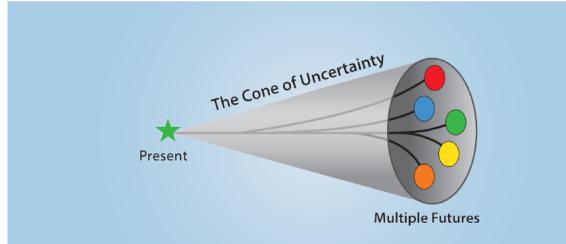
IRP Context: State-of-the-art in water systems planning under change Patrick Reed Professor of Civil Engr., Cornell University patrick.reed@cornell.edu

Image Credit: The Atlantic, Mar. 2014, Reuters/Robert Galbraith

### A qualitative starting point...

### **EMBRACING UNCERTAINTY**

A Case Study Examination of How Climate Change is Shifting Water Utility Planning



Prepared for:

Water Utility Climate Alliance (WUCA) American Water Works Association (AWWA) Water Research Foundation (WRF) Association of Metropolitan Water Agencies (AMWA)

Project Manager: Laurna Kaatz, Denver Water

### **13 Case Studies**

-UK & Australia -Denver Water -Bureau of Rec. -CA DWR -MWD -many more

Seeking robustness across possible futures



## "Bottom-up" decision frameworks

(Decision Scaling, Info-Gap, RDM, MORDM, Dynamic Adaptive Policy Pathways ...)

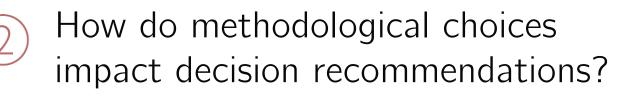
Shift from asking the prediction question – 'how likely is this scenario?' to asking the decision impact question – 'how likely would this scenario need to be to affect one's choice of strategy?'

- Bryant and Lempert (2010)



### Planning under uncertainty: Some context

What do robustness-based decision frameworks have in common?





How does the MWD IRP link to the state-of-the-art?



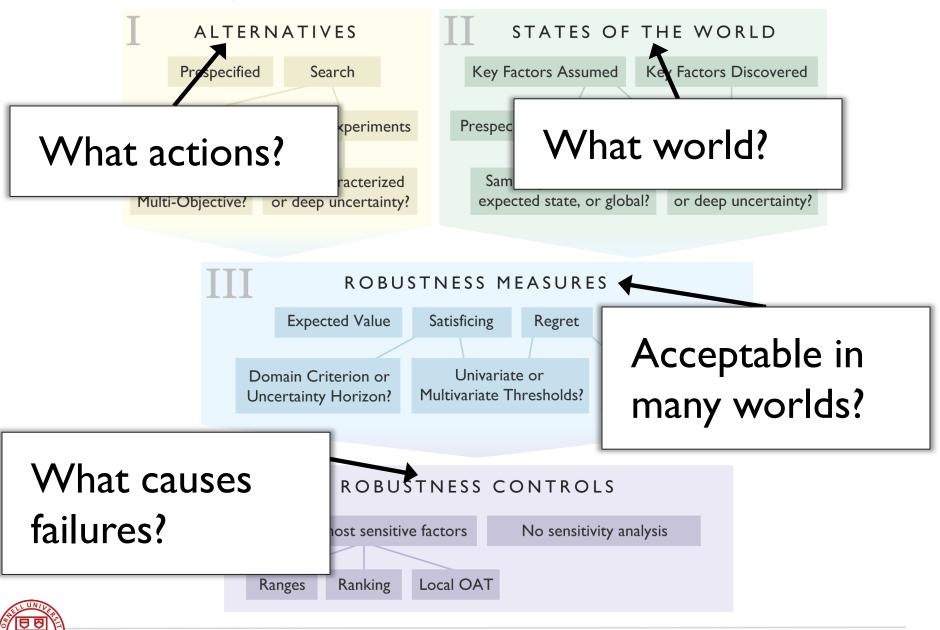
What do robustness analyses have in common?

