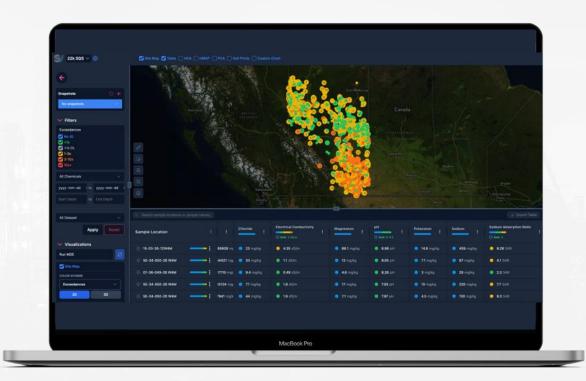


Machine Learning: The Secret Weapon in Unraveling Salinity Source Mysteries at Contaminated Sites to Support Regulatory Closure

> Court Sandau, PhD, PChem, FRSC Co-Founder and Principal Scientist



From raw data to actionable insight.

In a fraction of the time.











Chemistry Matters Inc.

- Niche chemistry consulting company specializing in environmental forensics, geoforensics, and biomonitoring.
- Big environmental datasets have become our specialty to merge chemistry understanding with statistical interpretation
- Virtual office based, located in Canada, US, and UK
- Established in 2011

Statvis Analytics Inc.

- Software company specializing in data and visualization software
- Turning <u>all</u> data and statistics into easyto-understand graphics and pictures
- Environmental data intelligence and our EDI pipeline
- Knowledgebase vs. database
- Helping people communicate science
- Established in 2018



Environmental Data Intelligence Pipeline





Sampling Data Details (32)









How are you collecting your data?

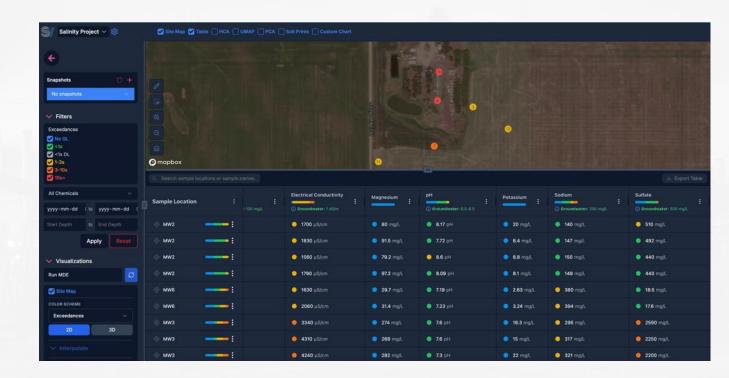
- All information from your site could be important/useful
- All file types
- Human memory is inefficient and can be lost when people leave the company
- Leaving it in your inbox means it could be lost and not part of company knowledge
- Comprehensive as possible
- You have paid for chemical analysis and consulting work and opinions – data should always be available
- Do you have it all?







- Demonstrative dataset only
- Sources and most of the data from a real-world site
- Location of monitoring wells changed to protect the privacy of the site



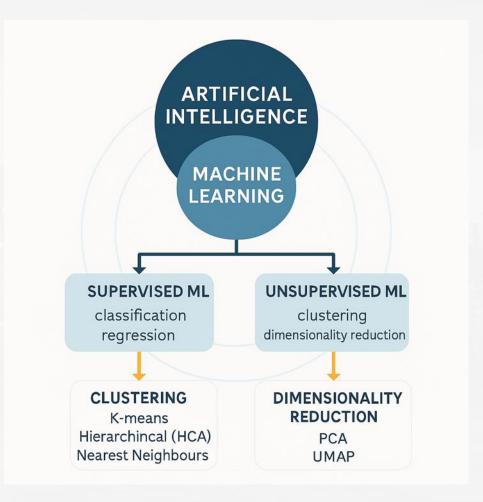


First off – What is Machine Learning?

<u>Artificial Intelligence</u> – computer systems capable of performing tasks that normally require human intelligence – reasoning, learning, decision making

Machine Learning – subset of AI focused on algorithms that learn from data and can make predictions without explicit programming. There can be supervised and unsupervised learning.

Unsupervised does not mean unattended and on its own!









