An aerial photograph of a large reservoir, likely a dam, with a long concrete wall across the water. The surrounding landscape is hilly and green, with some roads and structures visible. The sky is overcast.

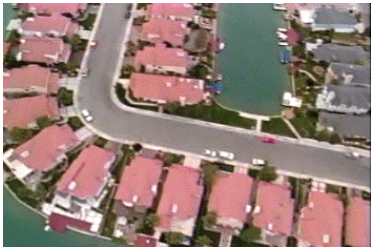
# Impacts of uncertainty in efficient management of California's water resources

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# Competing Demands in California

**Domestic**



**Power & Industry**



**Wildlife**



**Agriculture**



COMPUTER IMAGE BY CHUCK CARTER

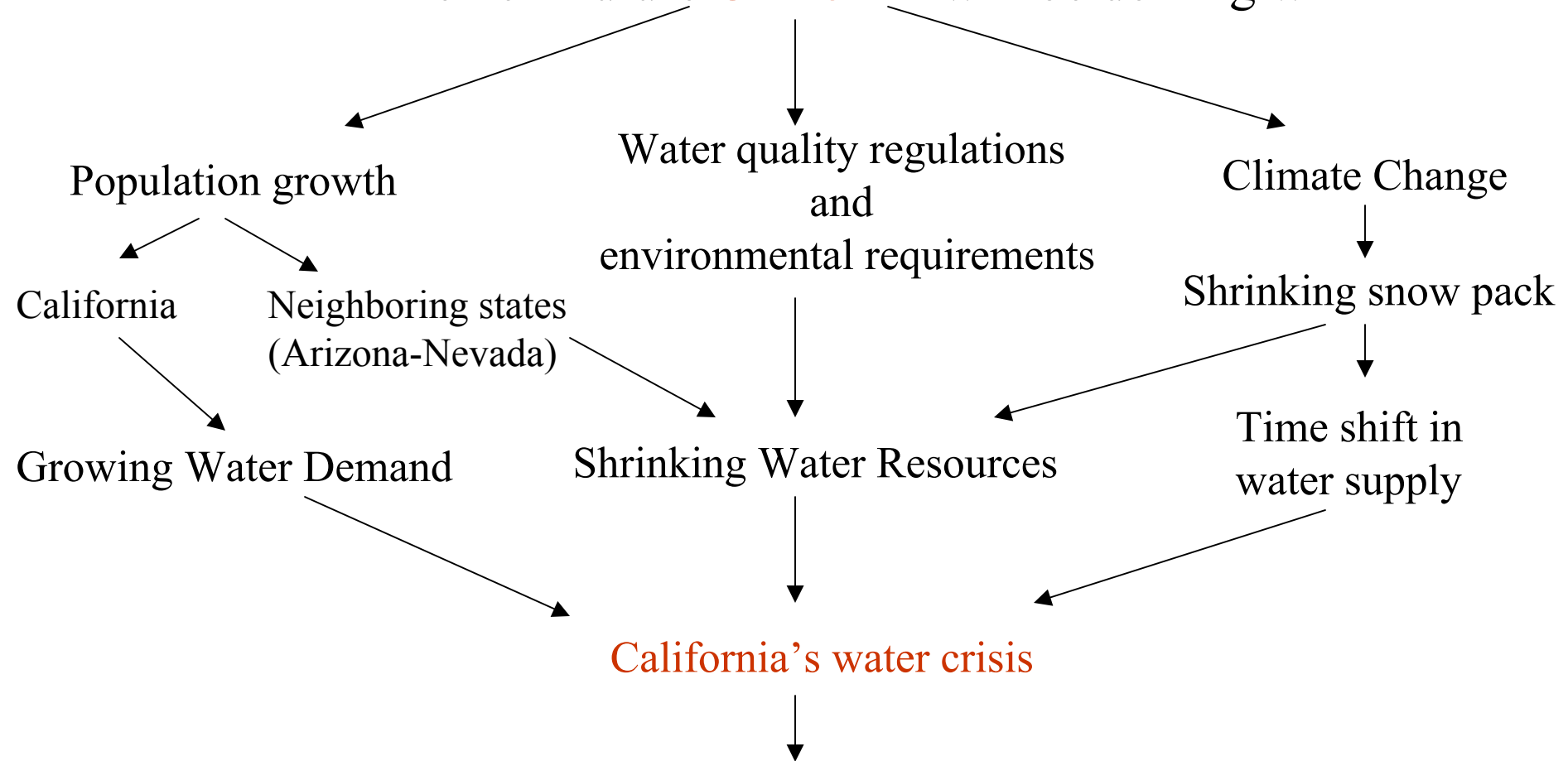
**Navigation**



**Recreation**

# CAL2030 project: Overview

In the near future **California** will be dealing with



This calls for an **integrated, efficient and sustainable** plan to management of water resources which is one of focuses of the Berkeley Water Center

# CAL2030 project: system integration

- This integrated system will include an **open and flexible** platform that connects all California's water systems.
- Why an open platform?
  - More efficient resource management by allowing decision makers to test different possible coordinated operation scenarios.
  - Improved system reliability in term of water supply by considering:
    - uncertainty in future hydrologic events (e.g. impacts of climate change).
    - uncertainty within the management system (e.g. modeling processes).
    - disaster management issues such as exploring alternative water supply sources in case of a catastrophe.

# CAL2030 project: characteristics of the platform

A few major characteristics of such a platform are that it:

