

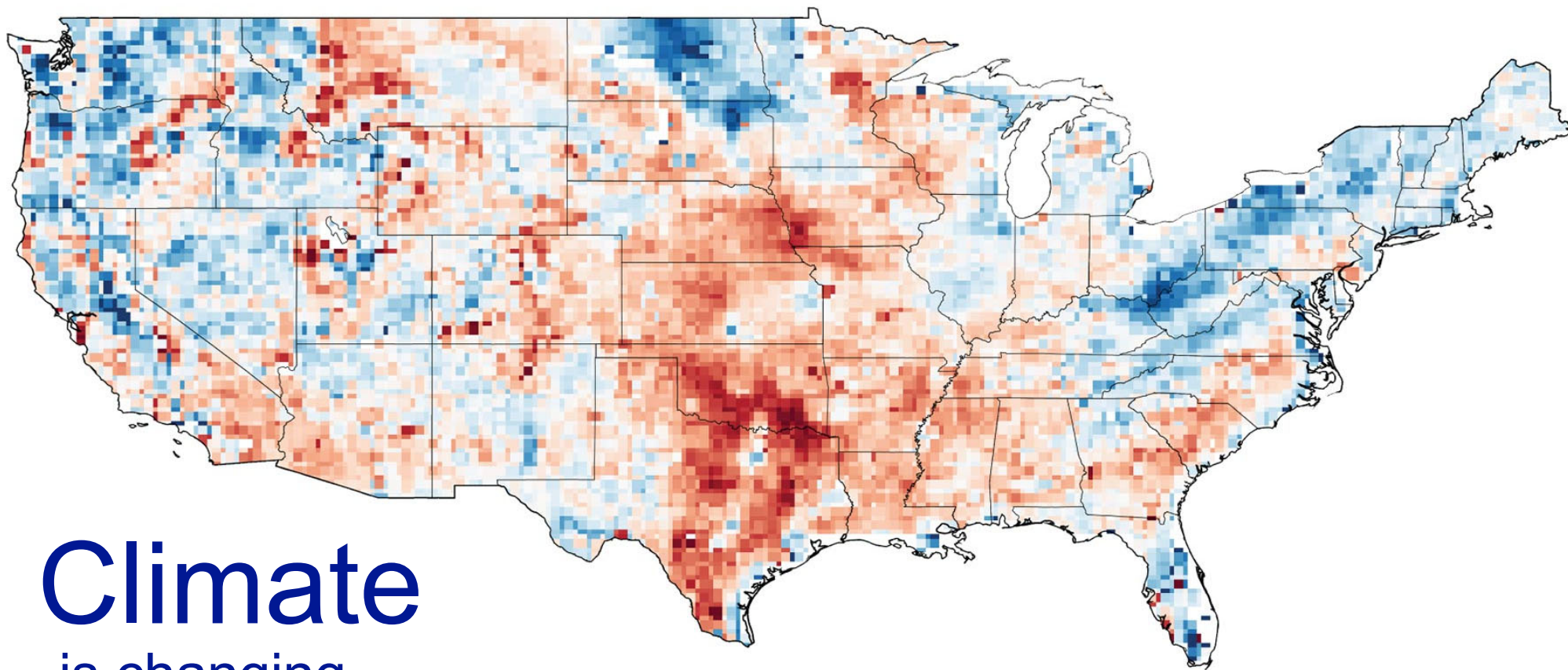


# What I Learned When I Stopped Worrying and Embraced Future Uncertainty

Prof. Casey Brown  
University Of Massachusetts, Amherst  
[casey@umass.edu](mailto:casey@umass.edu)

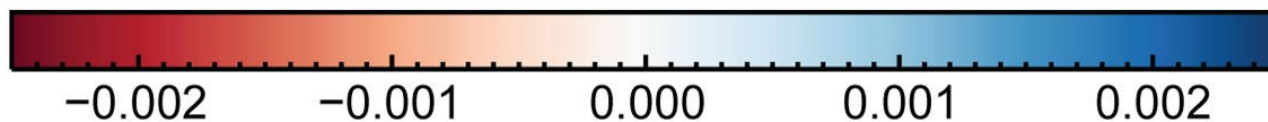
# Outline

- Why worry?
- What can we expect from climate change?
- How can we make good adaptation decisions?
- Example: WRF Study – Long Term Vulnerability Assessment for SF Water



# Climate is changing

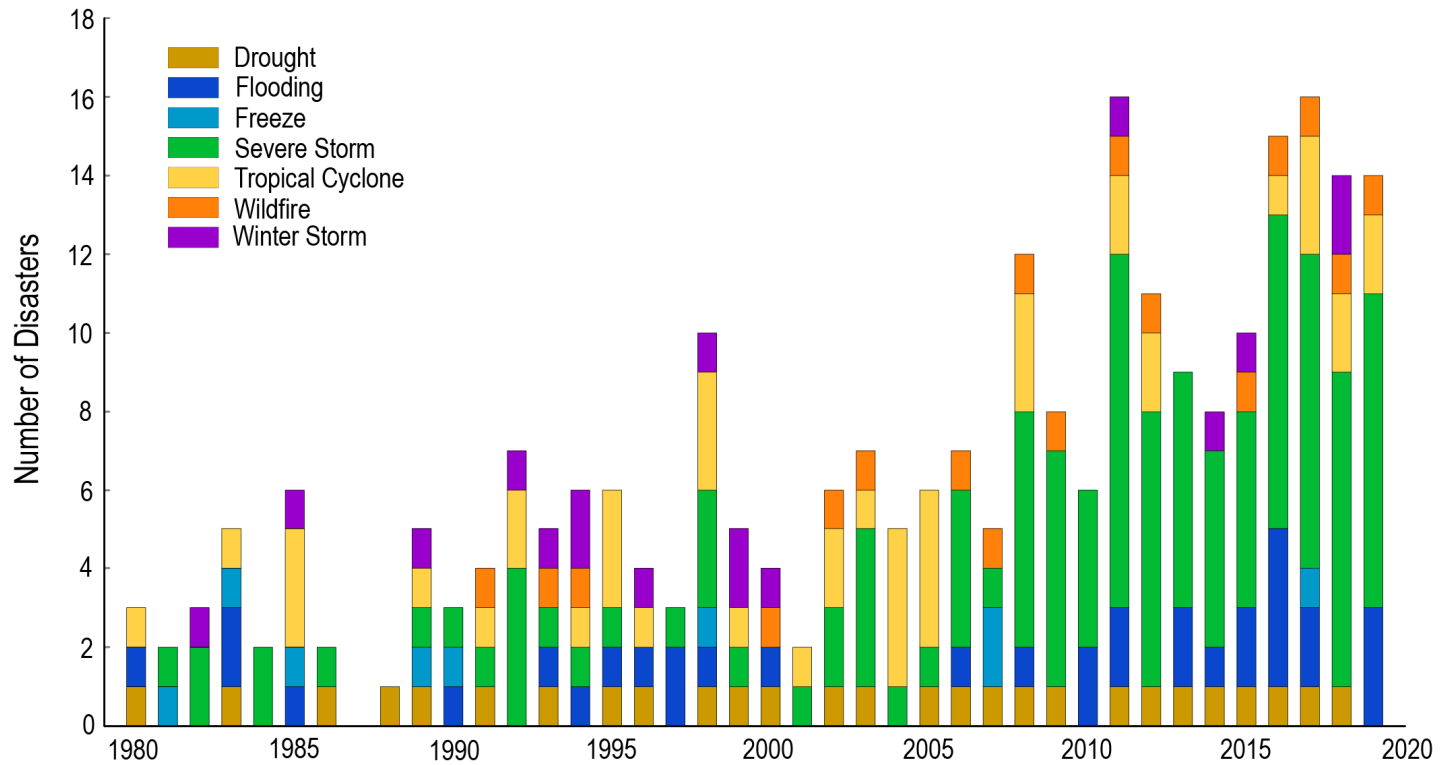
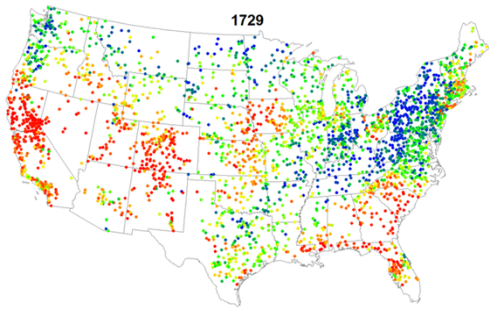
Change in soil moisture ( $\text{m}^3 \text{m}^{-3} \text{y}^{-1}$ )