## Evaluate alternatives in multiple states of the world...

# Quantify robustness measures and determine sensitive uncertainties



#### Taxonomy of Robustness Frameworks



### Planning under uncertainty: Some context

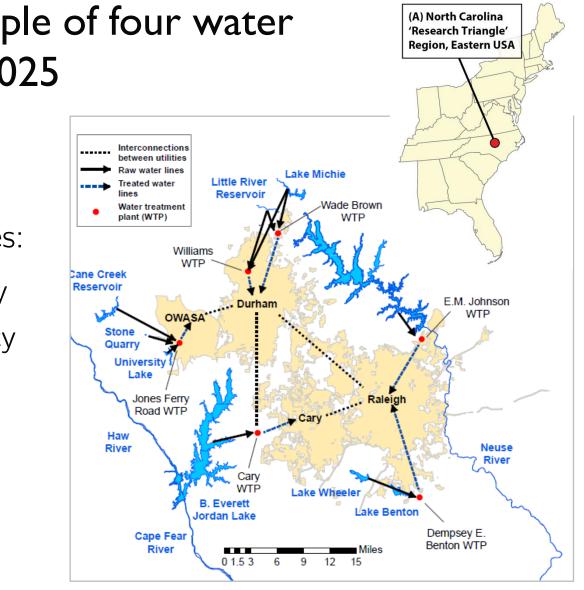
What do robustness-based decision frameworks have in common?



## How do methodological choices impact decision recommendations?







### (Zeff et al. 2014)

# Eastern U.S. example of four water utilities through 2025

Four regional objectives:

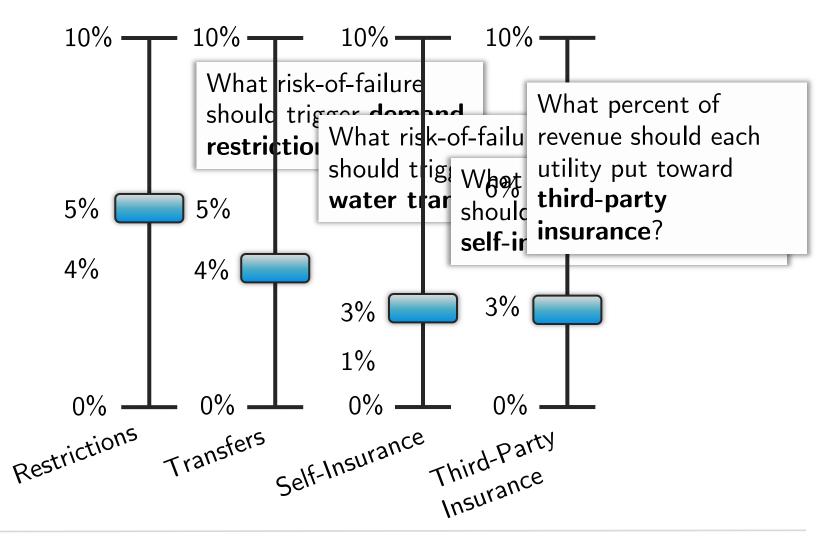
- Volumetric reliability
- Restriction frequency
- Average cost
- Worst-case cost

The worst-performing utility is optimized such that others will perform as well or better.



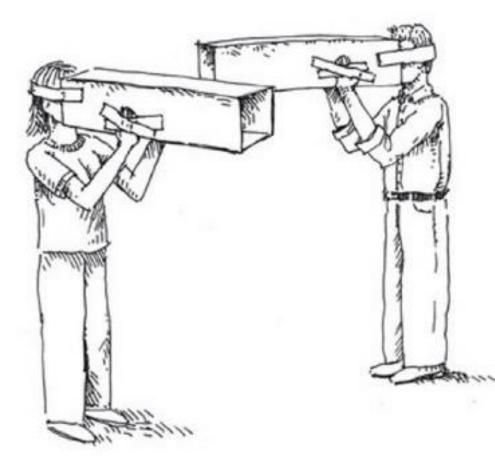
### Risk-based triggers for drought management