- contains **multiple modeling components** (e.g. surface water component, ground water component) that can be attached and detached from the main platform without causing any operational challenges for the user
- is flexible enough to **accept different kind of inputs** as source of water supply (including historical hydrologic records or direct output of any hydrological model).
- can be operated on **various time scales** (e.g. daily, monthly, and seasonally). This way the platform can be **operated for both water supply and flood control purposes**.

## CAL2030 project: pilot project

Conduct a pilot project to focus on some of the raised issues in a **smaller scale** by:

- Identifying and assessing *end-to-end uncertainty* in a water resources management system with multiple users such as **Sacramento River Basin**.
- Evaluating the **reliability of water supplies** by analyzing the estimated uncertainty.
- Evaluating if more **accurate estimation** of the uncertainty leads to **sustainable management** of our limited water resources in the state of California.

# Impacts of reliable forecast

More reliable forecast can:

Change our perspective of expected future extreme events such as  
**Floods and Droughts.**



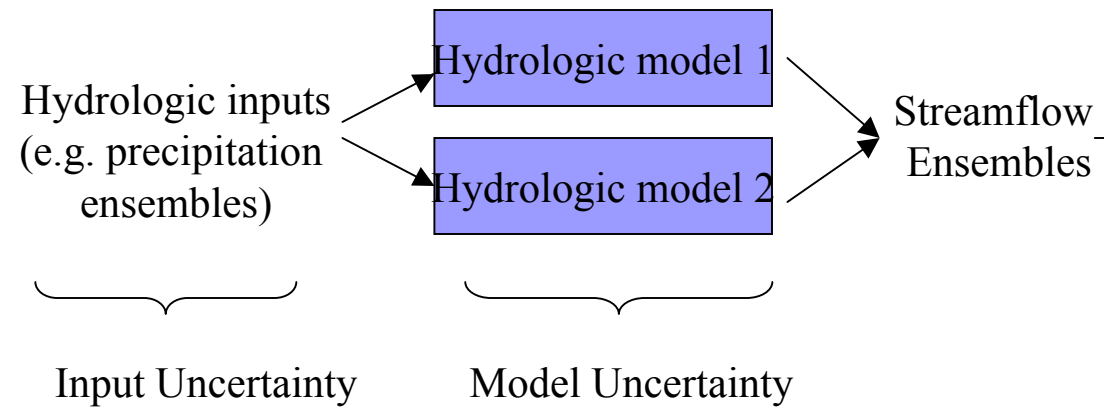
- Enables the decision makers to better handle **risk** in decision making
- Therefore **mitigate** some of social, economical and environmental impacts.
- Also manage our **limited** water resources more **efficiently** under new adaptation plans