# \$450 Billion

Projected Per year water damages

U.S. Billion-Dollar Disaster Events Types by Year





**\$3 Trillion**

investment  
needed



**Society is exposed**

# Cloud-based Vulnerability Self-Assessment



Convergence Accelerator  
TRACK D | 613



**Upmanu Lall**  
Columbia University



**Casey Brown**  
UMass Amherst



**Alexa Bruce**  
UMass Amherst



**Baptiste François**  
UMass Amherst



**Fred Boltz**  
UMass Amherst



**Emily Kumpel**  
UMass Amherst



**Jimi Oke**  
UMass Amherst



**Sungwook Wi**  
UMass Amherst



**Jay Taneja**  
UMass Amherst

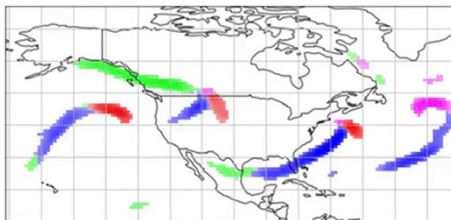


**Ken Kunkel**  
North Carolina State  
University

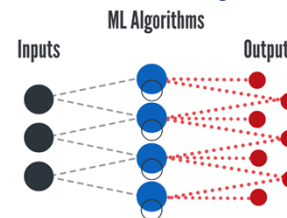


**Scott Steinschneider**  
Cornell University

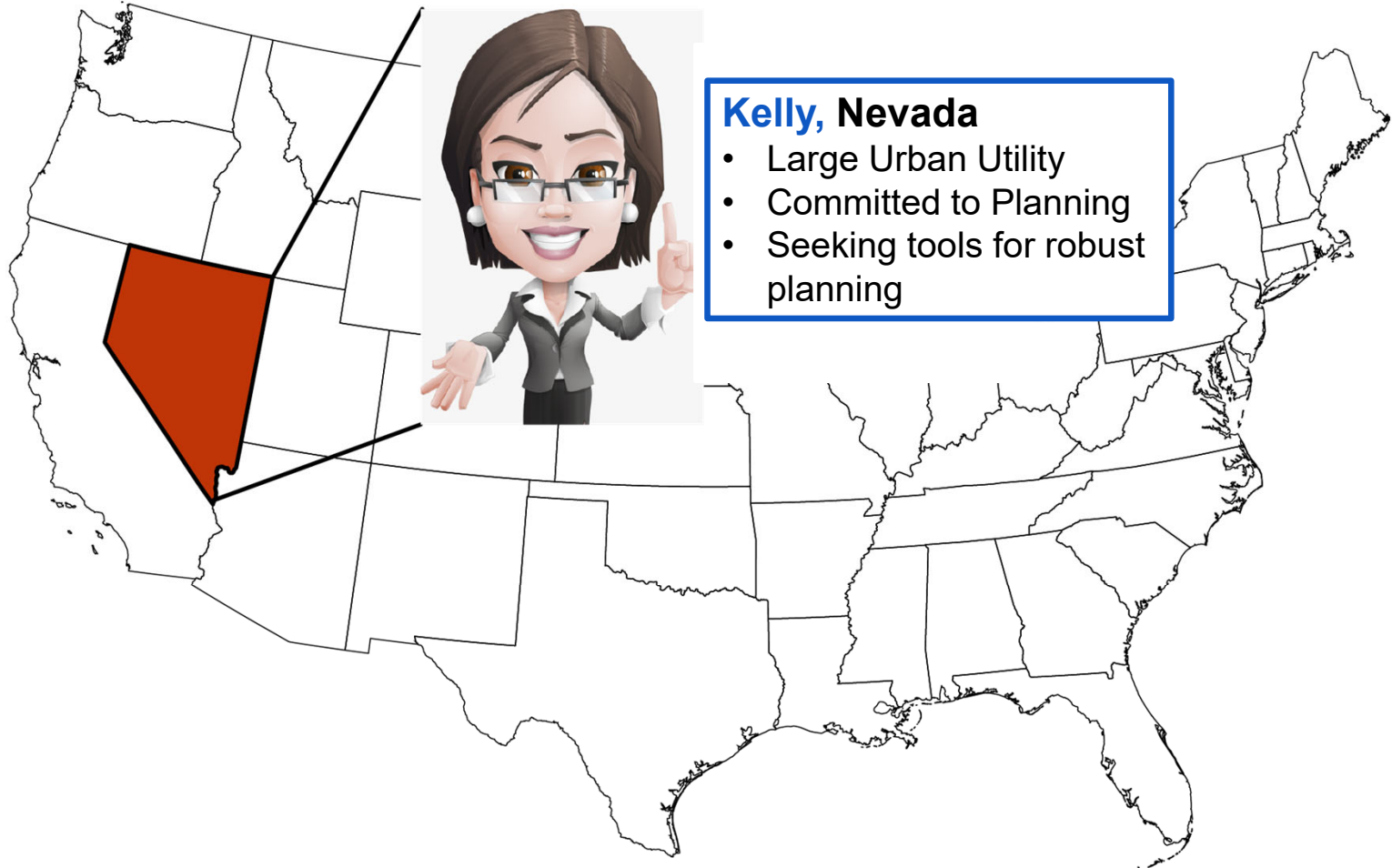
**Climate Forecasts**  
Space-Time Machine Learning



**Hydrologic Simulation**  
LSTM Artificial Intelligence Model



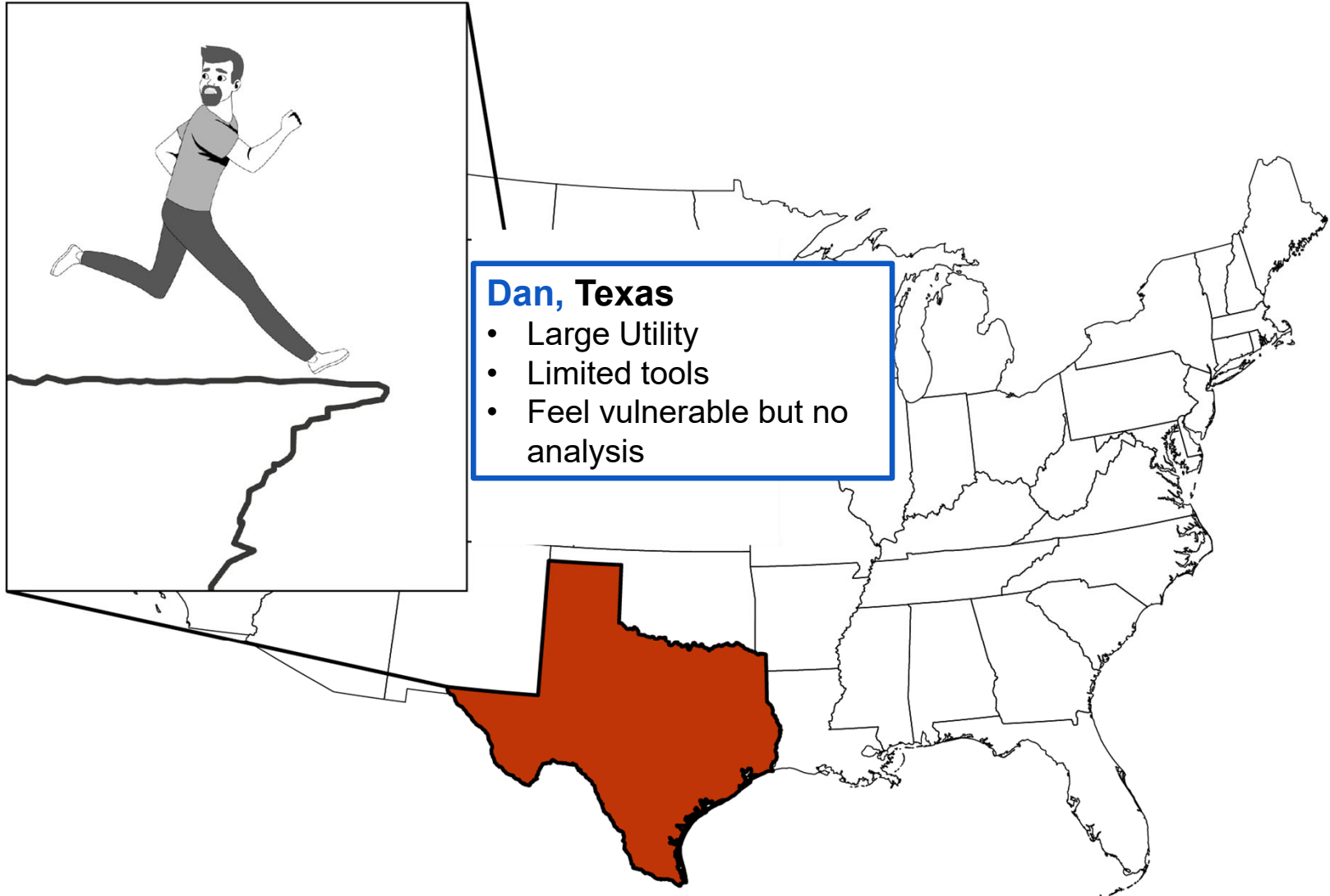
**Water System Model**  
Emulator/Synthetic Data Training



**Kelly, Nevada**

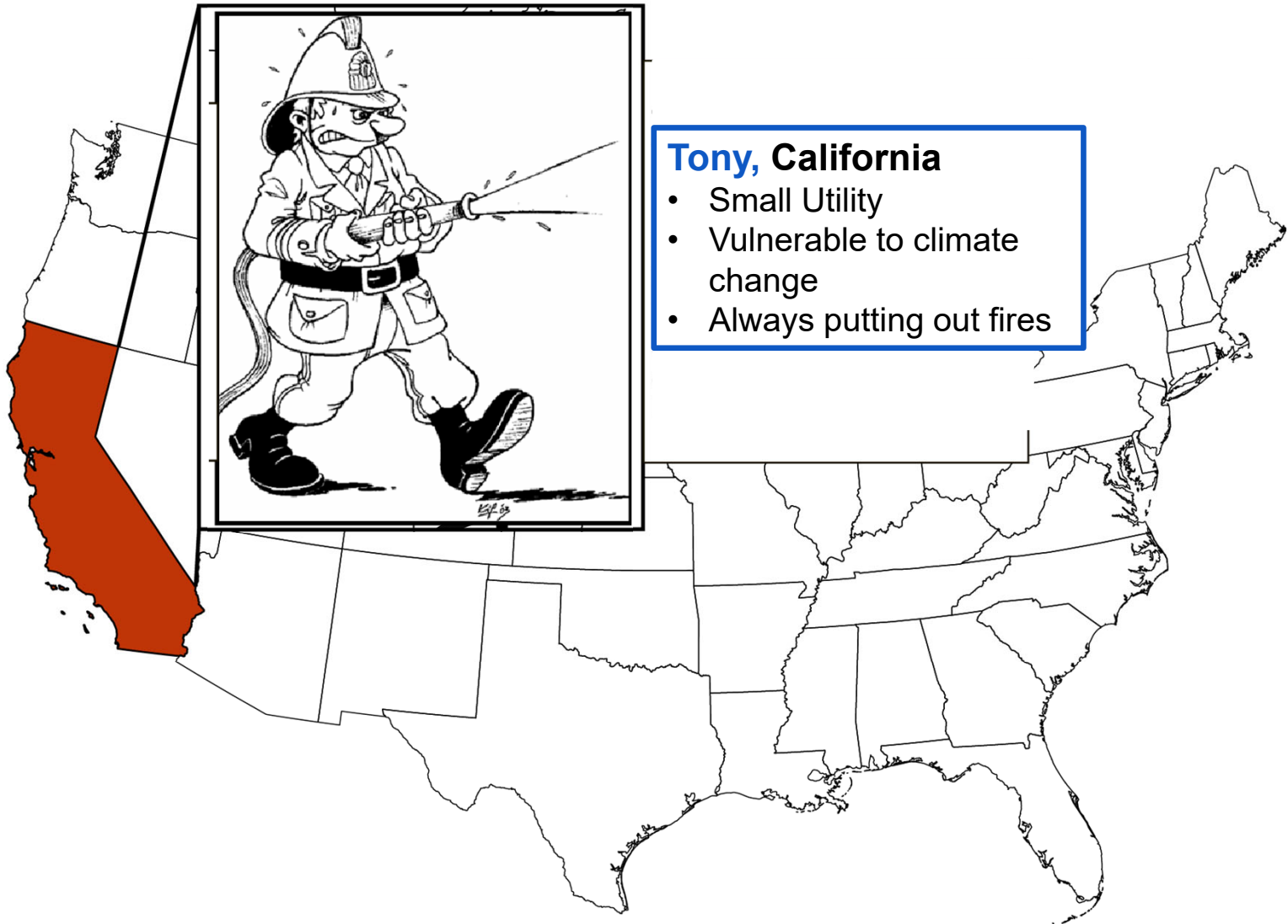
- Large Urban Utility
- Committed to Planning
- Seeking tools for robust planning