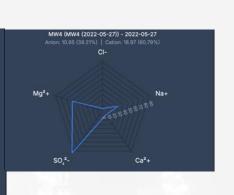
Human vs. Machine



Human vs. Machine

Group 1

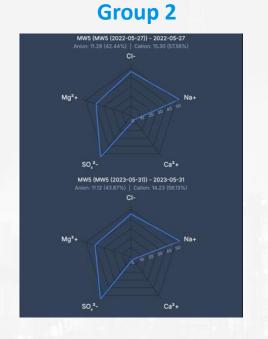




Group 1b

Mg²+

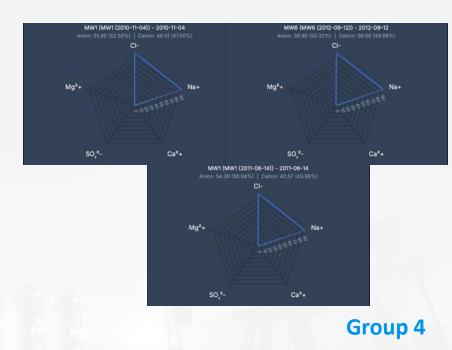
SO,2-



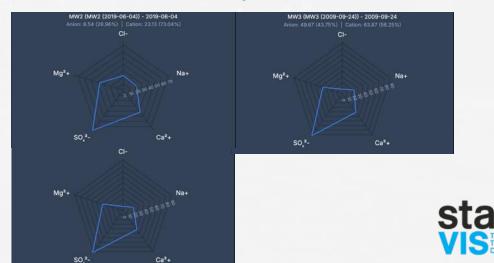
MW2 (MW2 (2009-09-24)) - 2009-09-24

Ca2+

Mg²+



Group 3



Human vs. Machine





* Environmental Data Intelligence Pipeline



Digitize

Create a comprehensive knowledgebase

Extract

Hard data and contextual information



Query

Ask questions to fill or identify data gaps



Analyze

Determine responsibility and risk



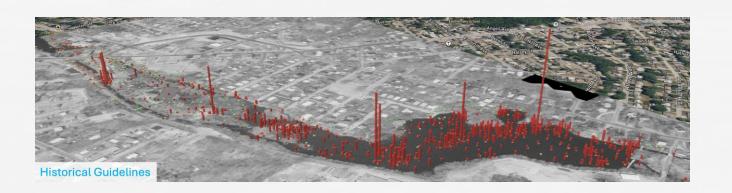
Visualize

Clear messages for stakeholder buy-in



Report

Automatically generate built-for-purpose deliverables







- Oil and Gas produced water, drilling fluids, leaks mostly NaCl
- Road Maintenance and Deicing NaCl and CaCl₂ applied for ice control and end up near roads and waterways due to runoff
- Agricultural Fertilizers application of K, Ca, NH₄ chloride fertilizers
- Natural Saline Soils dissolved salts from glacial till and bedrock deposits carried to surface by water and water evaporates









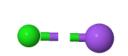
What is there to Fingerprint?

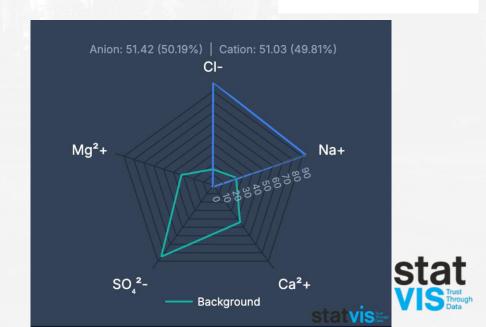
 Using normalized (major) cations and anions and simple radar plot

Radar plots can be used to:

- Can overlay most likely background samples for comparison
- Visualize fingerprints of background and impacted samples (various sources)
- Human Validation of UMAP and HCA branches based on radar plot similarities
- Identify major salinity cations/anions in various sources