(Must be specified for every utility)





## Avoiding Tunnel Vision: Scenarios vs. Exploratory Modeling



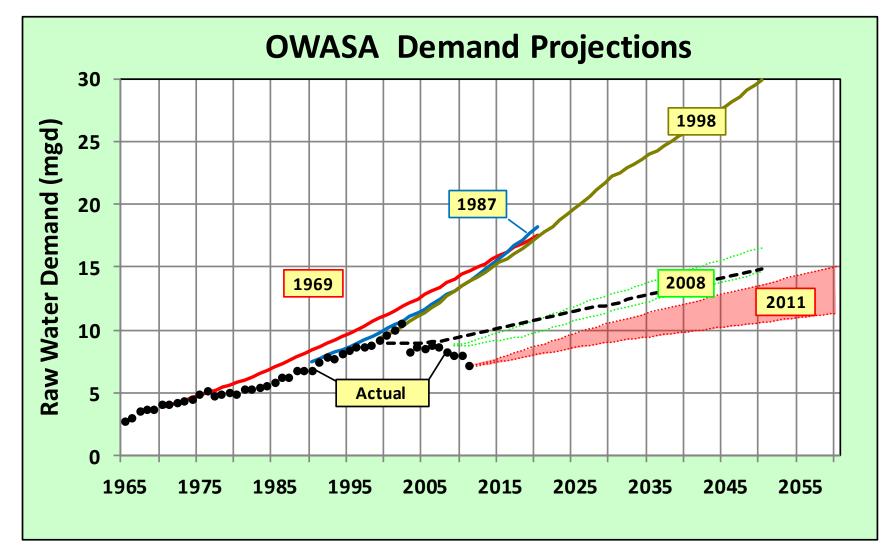
Which solutions are robust? How to decide?

Sample deeply uncertain states of the world (inflows, demand, etc.)

http://www.hockscqc.com/articles/tunnelvision/tunnel-vision.jpg

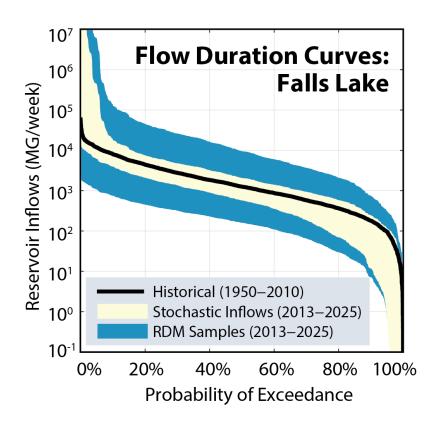


### It is very common to make poor predictions





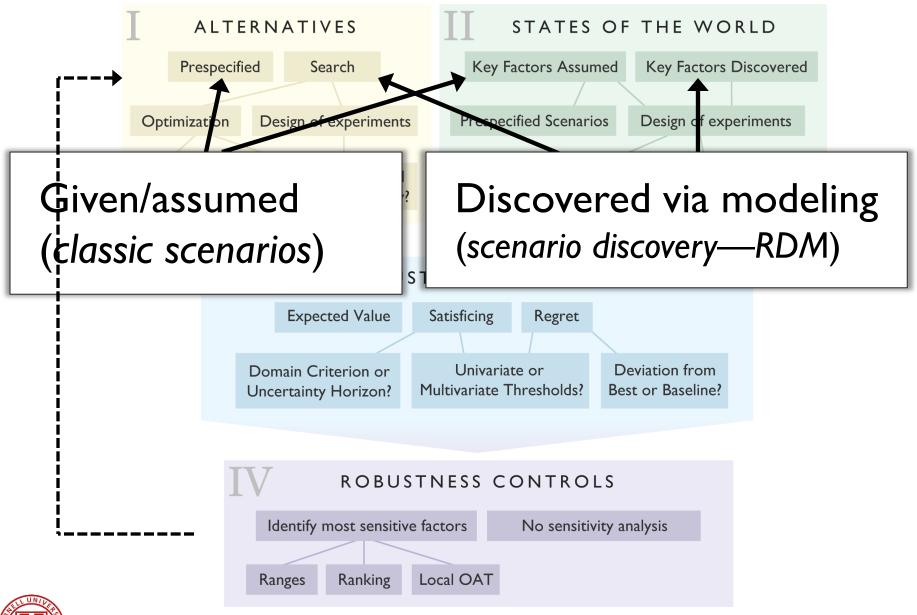
## Construct alternative states of the world for different combinations of uncertainties