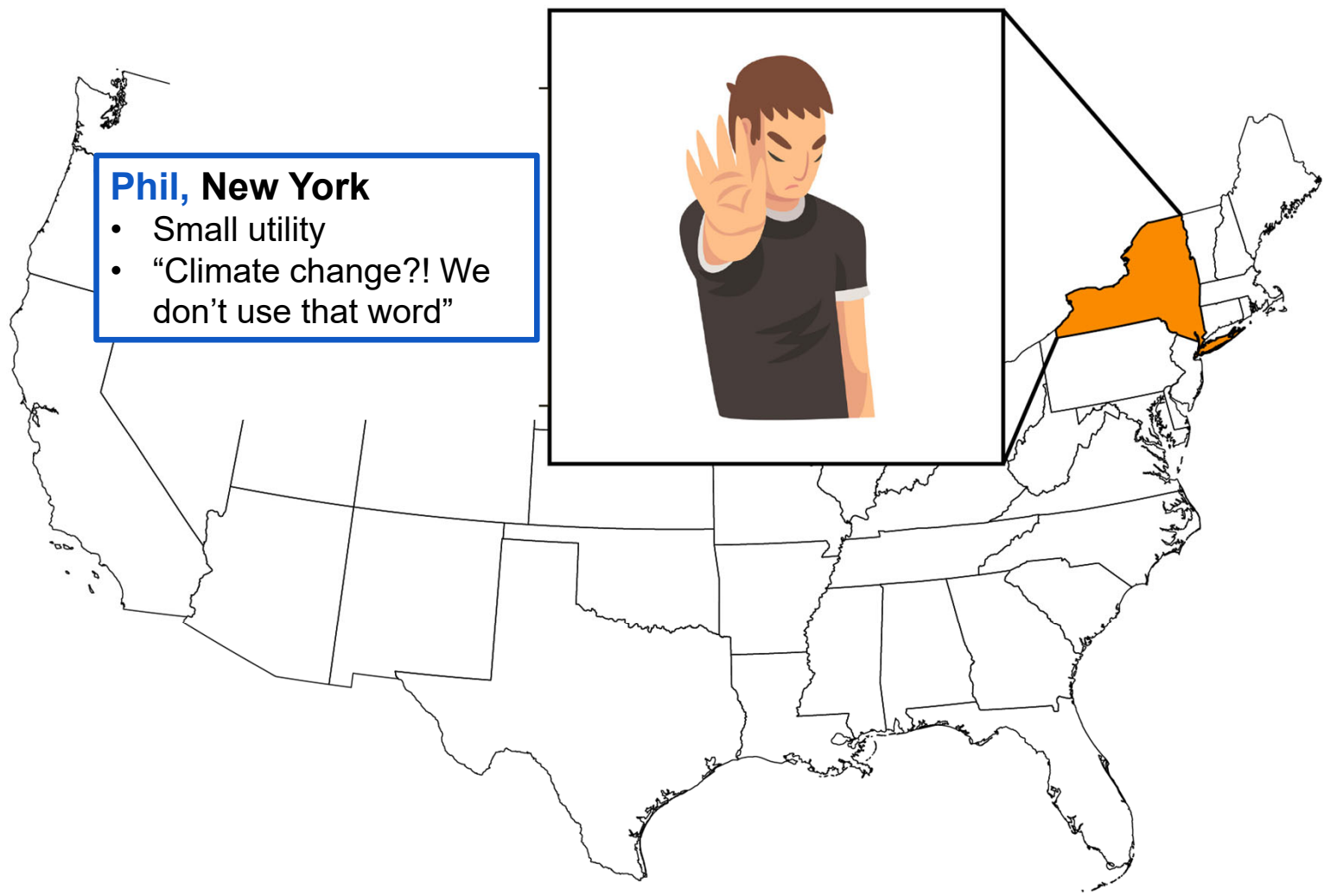
**Dan, Texas**

- Large Utility
- Limited tools
- Feel vulnerable but no analysis



**Tony, California**

- Small Utility
- Vulnerable to climate change
- Always putting out fires



**Phil, New York**

- Small utility
- “Climate change?! We don’t use that word”



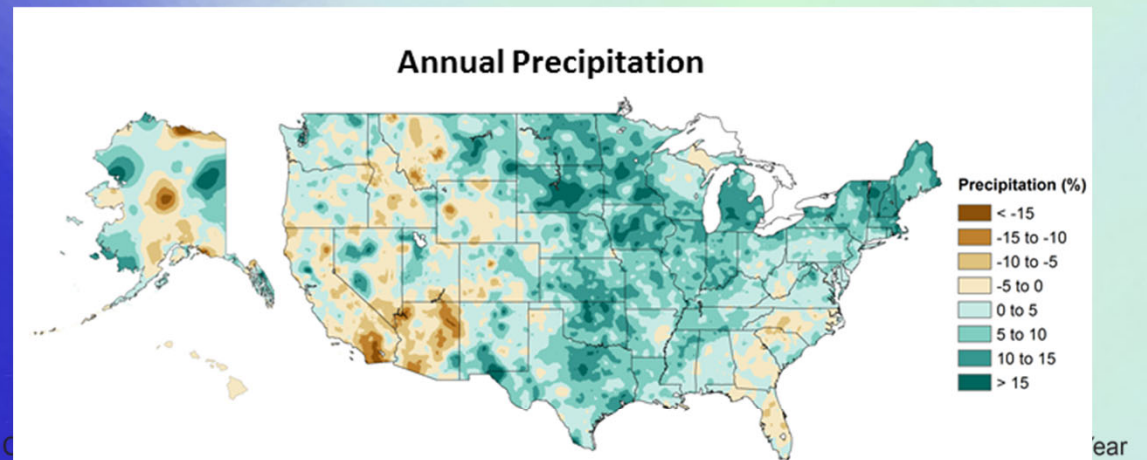
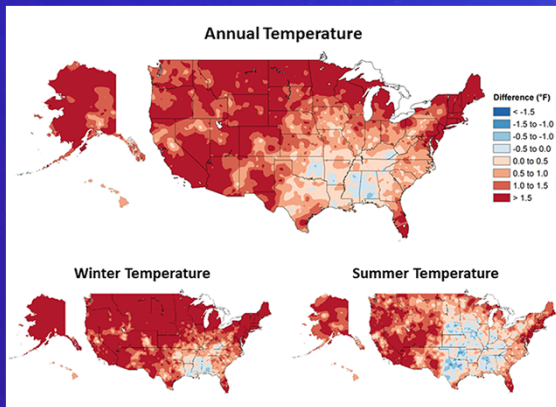
### Vince, Alabama

- Medium utility
- “Running a water utility is like playing whack-a-mole”

# Planning. Digital. People.

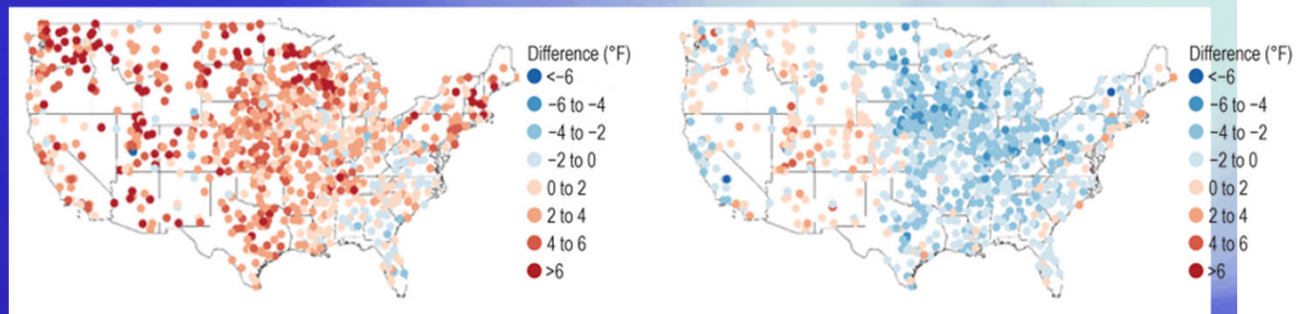
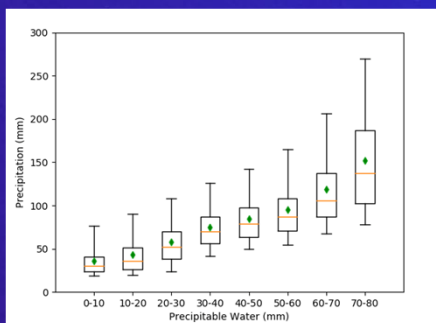
- Planning is often undervalued or non-existent
- Limited data analysis and use of “digital twins”
- People. People. People.
  - Reliance on consultants
  - Silos and impediments to innovation
  - Retirement

# What can we expect for climate change?



1986–2016 Average Minus 1901–1960 Average

1986–2016 Average Minus 1901–1960 Average



# Summary of Robust Climate Changes

[Observations + Theory + Projections = Robust]