# Methodology

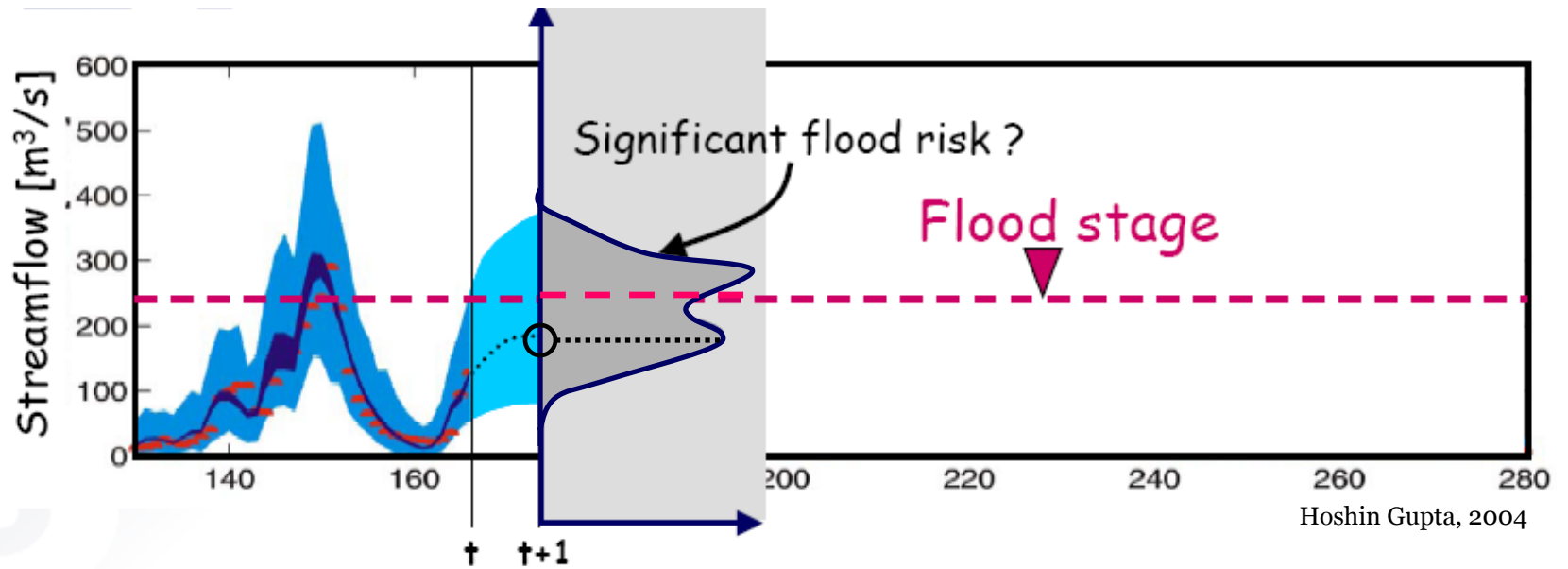
- Study area: **Upstream of Shasta** reservoir in Sacramento basin (including all the catchments that contribute to the inflows to Shasta).
- Monthly precipitation and temperature data from 1962-1994.
- **Single aggregated demand** which represents the water demand south of Shasta.
- **Two simple hydrologic models** to generate streamflow ensembles.
  - Hydrologic MODel (HYMOD, 5 par)
  - Simple Water Balance model (SWB, 5 par)
- Using the Water Evaluation and Planning (**WEAP**) model for resource management and planning (developed by the Stockholm Environment Institute).

# Methodology

First step  
(accounting for hydrological uncertainty)      Second step  
(uncertainty propagation)