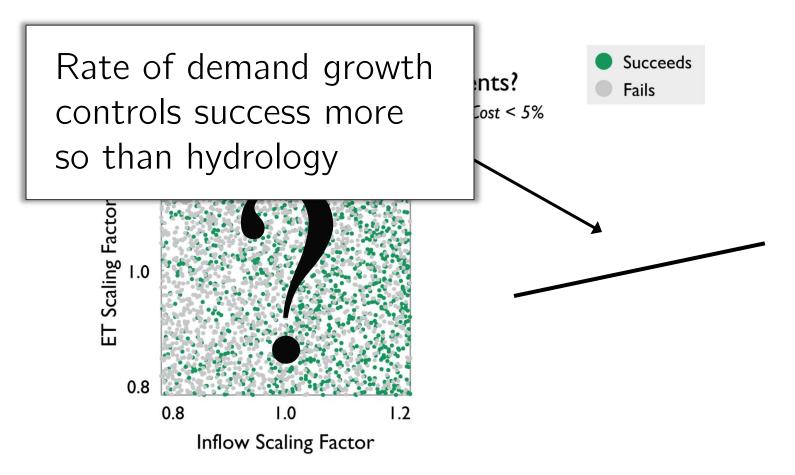
**2 of 13** uncertainties including demand seasonality, reservoir evaporation, transfer prices, etc.



### Taxonomy of Robustness Frameworks



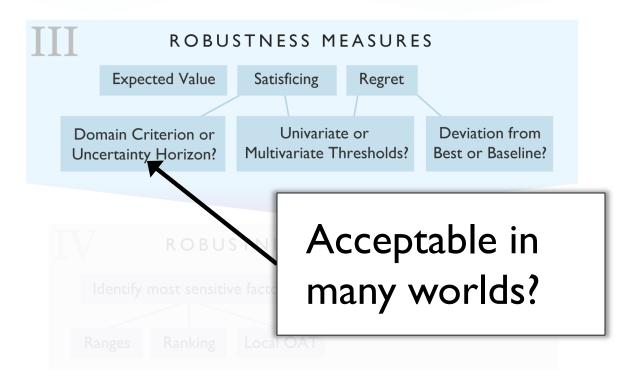
### An assumed focus on climate/hydrologic factors may fail to capture system vulnerabilities



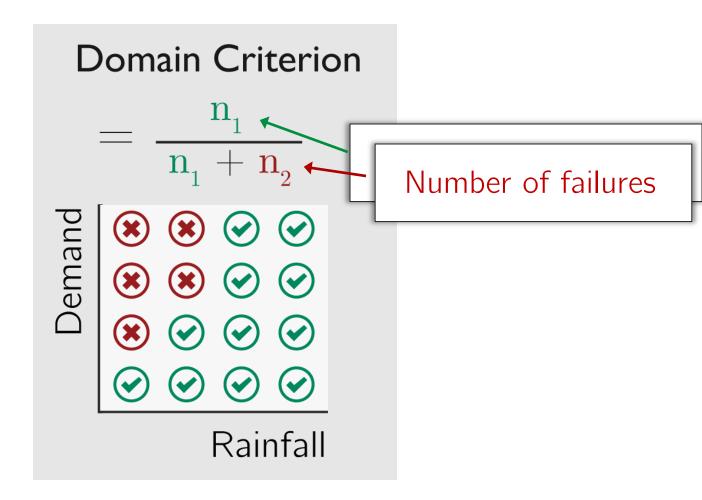


### Taxonomy of Robustness Frameworks









References: Schneller and Sphicas (1983)