TEMPERATURES ARE  
INCREASING



PRECIPITATION  
INTENSITY INCREASING



LESS SNOW

# How do you make good adaptation decisions?





# Making Good Adaptation Decisions



**Become financially robust**



**Evaluate performance over many possible futures**

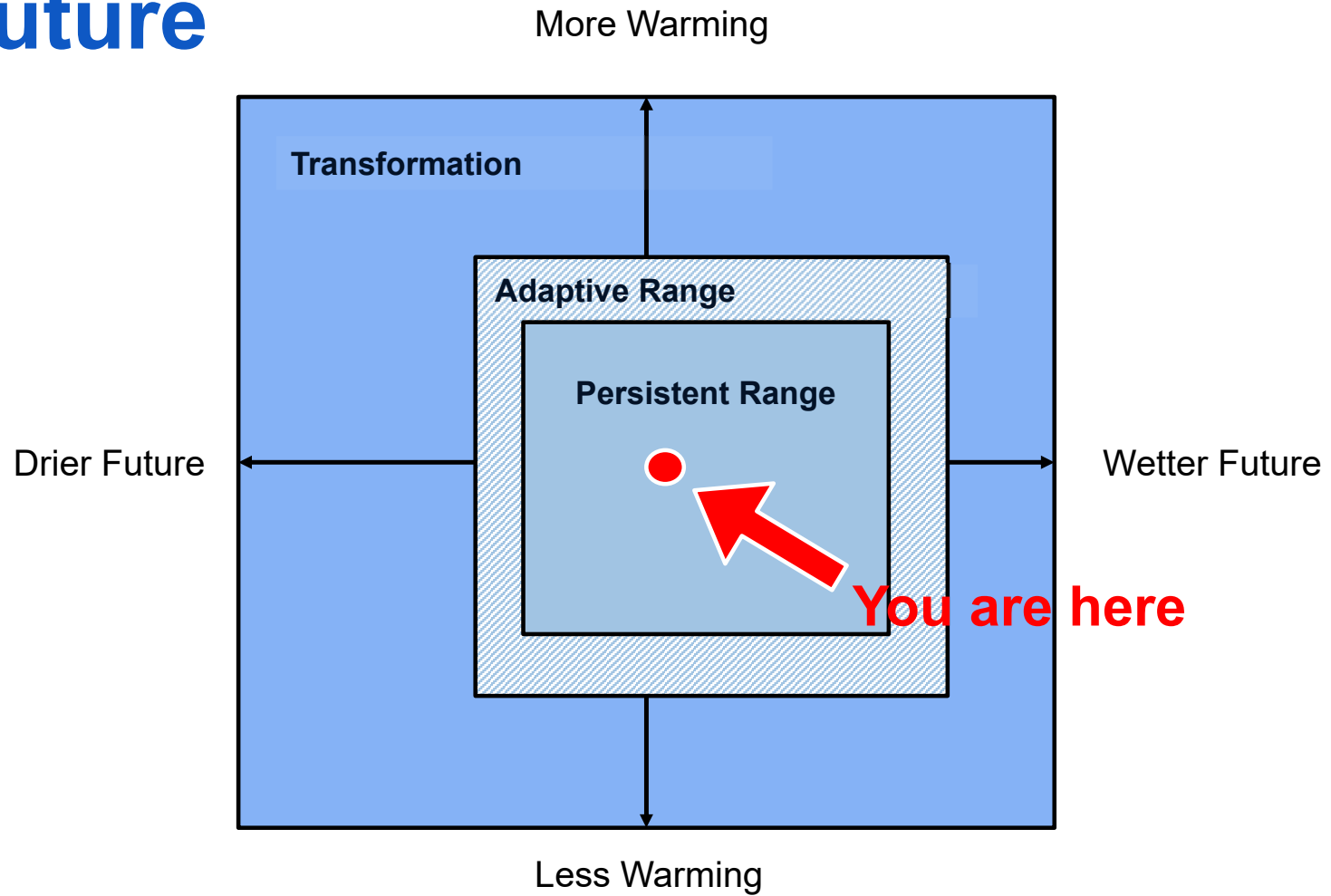


**Understand your vulnerabilities**



**More resilient with every decision**

# Your Future



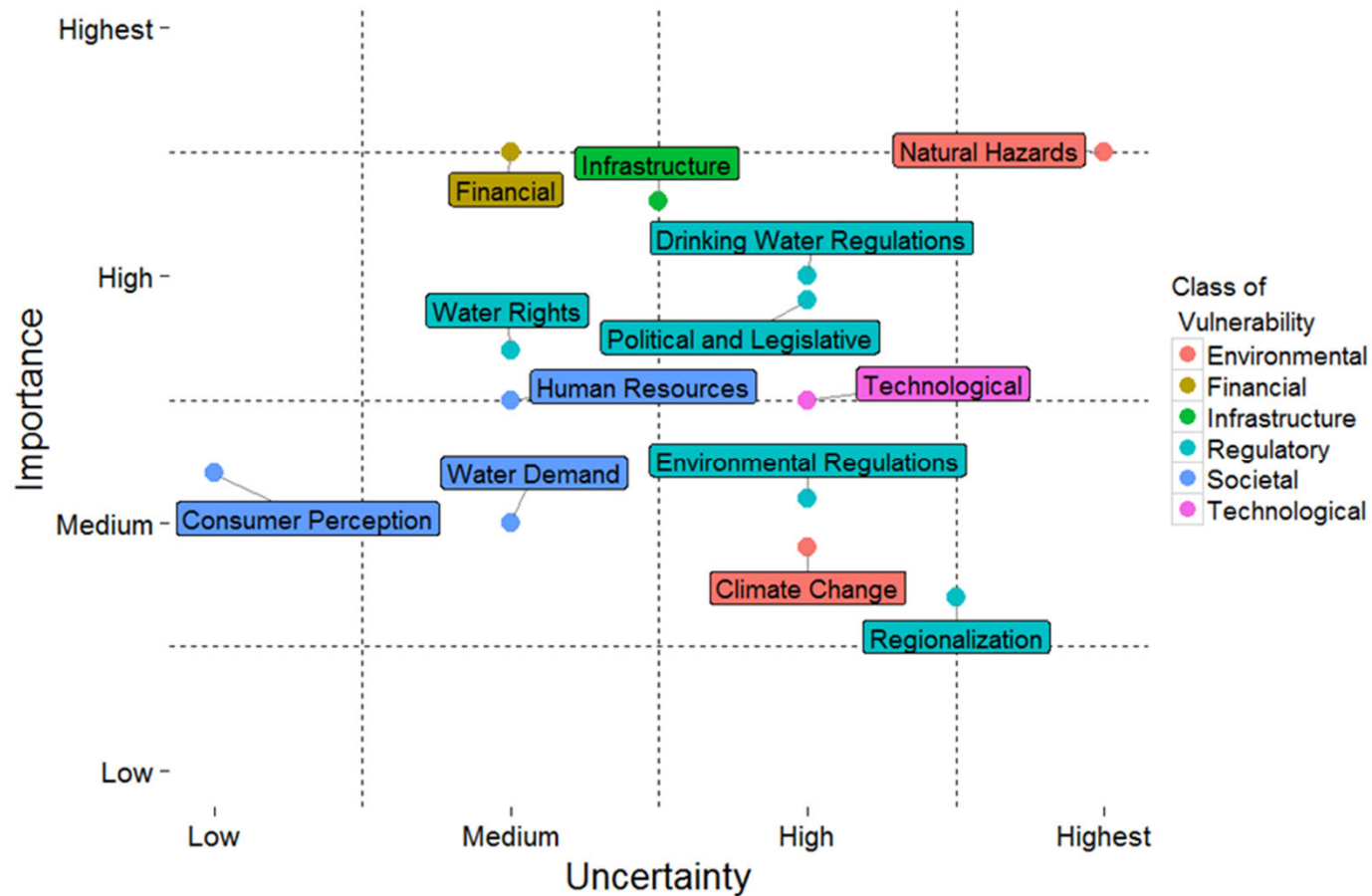


PROJECT NO.  
4703

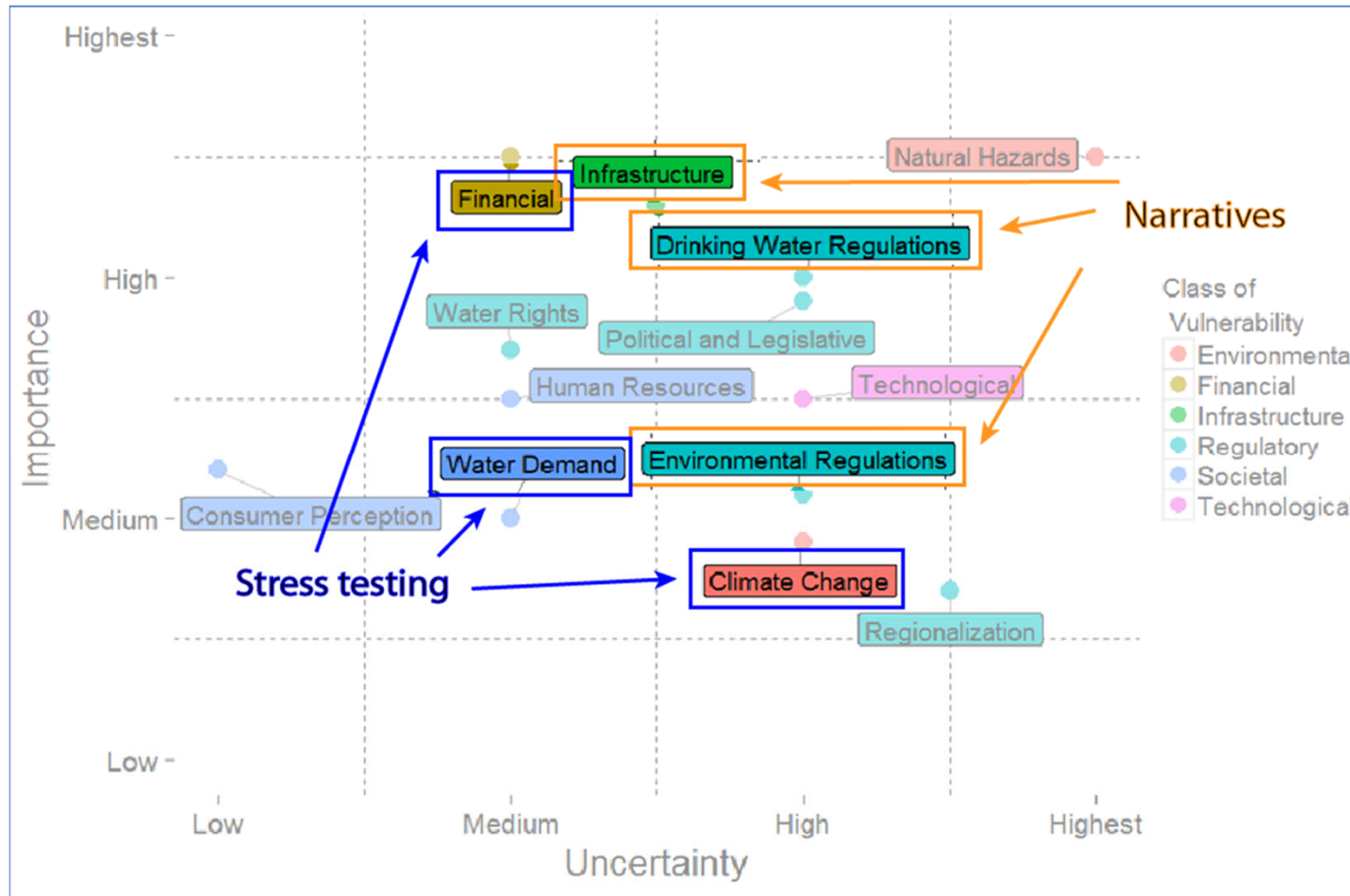
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# Long Term Vulnerability Assessment and Adaptation Plan for the San Francisco Public Utilities Commission Water Enterprise - Phase I

# Selecting the Key Uncertainties



# What are the most important sources of vulnerability?



# Why is future climate uncertain?

- Unknown future Green House Gas (GHG) emissions
  - Less influential at local scale
- Unknown response of the climate system to GHG emissions
  - Test scenarios of warming and precipitation change
- Natural climate variability
  - Test scenarios of variability

# How does climate change affect water supply?

- Changing runoff

→ Hydrology model

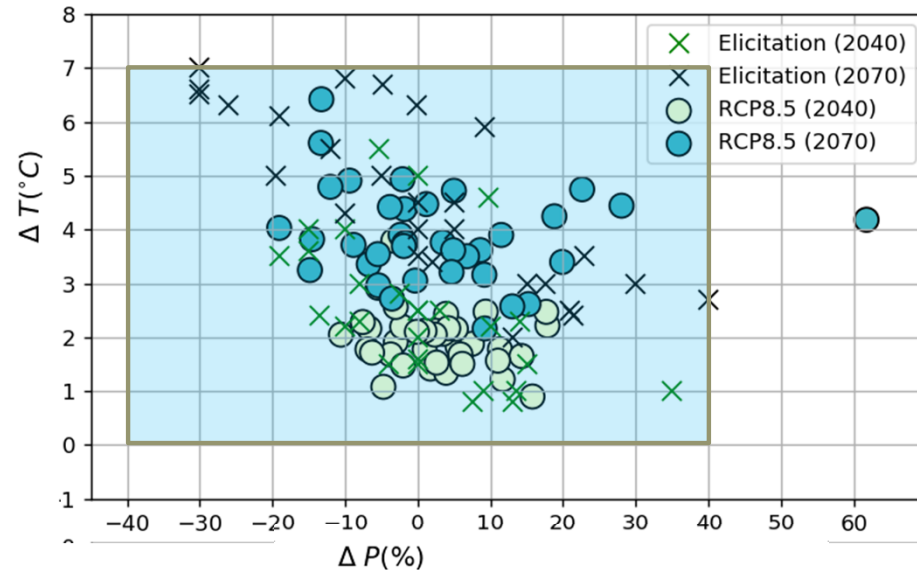
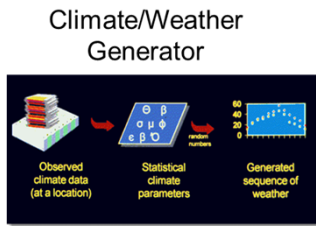
- Capability of the system to manage runoff changes

