

# Show me the data\*

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\*clean, standardized, documented, data in an API for sustainable groundwater management

# Team

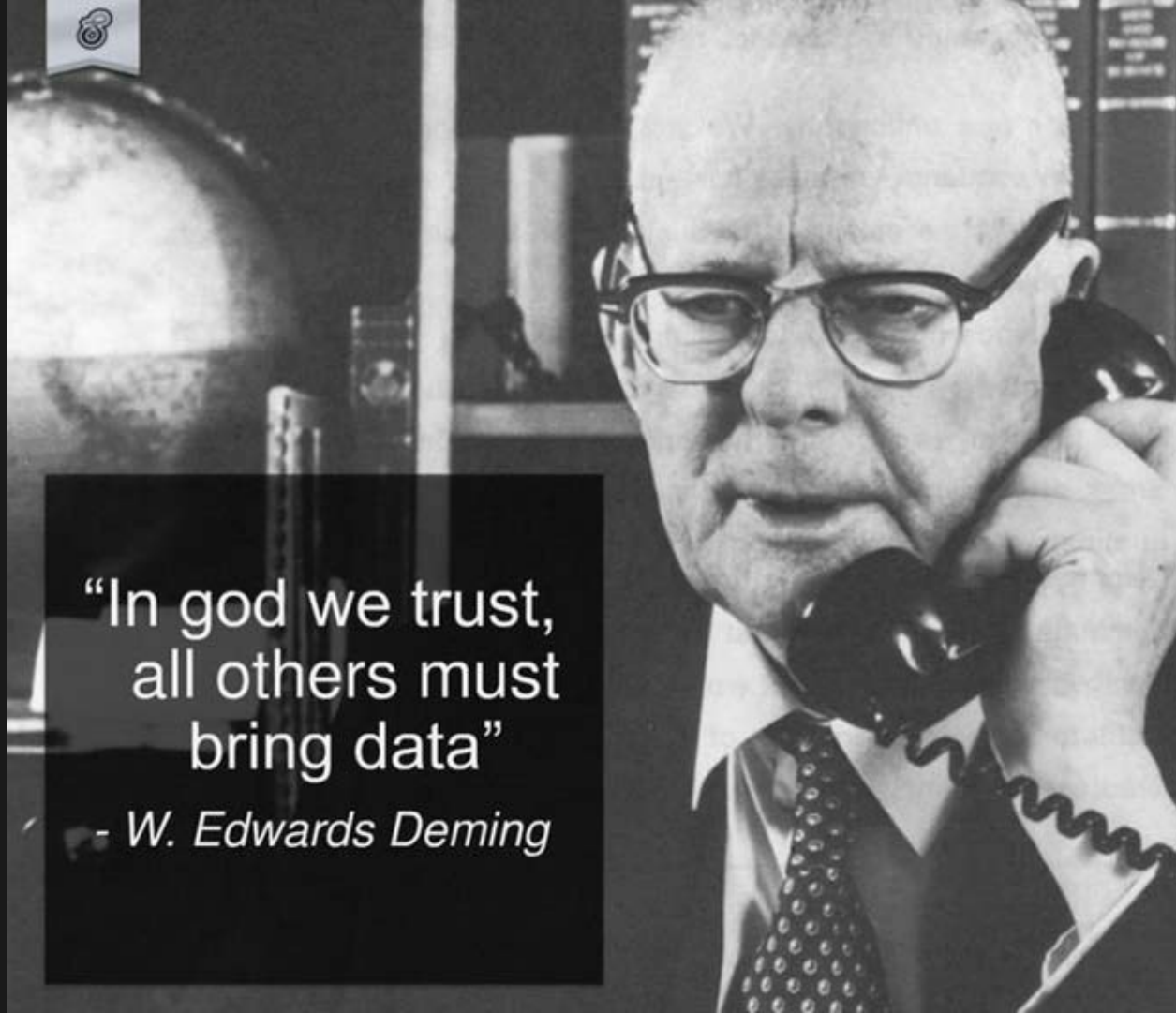
Helen Dahlke  
Graham Fogg  
Alvar Escriva-Bou  
Amanda Fencel  
Hervé Guillon

**UCDAVIS**



"In god we trust,  
all others must  
bring data"

- *W. Edwards Deming*



# Agenda


1. The Challenge
2. Open data alone won't save us
3. Domestic well failure
4. Transformative technologies
5. Take away message




# 2040

 The Challenge: 5,000 days to groundwater sustainability

# 7,437

 The Challenge: 5,000 days to groundwater sustainability

# 5,298

 The Challenge: 5,000 days to groundwater sustainability

# Why [open] data?

Data of the right **type** and **amount**  
**constrains our uncertainty**  
of the systems we manage in order to  
**make critical decisions.**

Open data alone won't save us



# Open data isn't enough

We need to **use** data to constrain uncertainty and make critical decisions.