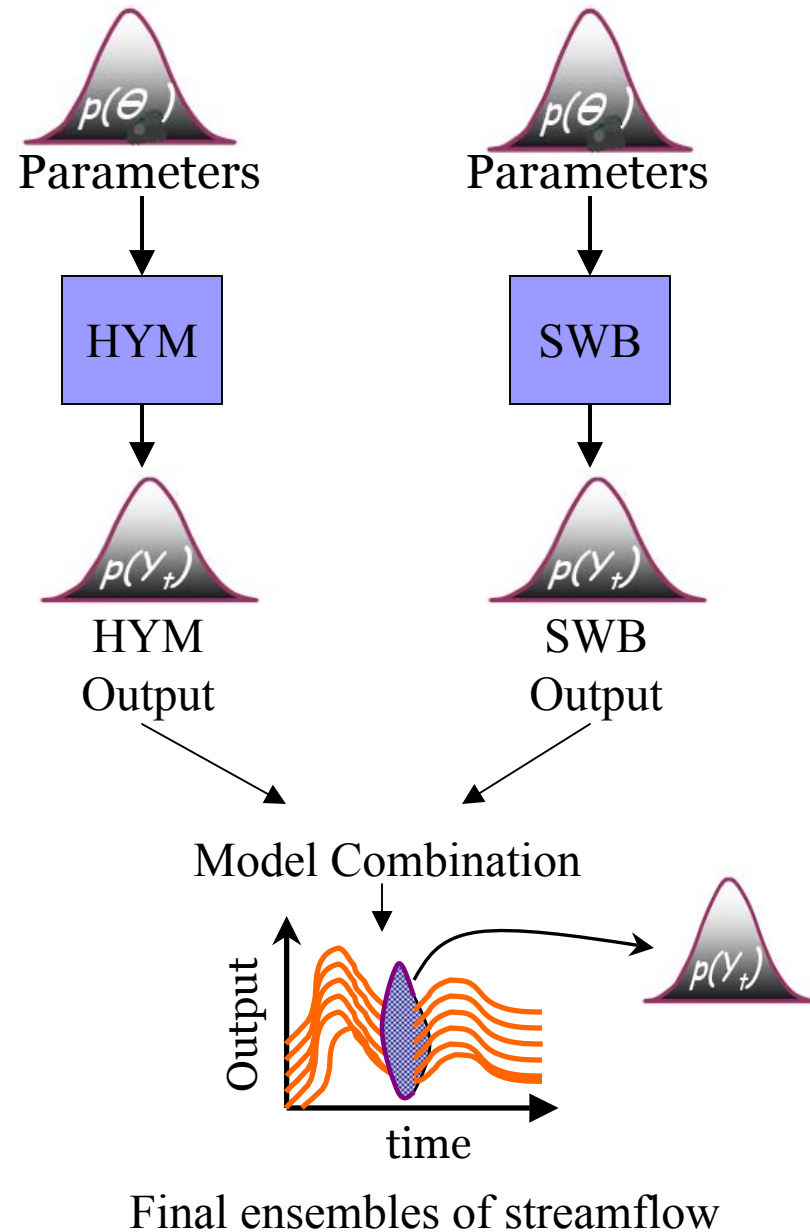


# Why uncertainty is important?



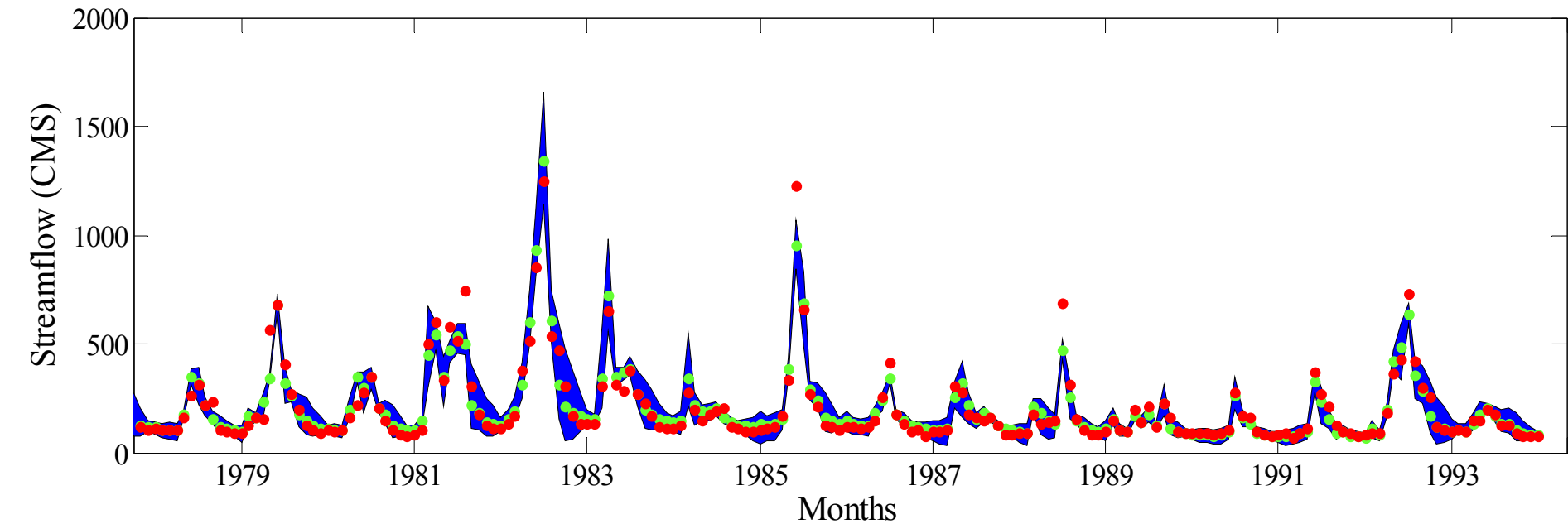
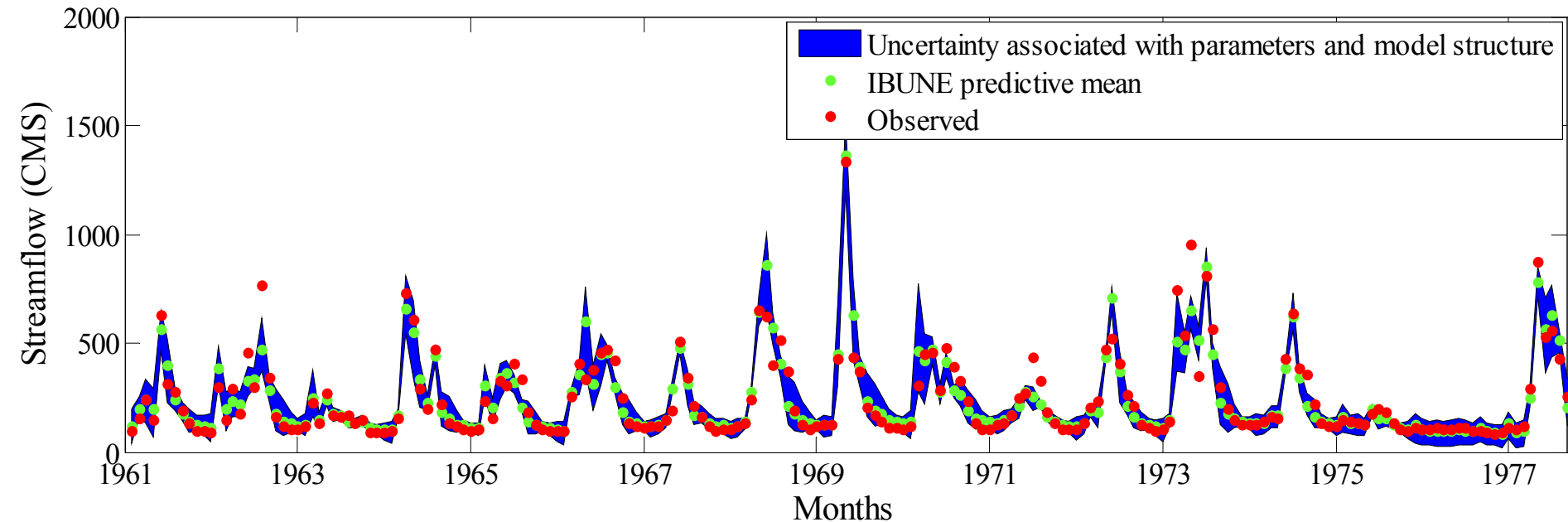
# Accounting for hydrological uncertainty

- Integrated Bayesian Uncertainty Estimator (**IBUNE**).
- Framework that accounts for uncertainty in input forcings, model parameters and model structure.
- Optimization + MCMC + Model combination
- Here we use it just to account for **model parameter** and **model structural** uncertainty.