→ Water System model

- Other factors (e.g., water rights, water demand, water supply augmentation)

→ Water System model

# Climate Stress Test Scenarios

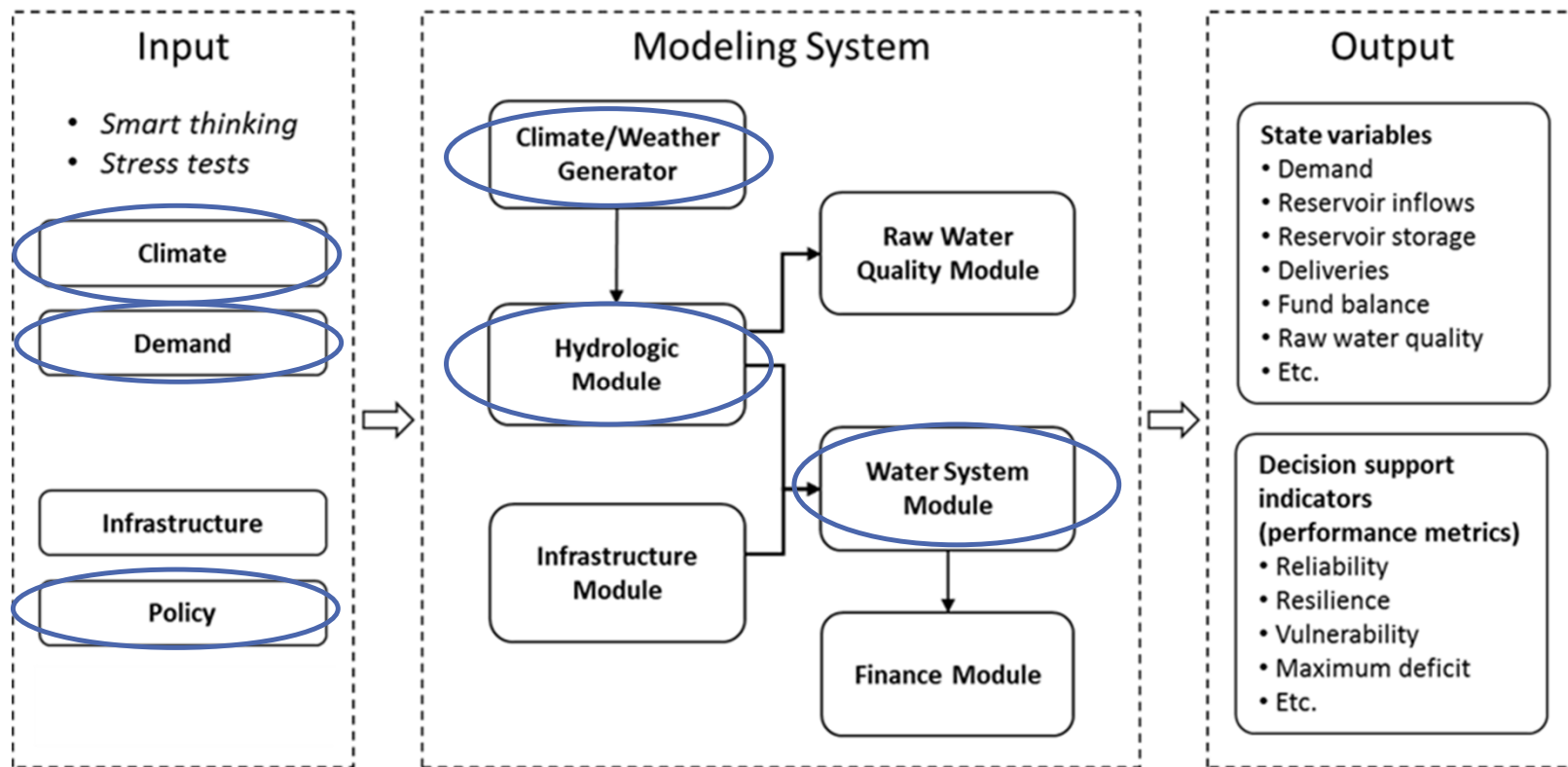


## Future Climate Scenarios

Type of uncertainty	Sampling range	Sample size
Natural climate variability	Stochastic realizations	10 realizations
Changes in mean annual precipitation (%)	-40 % to 40 % with 5% increments	17 change factors
Changes in mean annual temperature (°C)	0 to 7°C with 1°C increments	8 change factors
TOTAL		<b>1360 climate scenarios</b>

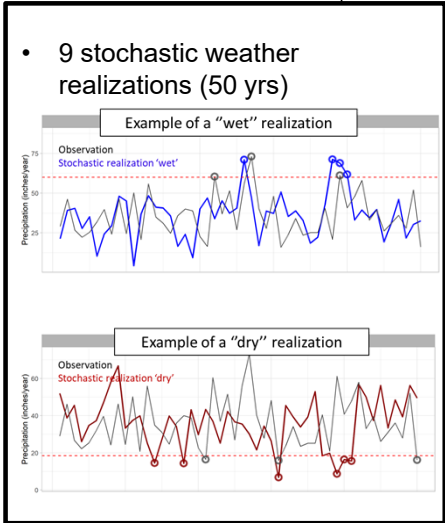
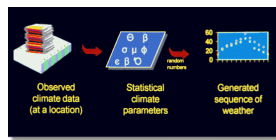


# Our approach for assessing vulnerability



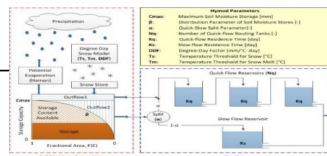
# Climate Stress Test Components

## Climate/Weather Generator



9 realizations

## Hydrologic Model



918 weather scenarios

- 6 temperature change scenarios from 0 to +5°C (1 °C step)
- 17 precipitation change scenarios from -40% to +40% (5% step)

9x6x17 flow realizations

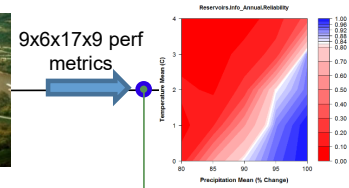
## System Model



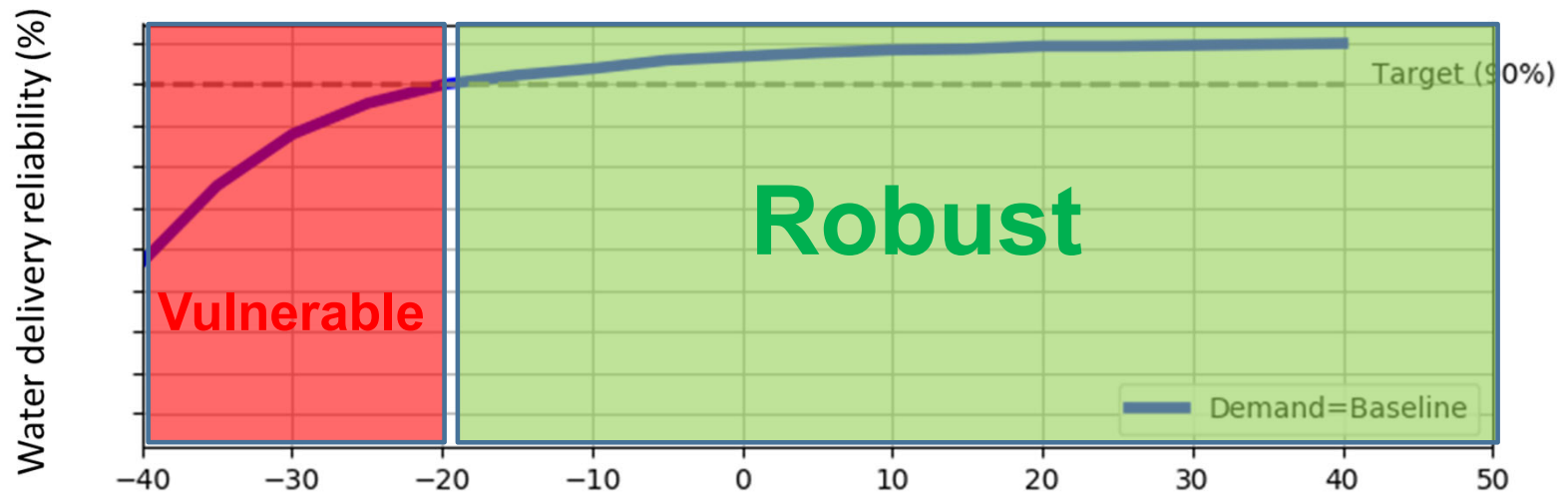
**Performance metrics**

8,262 scenarios

- 9 scenarios of change in urban water demand from -15% to +105% (15% step) (Bruce et al. in prep)



