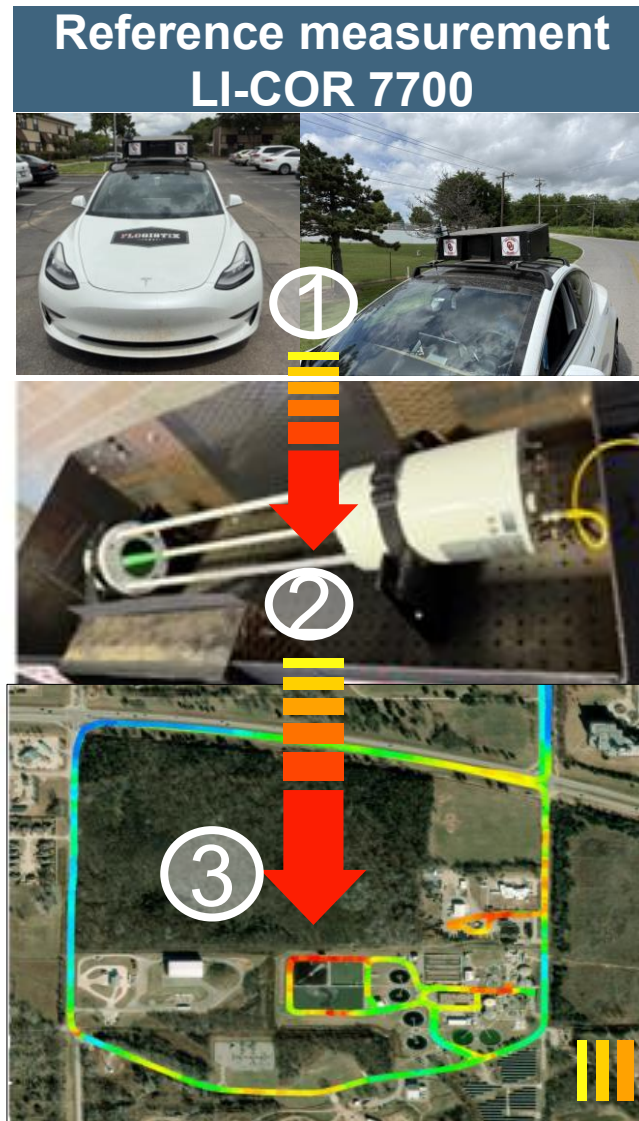
Case Study – Mobile Sensor & WRF (Weather Research and Forecasting) Model Output Cross-Validation