### Taxonomy of Robustness Frameworks



Local OAT

Identify most sensitive factors

Ranking

Ranges

No sensitivity analysis

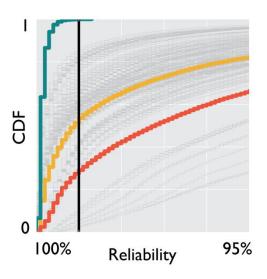


## Discovering sensitive uncertainties improves robustness of alternatives

Performance CDFs over Uncertain States of the World

Multi-objective performance for Durham

- Prespecified Solution
- ----- Robust Solution from Search ------ Stakeholder Requirement
  - Robust Solution with Reduced Demand Growth







Pareto-approximate set (Search)

### Planning under uncertainty: Some context

What do robustness-based decision frameworks have in common?

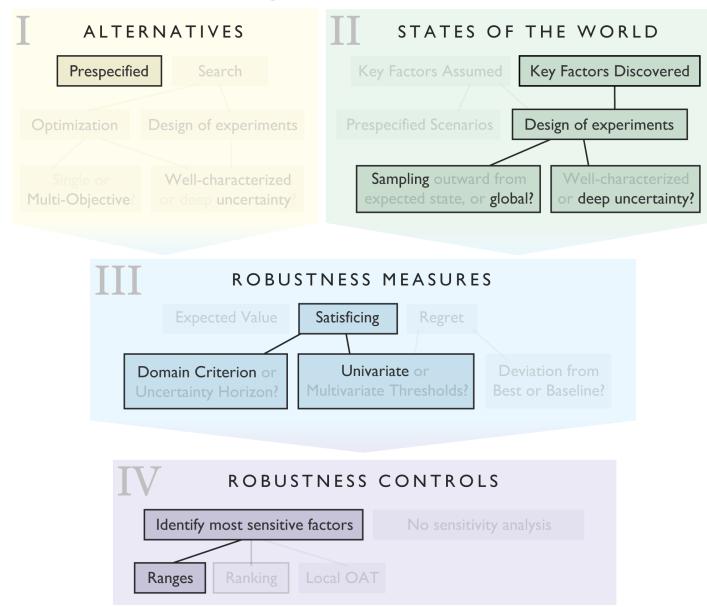




## How does the MWD IRP link to the state-of-the-art?



### **Robust Decision Making**





### Some summative comments

MWD is serving as a national/international leader in planning



Climate change is not the only concern, RDM allows the consideration of many uncertainties

3

In the future it would interesting to more fully link the uncertainties in the "scoping" and "implementation/policy" phases of the IRP



### Thanks!

Taxonomy of Robustness Frameworks ALTERNATIVES STATES OF THE WORLD Prespecified Search Key Factors Assumed Key Factors Discovered Design of experiments Prespecified Scenarios Design of experiments Optimization Sampling outward from Well-characterized Single or Well-characterized expected state, or global? or deep uncertainty Multi-Ohiective or deep uncertainty? ROBUSTNESS MEASURES Expected Value Satisficing Regret Univariate or Deviation from Domain Criterion or Uncertainty Horizon? Multivariate Thresholds? Best or Baseline ROBUSTNESS CONTROLS No sensitivity analysis Identify most sensitive factors Ranges Ranking Local OAT

#### References

Herman et al. (2015) How should robustness be defined for water systems planning under change? *JWRPM*, 04015012.

Herman et al. (2014) Beyond Optimality: Multi-stakeholder robustness tradeoffs for regional water portfolio planning under deep uncertainty. *WRR*, 50, 7692-7713.

Zeff et al. (2014) Navigating financial and supply reliability tradeoffs in regional drought portfolios. *WRR*, 50, 4906-4923.

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## SCRiM

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