# Water Supply Reliability under Precipitation Change

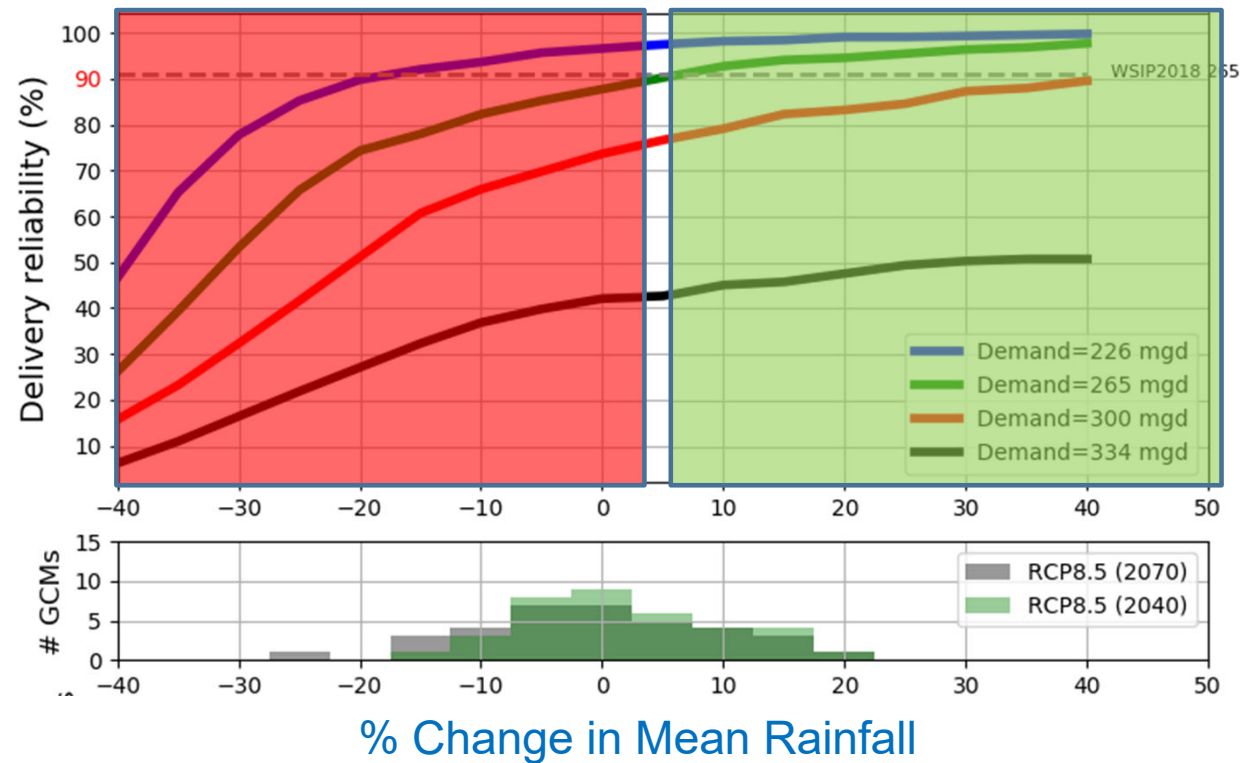


% Change in Mean Rainfall

Vulnerable if precipitation decreases by more than 20%

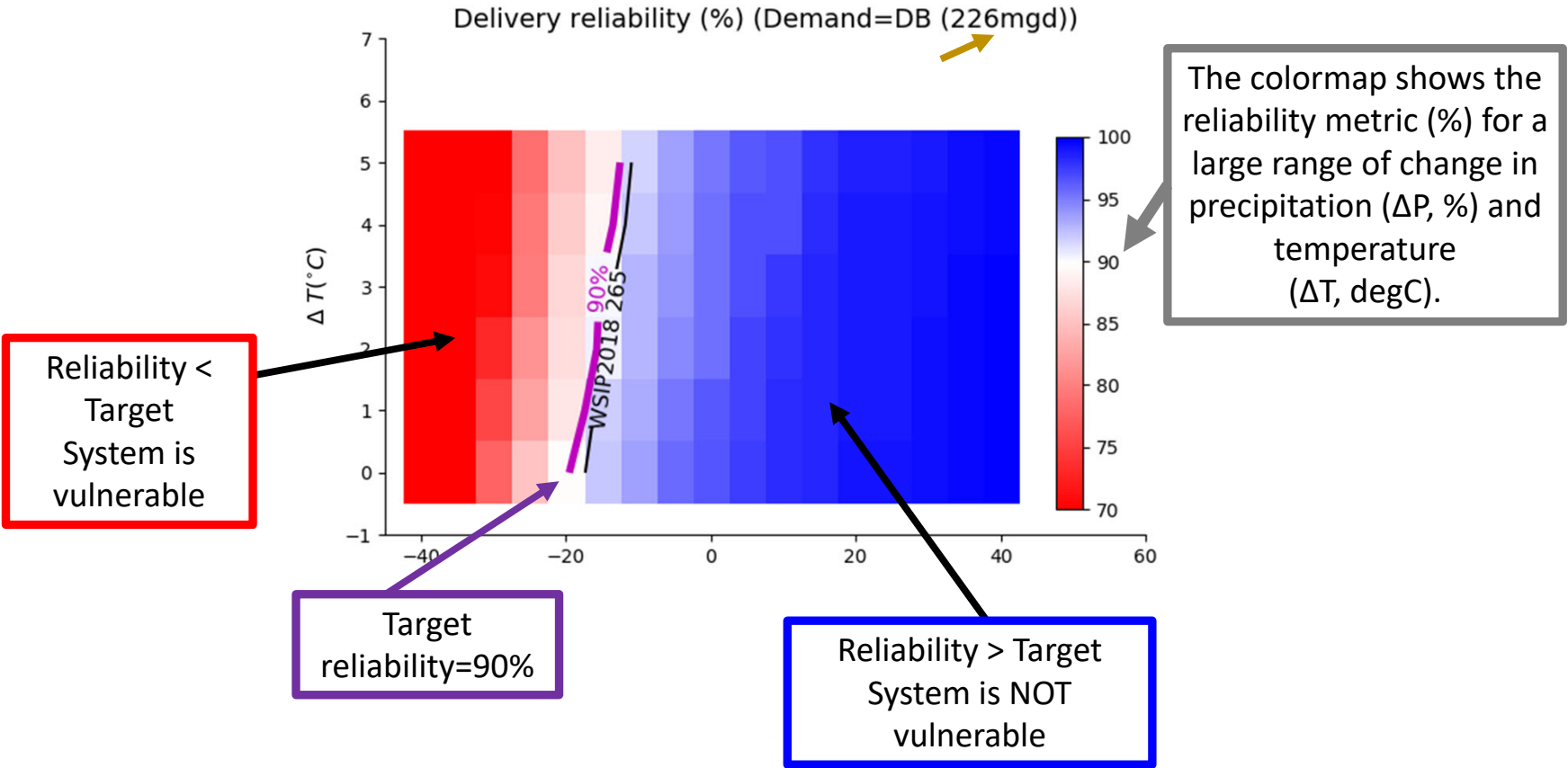
# Effect of Precipitation and Demand Change

Increased Demand causes vulnerability unless Precipitation increases!



Demand increase causes climate vulnerability

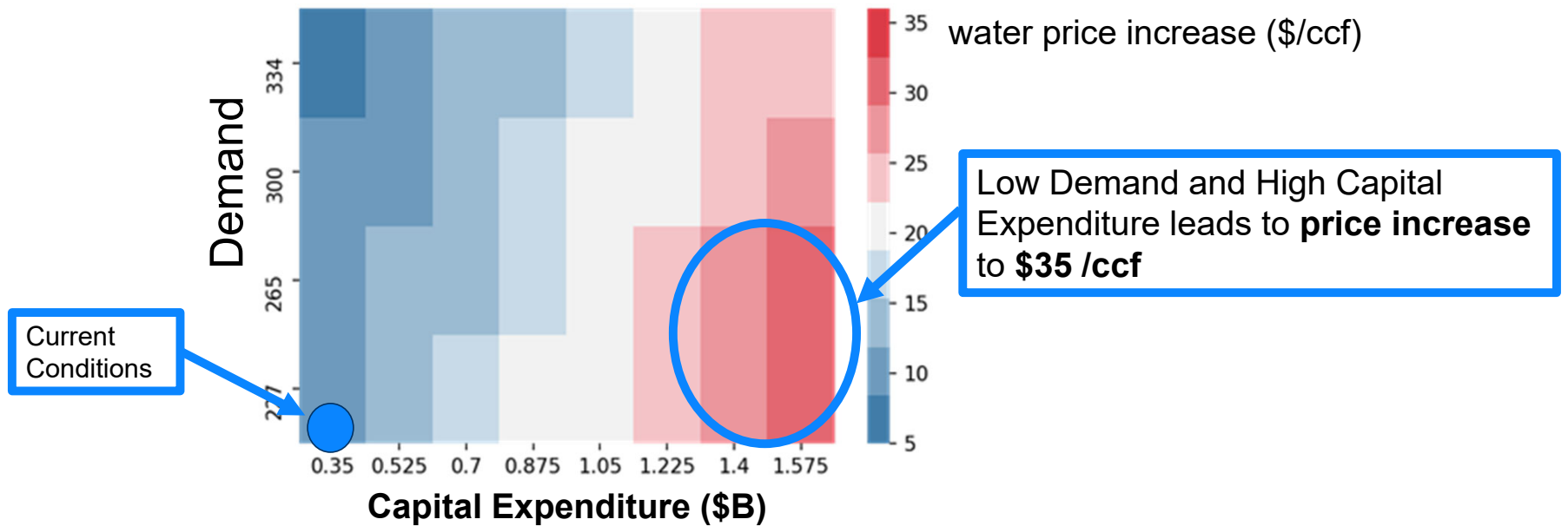
# Temperature and Precipitation Climate Vulnerability



**Climate Vulnerable: > +2C and -15% Precip**

# Climate Change and Finance

- If major capital investment is needed, **substantial increases in the price of water are required**



Color indicates Price Increase (\$/ccf) for Demand and Capital Expenditure changes

# Lindy Effect – Perishable or Non-

What if ... ?

Your history did not predict your future

Your planning horizon was 1000 years

Every decision made you more robust to change

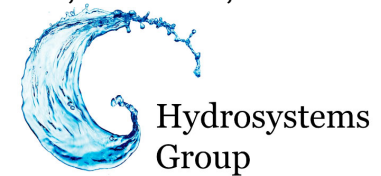


# Acknowledgments

Thanks to all our collaborators and funders, especially those featured in this talk:

Erica Brown	AMWA
Leon Basdekas	Black and Veatch neé CSU
Andrew Schwarz	Delta Stewardship Council nee DWR
Scott Steinschneider	Cornell University
Alexis Dufour	SFPUC
Patrick Ray	Univ of Cincinnati

World Bank, IJC, SERDP, Rockefeller Foundation, NOAA, NSF, FEMSA, SFPUC, USACE, Cal DWR





# Climate Analysis Results

- Understanding of the conditions that make the system vulnerable
  - *(What climate changes make us vulnerable?)*
- The level of concern associated with vulnerabilities
  - *(How much should we worry?)*
- The ability of proposed alternatives to reduce vulnerability
  - *(What action should we take?)*

# Summary - Making Good Adaptation Decisions



**Become financially robust**



**Evaluate performance over many possible futures**



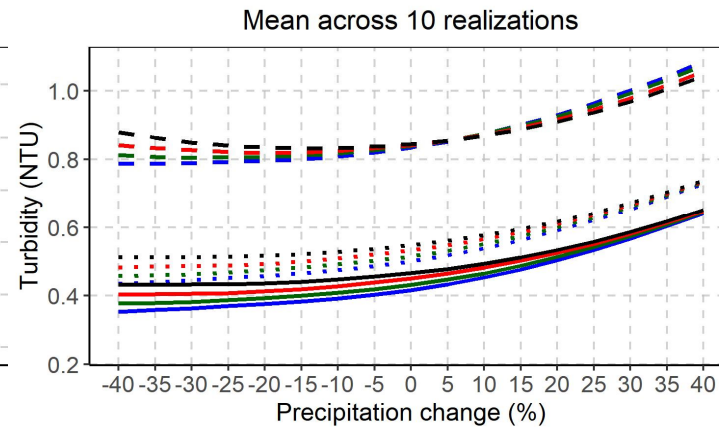
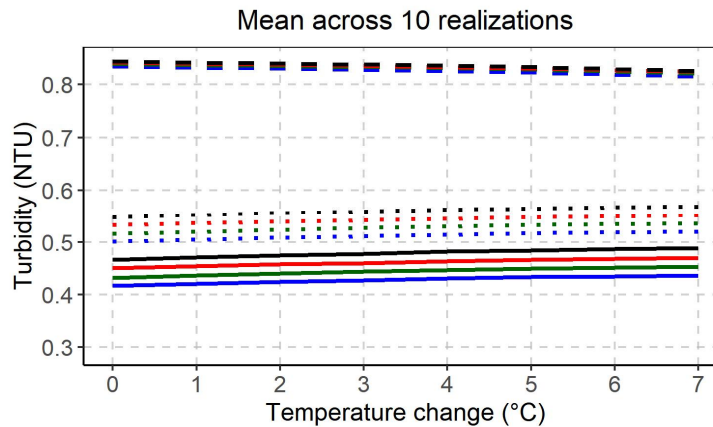
**Understand your vulnerabilities**