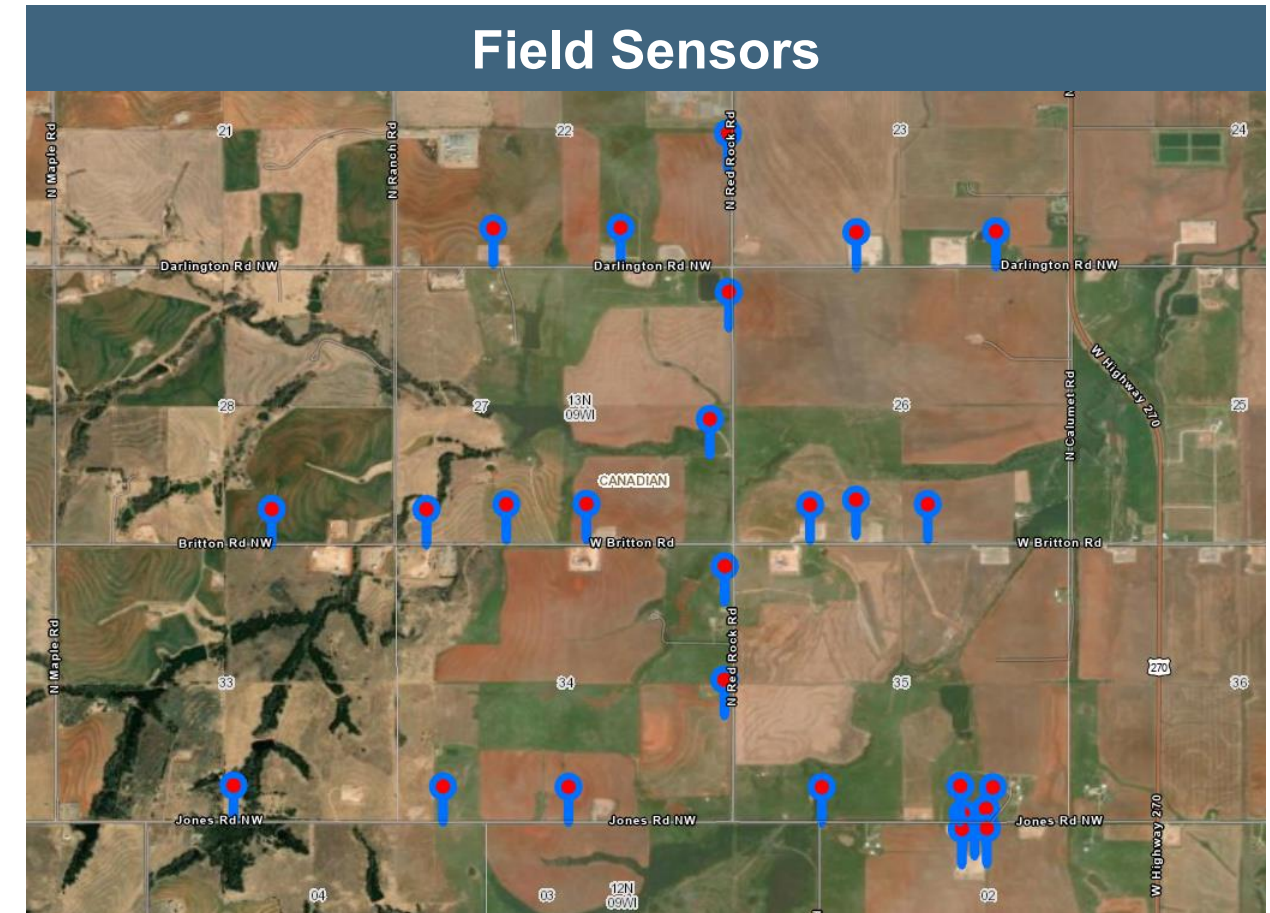
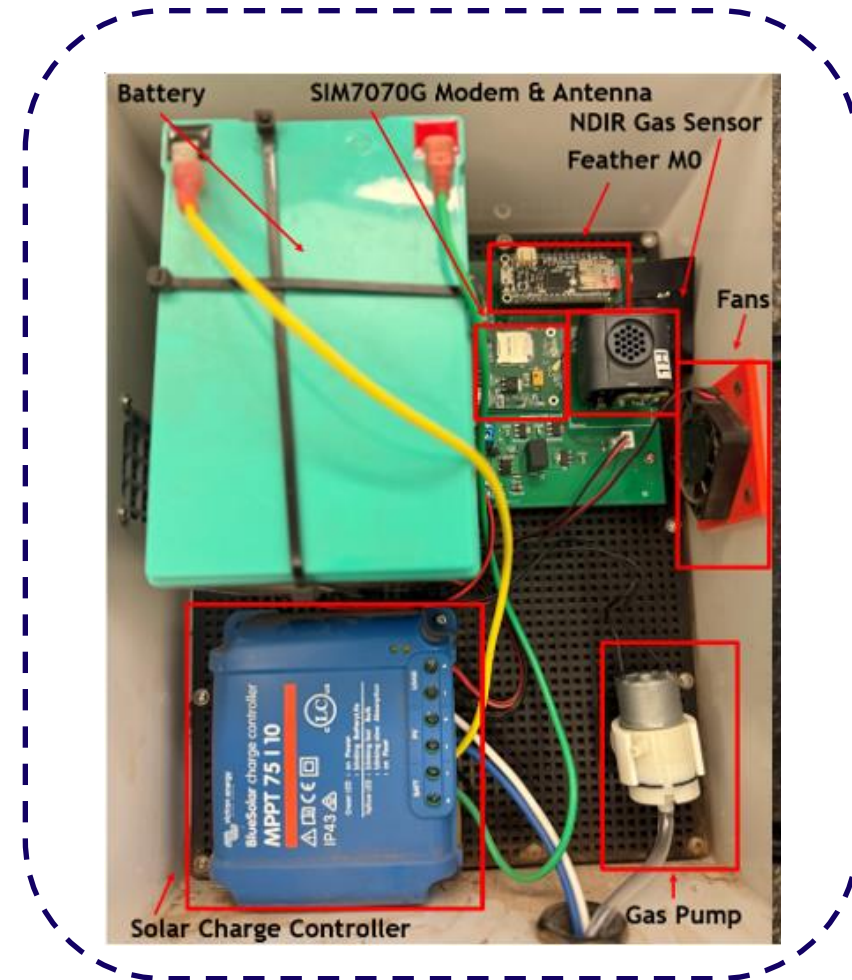
Case Study – WRF-GHG and LES (Large Eddy Simulation) Integration