Thoughtfully prepared data:

- Clean
- Standardized schemas for optimized queries
- Clear documentation
- API



Open data alone won't save us



# bit.ly/drywells

**Problem:** 2,027 dry wells during 2012-2016 drought, impacting underserved communities.

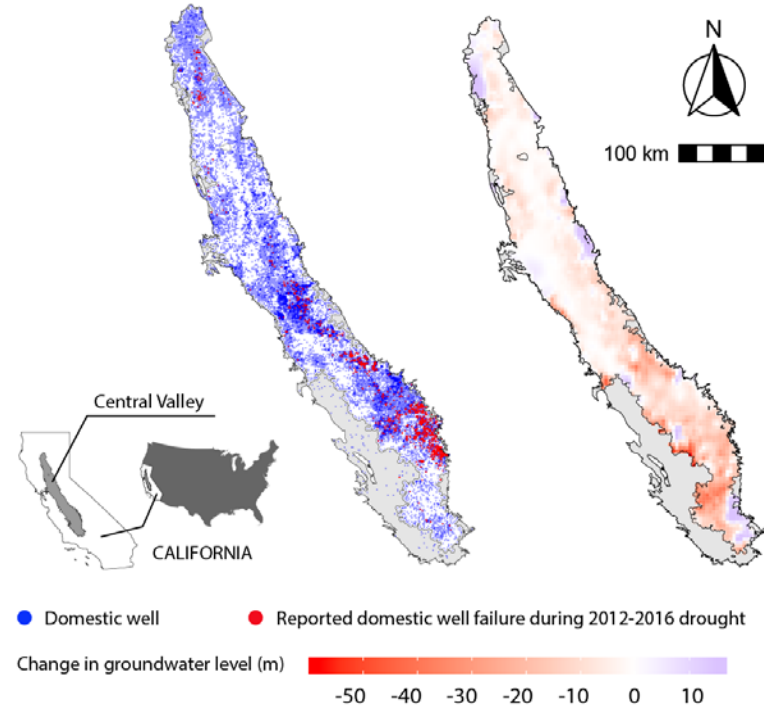
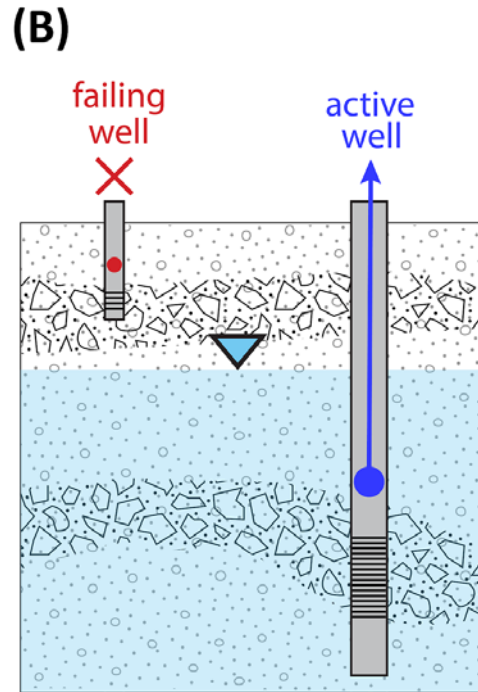
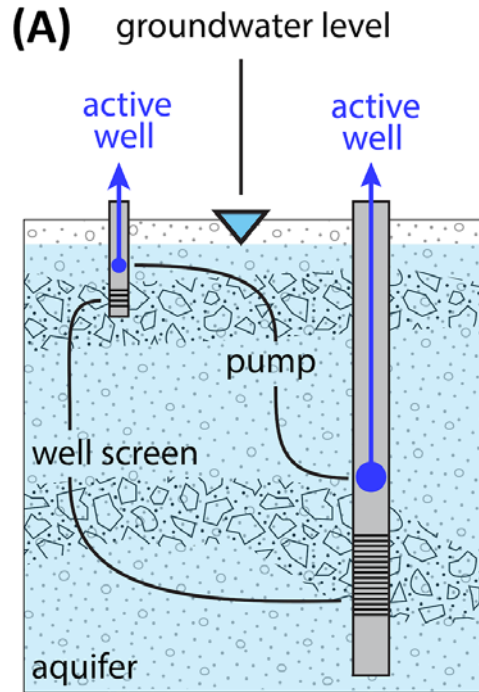
**Approach:** use open data, AI, and domain knowledge to predict observed well failures, and forecast future well failures.



Donna Johnson, 70 (L) lifts pallets of donated bottled water from the back of her truck during her daily delivery run to residents whose wells have run dry, with resident Gabriel Tapia, 31, in Porterville, California October 14, 2014. Picture taken October 14, 2014. Photograph: Reuters/Lucy Nicholson.