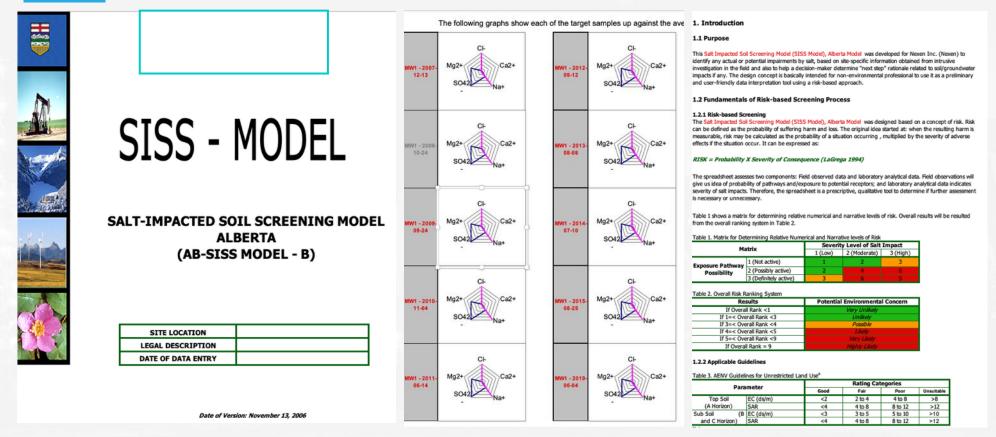






96

Began Using Salinity Fingerprints in 2006

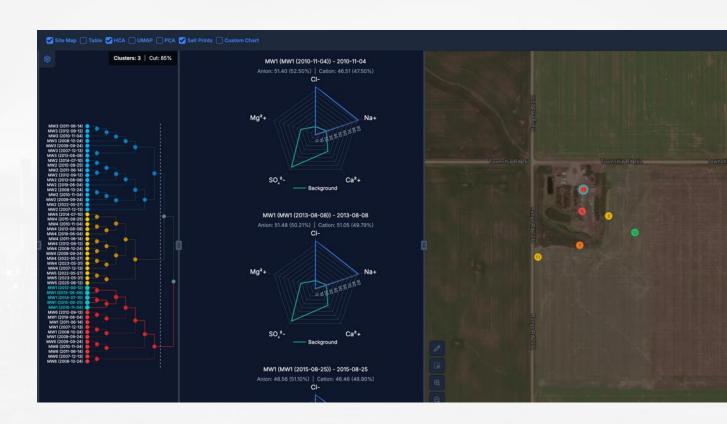


- Developed salinity fingerprinting to evaluate risk at salt impacted sites
- First time using radar plots as a tool to identify background impacts (above guidelines) from produced water impacts



Know your sources for your site:

 Impacted NaCl spill / release with a dominant Na/Cl presence





Know your sources for your site:

- Impacted NaCl spill / release with a dominant Na/Cl presence
- Less Na, More Ca/Mg





Know your sources for your site:

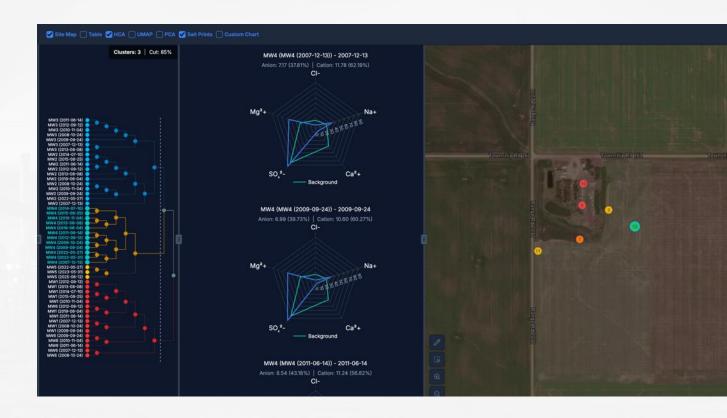
 Background salinity pattern with a Ca/Mg/Na Sulfate dominant pattern





Know your sources for your site:

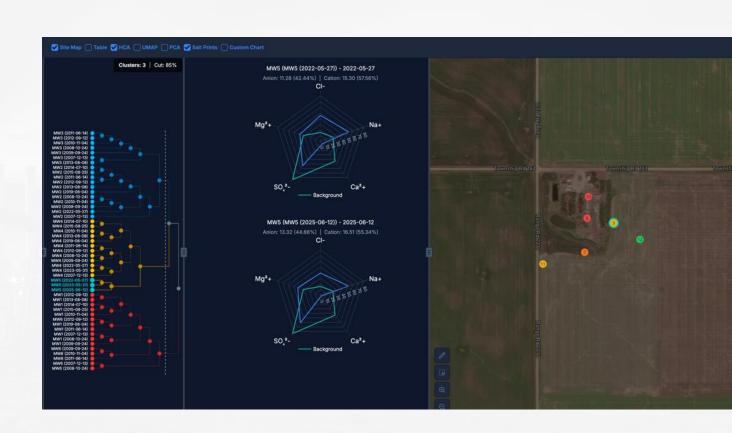
Mg/Na sulfate dominant pattern





Know your sources for your site:

 Mixed pattern having NaCl on top of background



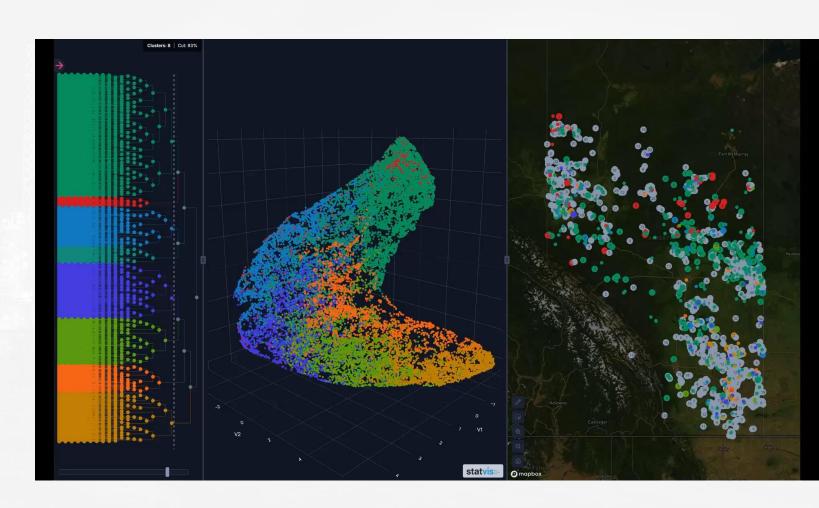
Interactivity of HCA, UMAP/PCA, fingerprint graphs (radar plots/histograms) and geospatial awareness