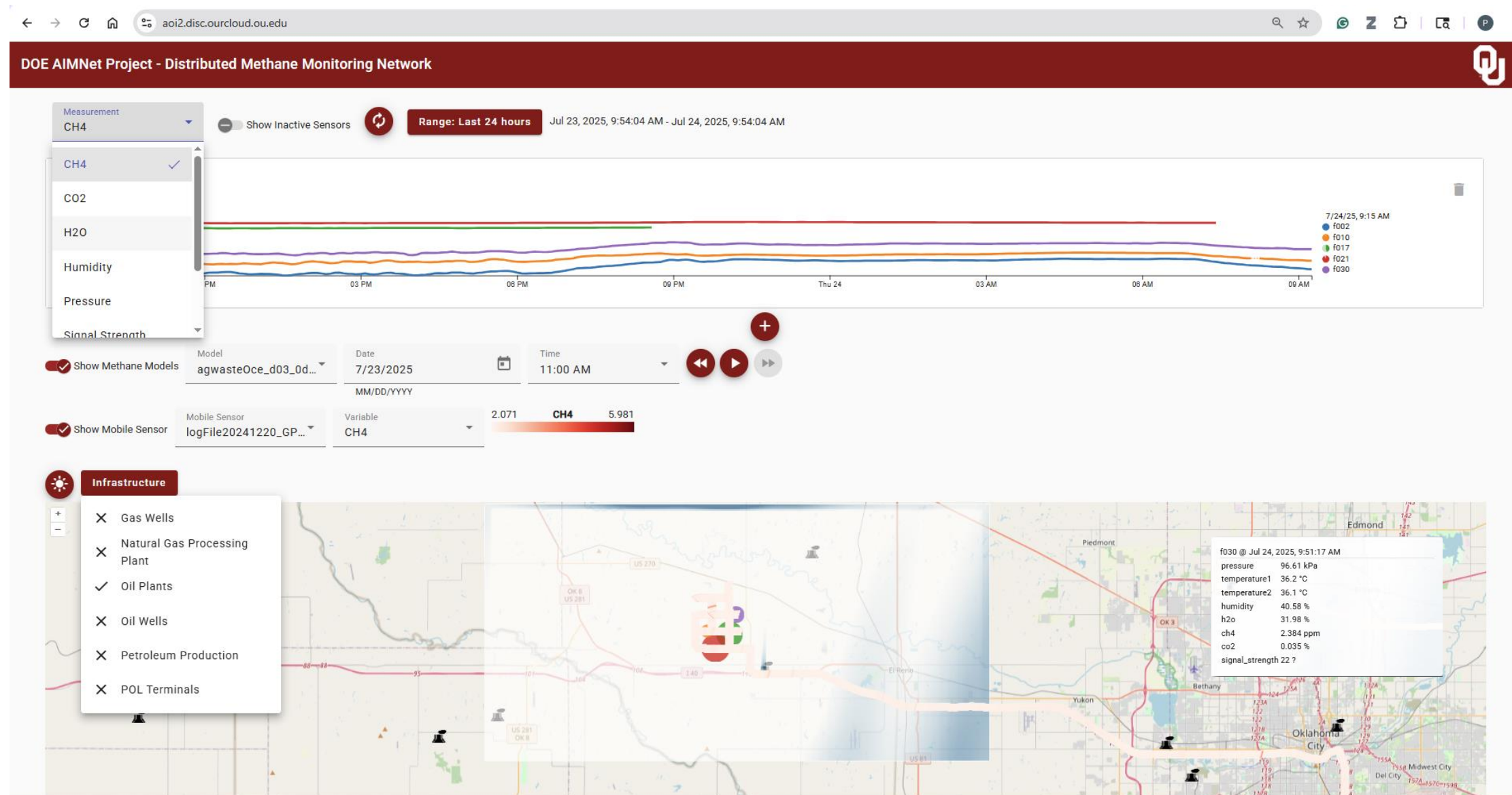
Case Study – Mobile Sensor & Static Sensor