**More resilient with every decision**

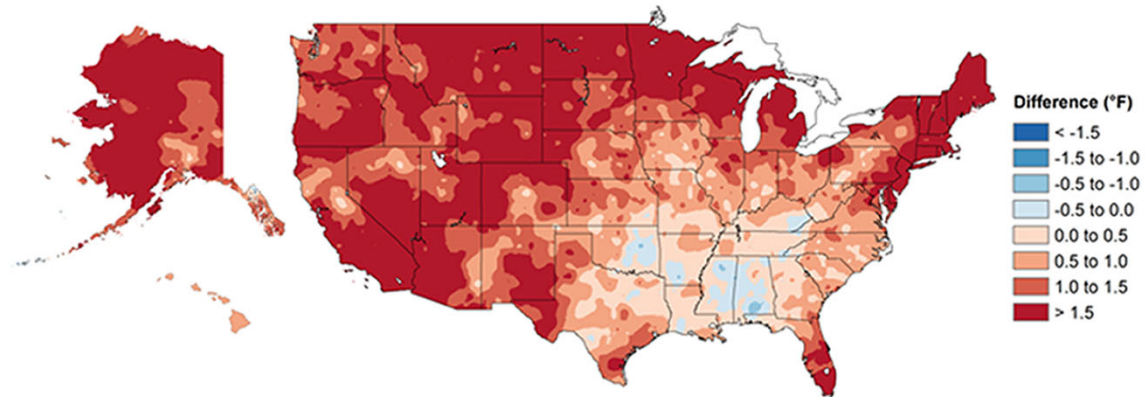
# Raw Water Quality – Turbidity and Total Organic Carbon (TOC)

- Overall, raw water quality deterioration in turbidity or TOC **does not appear to be a major concern**

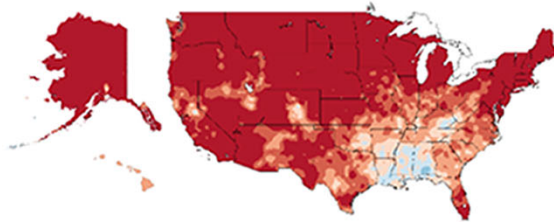


# Recent Temperature Changes

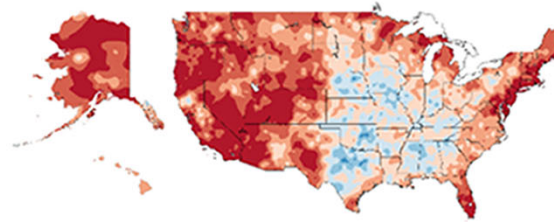
Annual Temperature



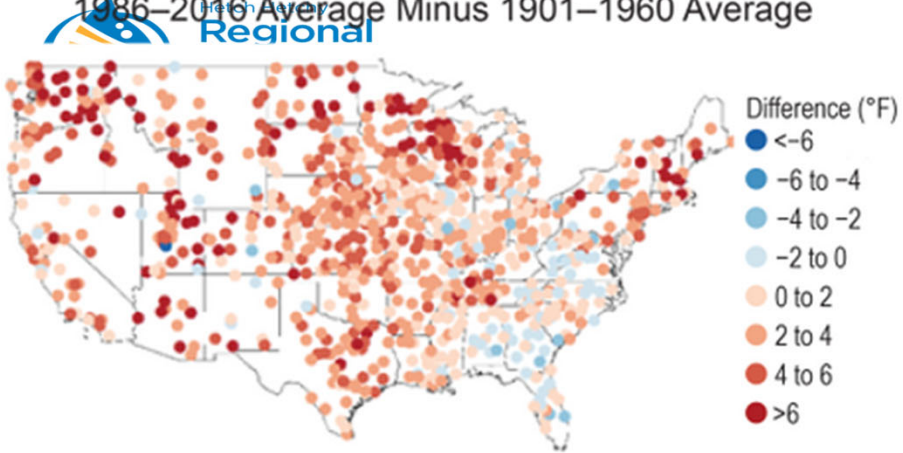
Winter Temperature



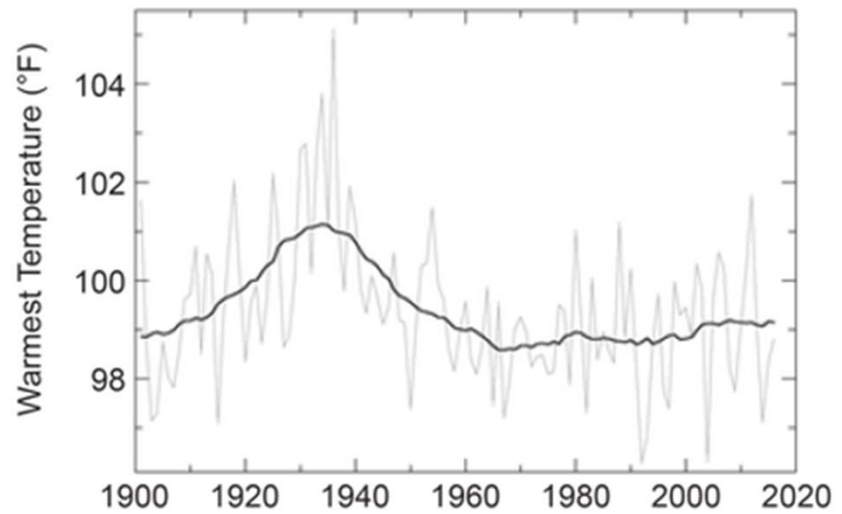
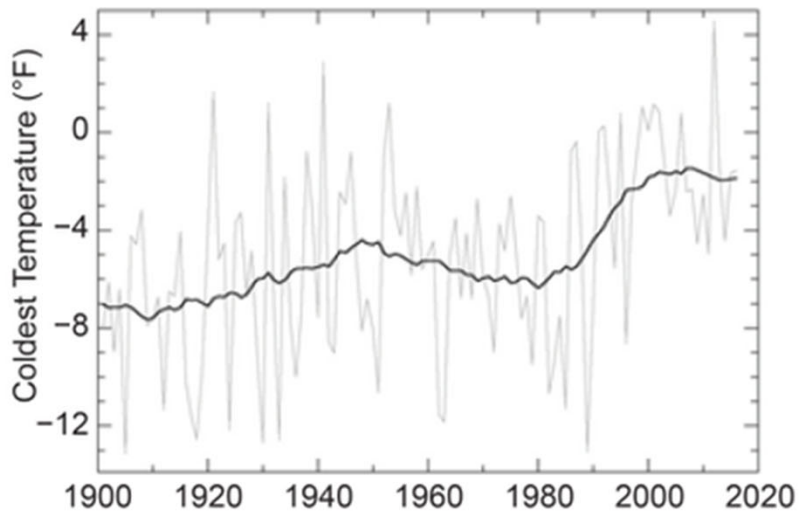
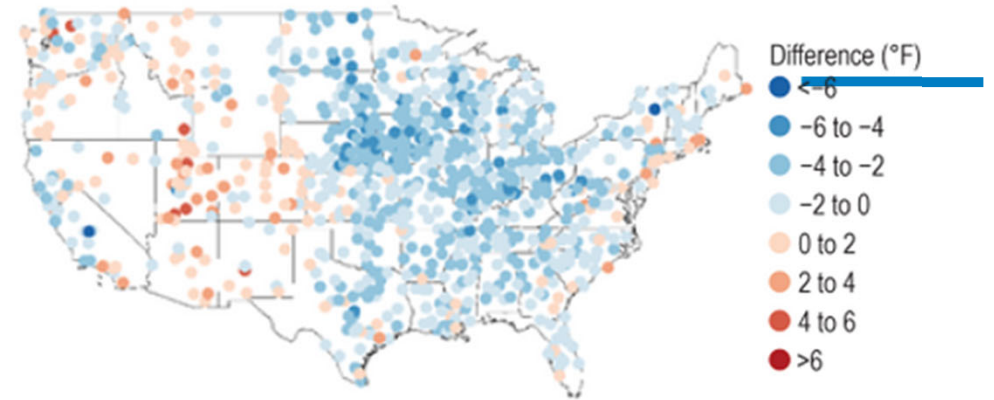
Summer Temperature



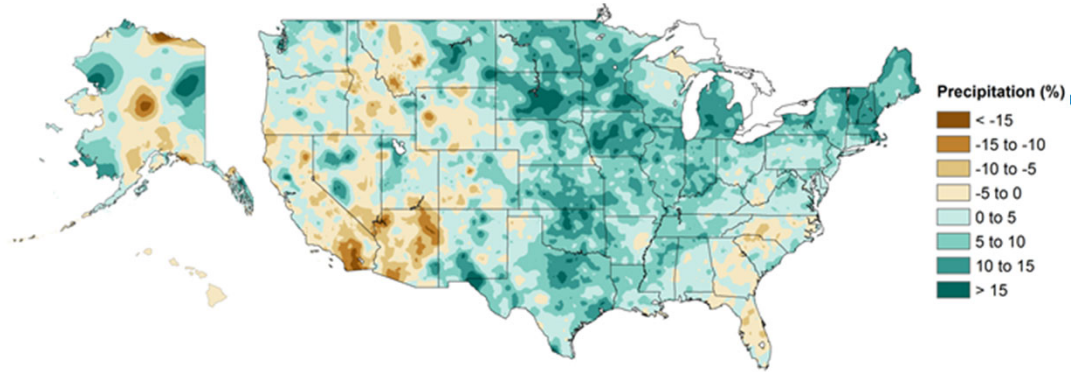
Change in Coldest Temperature of the Year  
1986–2016 Average Minus 1901–1960 Average



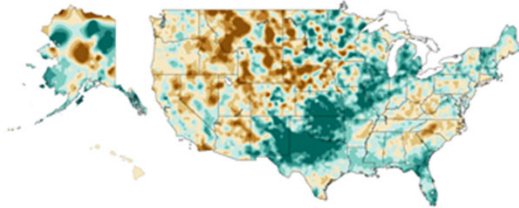
Change in Warmest Temperature of the Year  
1986–2016 Average Minus 1901–1960 Average