Alberta

*. Alberta Background Database Project

- Master dataset for the project contains 224,902 records with EC, SAR, Cl, SO4, Mg, Ca, K, Na.
- 74,943 samples remained after data exclusions
- Applied ML salinity forensic workflow
 - Identified chloride data node, which was removed to be conservative

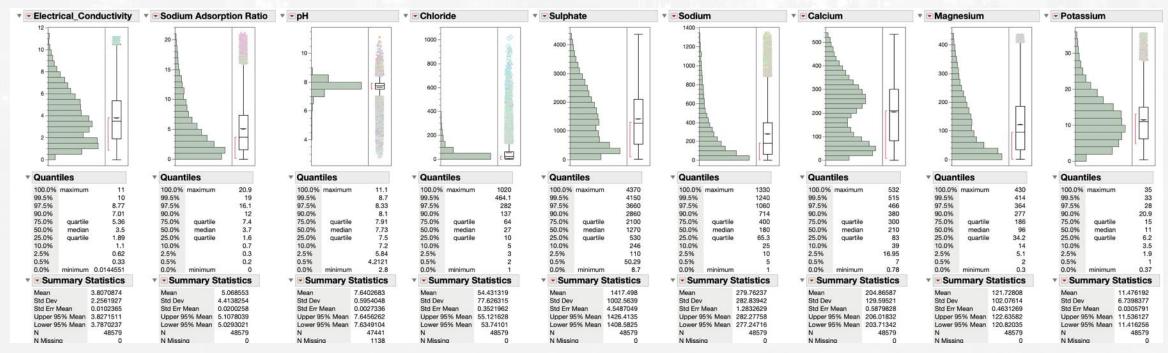




Albe

Alberta Background Database

- 48,579 data records remained to characterize background salinity patterns and levels in Alberta
- 5 primary patterns of natural salinity in Alberta

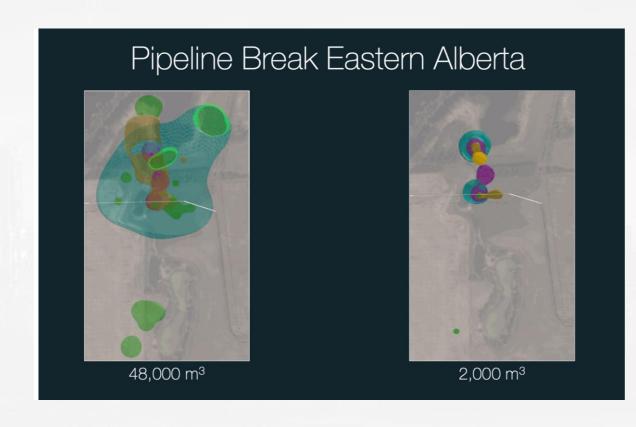






. Keys to Regulatory Closure

- Transparency
 - Is anything missing (hiding anything)?
 - Statistics, summaries, graphs all validated
- Communication
 - What is written matches the data supplied
 - Any data gaps or anything left to interpret?

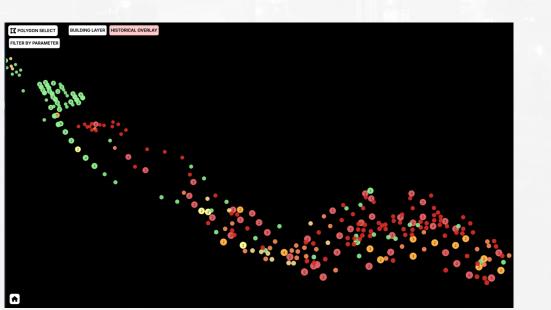


Statvis can provide portal (website) to regulator/client/opposing counsel and experts for maximum transparency



Conclusions

- All contaminants have chemical fingerprints that can be used to identify sources, even salinity
- ML tools can process large (and small) datasets through workflows that can confidently identify sources
- Users of ML need to understand (and potentially defend) those identifications



• It needs to be communicated effectively to client, regulators or opposing parties





Thank you for your attention

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