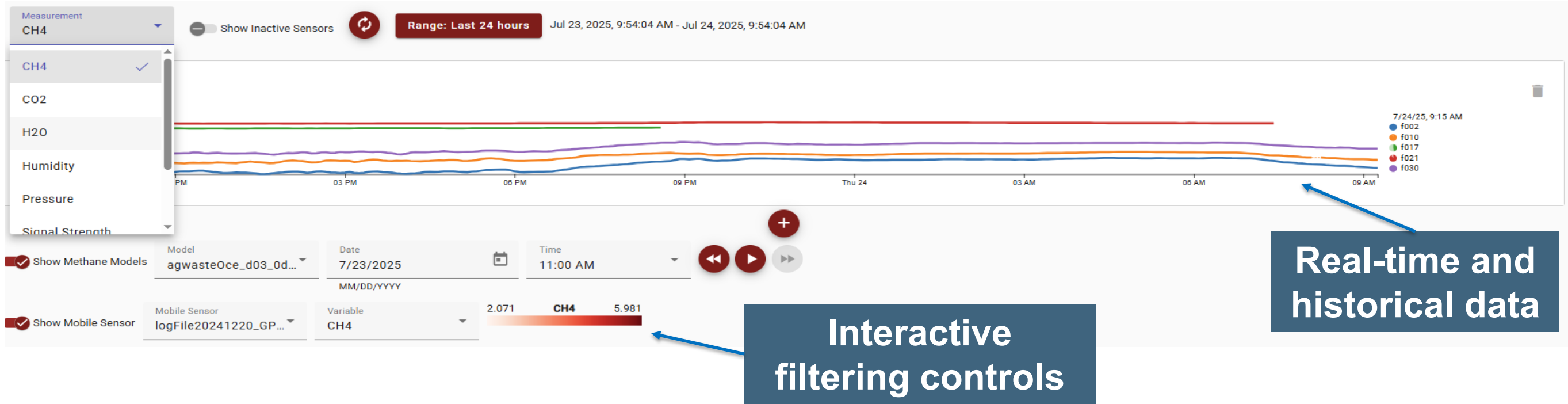
Practical Examples – Static Sensor Deployment in Field Conditions



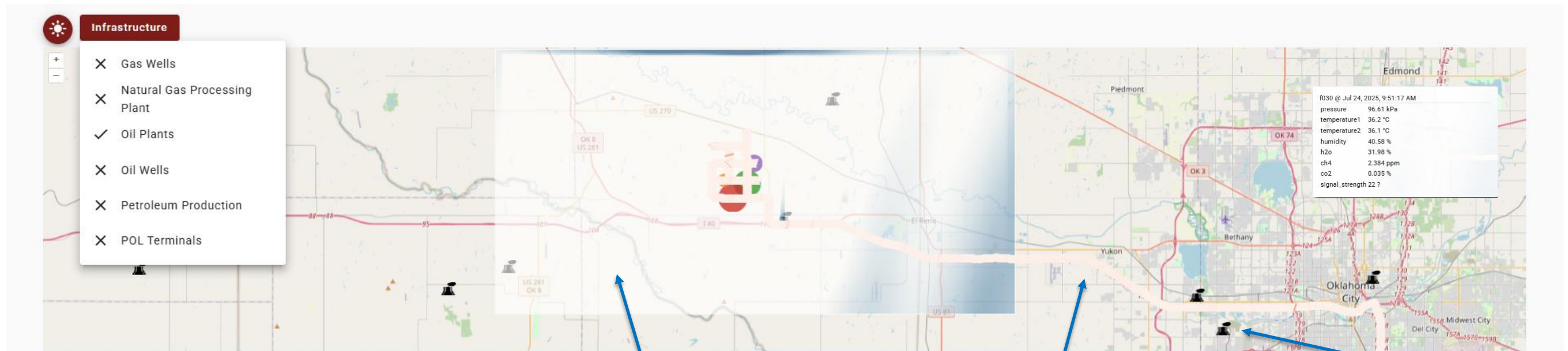
AIMNET Platform – Sensor and Model Visualization



AIMNET Platform – Sensor and Model Visualization



AIMNET Platform – Sensor and Model Visualization



WRF model
visualization

Mobile sensor Data
Integration

Infrastructure
Overlays



Key Takeaways

- **The Challenge:** Individual monitoring methods provide **incomplete coverage**
- **Our Approach:** IMS bridges bottom-up and top-down methods through visual analytics
- **Key Innovation: Modeling** plays a crucial role in **pinpointing** the emission **source** location and intensity
- **Validated Platform:** AIMNET system proven with real-world Oklahoma field data
- **Next Steps:** Scaling to industry partners for continuous regulatory compliance

Thank You For Your Attention

Thanks to the Department of Energy and Data Institute for Societal Challenges for their support



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