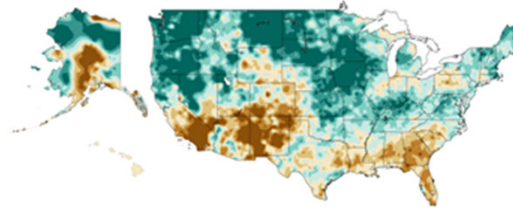
### Annual Precipitation



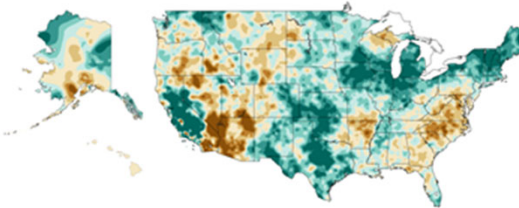
### Winter Precipitation



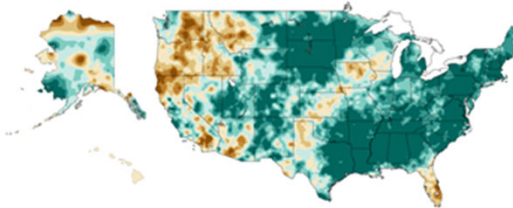
### Spring Precipitation



### Summer Precipitation

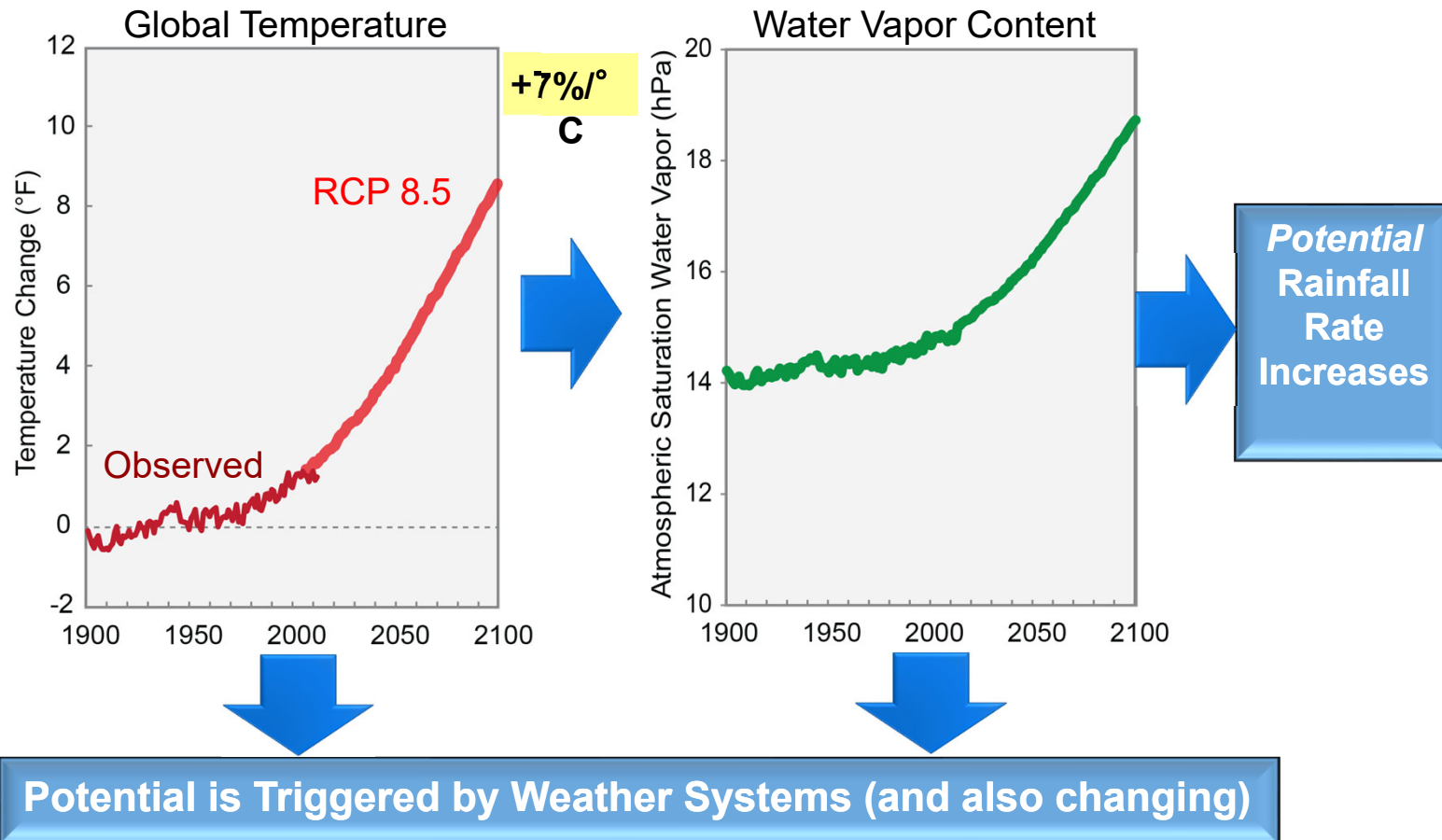


### Fall Precipitation

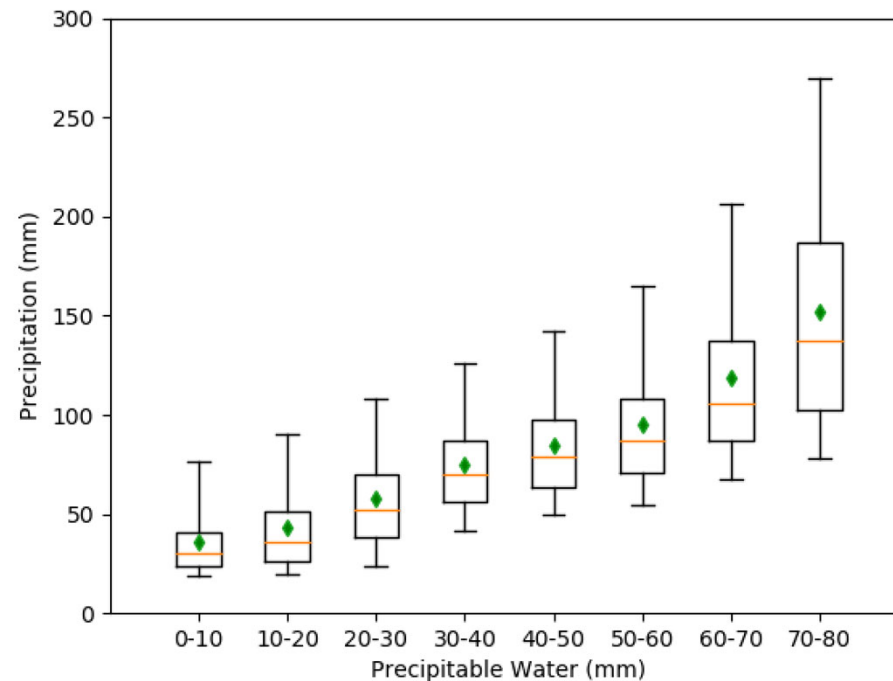


# Kunkel Approach

## Global Warming->Saturation Water Vapor Increases



# Annual Maximum Precip Increases with Temp

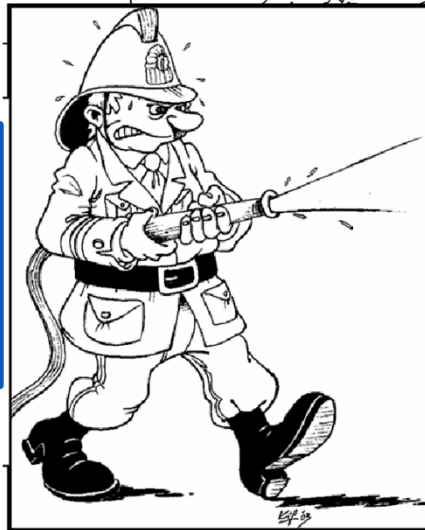


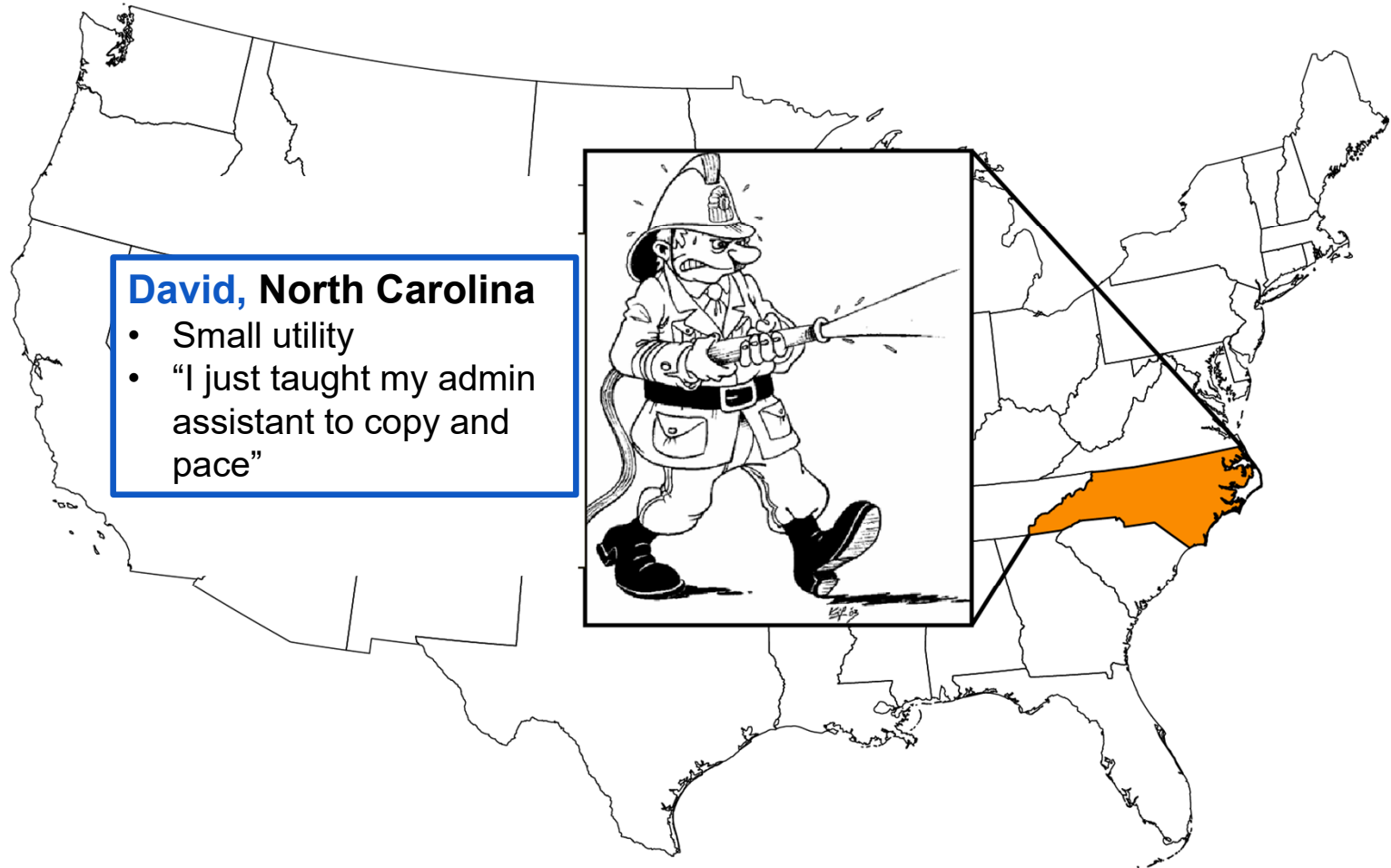
**Statistically significant positive correlations: 1178 stations (out of 3018 stations)**  
**Statistically significant negative correlations: 4 station**



**David, North Carolina**

- Small utility
- “I just taught my admin assistant to copy and pace”





**David, North Carolina**

- Small utility
- “I just taught my admin assistant to copy and pace”

Motivate younger employees by creating a clear company vision and emphasizing job flexibility and collaboration.





## 3 Things Millennials Want in the Workplace



### Interact with their colleagues

Millennials want to interact with their colleagues through their favorite channels



### Share new ideas

Millennials want to be able to share their ideas with their colleagues



### Be heard

Millennials want to be listened to and make an impact on the business