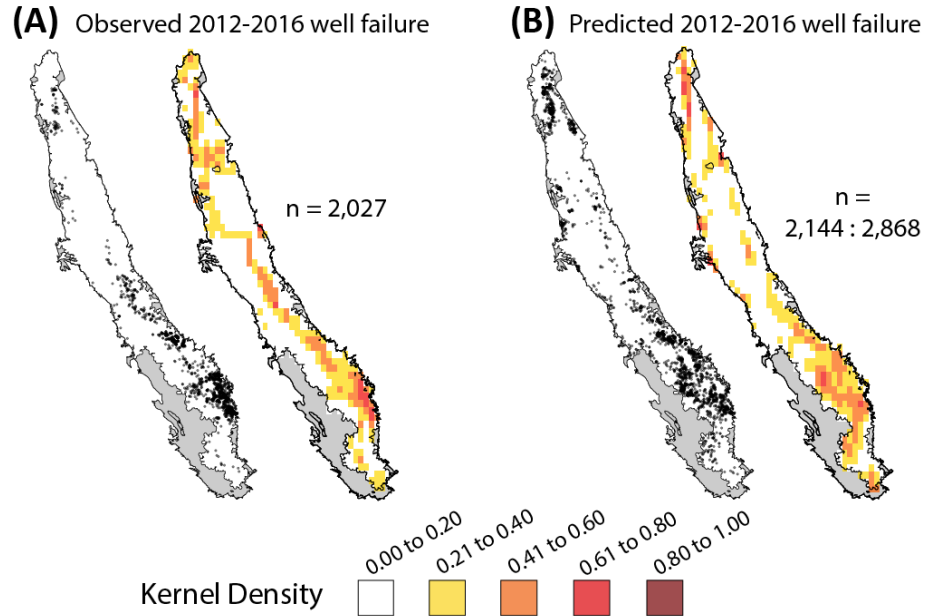
Domestic well failure: an example of ***open data for groundwater sustainability***

# How does a well go dry?



Domestic well failure: an example of *open data for groundwater sustainability*

# Dry well predictions



Domestic well failure: an example of *open data for groundwater sustainability*

# Data Debt

	<i>Open</i>	<i>Clean</i>	<i>Standardized</i>	<i>Metadata</i>	<i>API</i>
Well construction					
Observed dry wells					
Groundwater level					

Domestic well failure: an example of ***open data for groundwater sustainability***

# Technologies that will transform sustainable groundwater management

- APIs (data infrastructure)
- AI
- Internet of things (IoT)
- Cloud computing
- Remote sensing
- Blockchain (smart contracts)

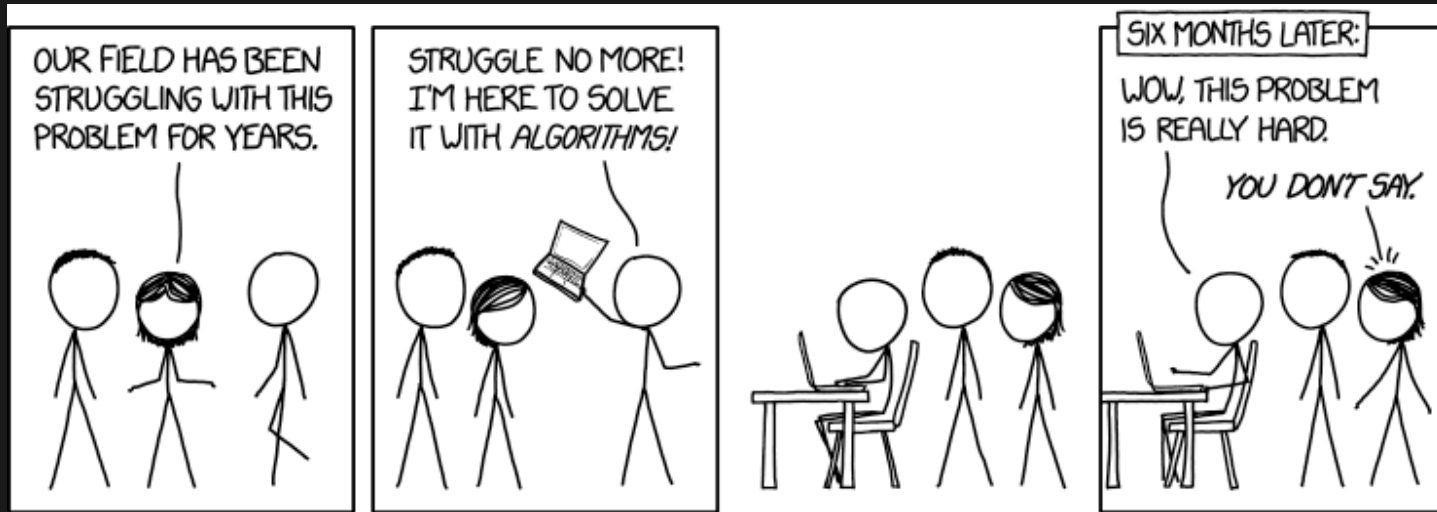
# Technologies that will transform sustainable groundwater management

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# Beware

All the data and AI in the world won't replace domain knowledge.

Domain knowledge alone won't save us either. **Combining the two will.**



# Summary

- 5,000 days to sustainable groundwater management in California. Make sound data decisions now to improve outcomes tomorrow.
- Open data is a good start, but it's not enough.
- Avoid data debt by making useful data. Useful data is clean, standardized, documented, and accessible via programming languages (API).
- Neither Data/AI or domain knowledge alone is enough. We need both.
- We must build a culture of data literacy to achieve groundwater sustainability.



# Thank you.

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