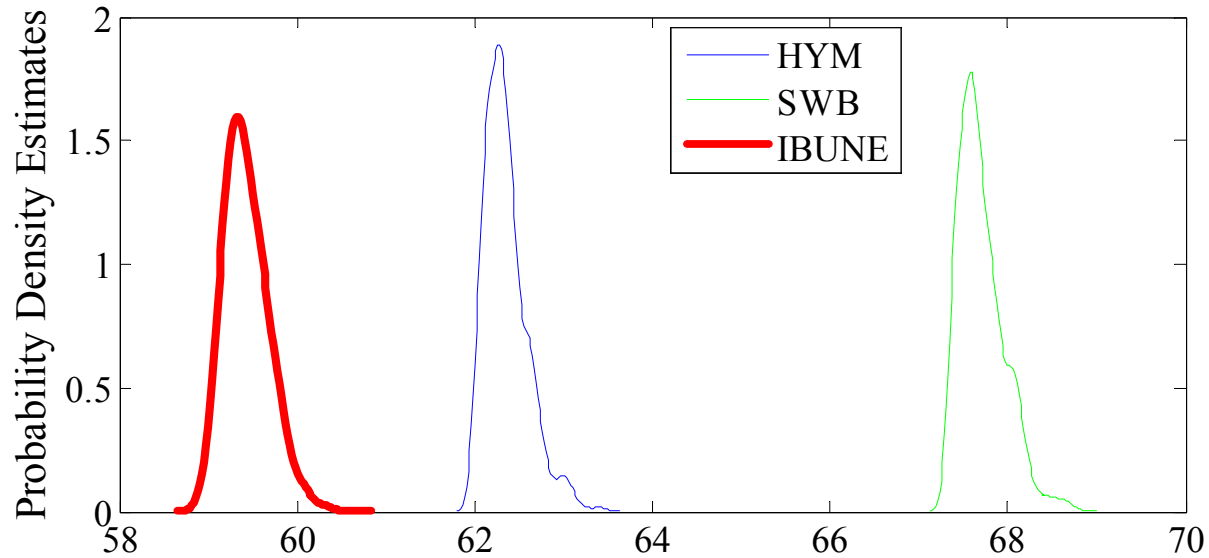
# Performance of IBUNE's probabilistic and Deterministic simulations

## Ensemble Model Predictions

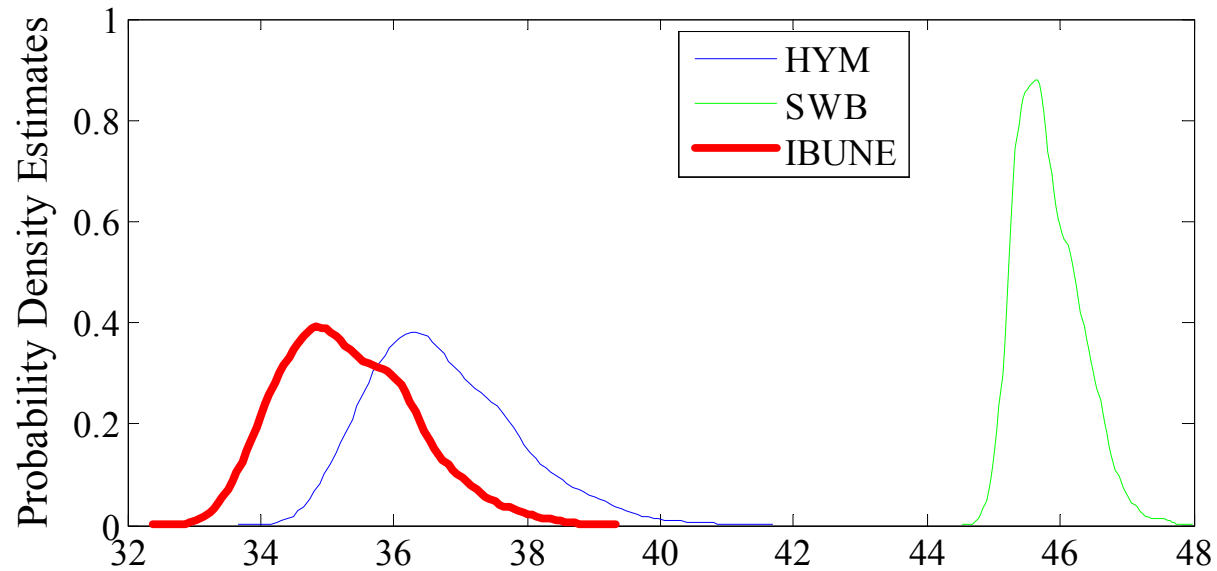


# IBUNE versus individual models

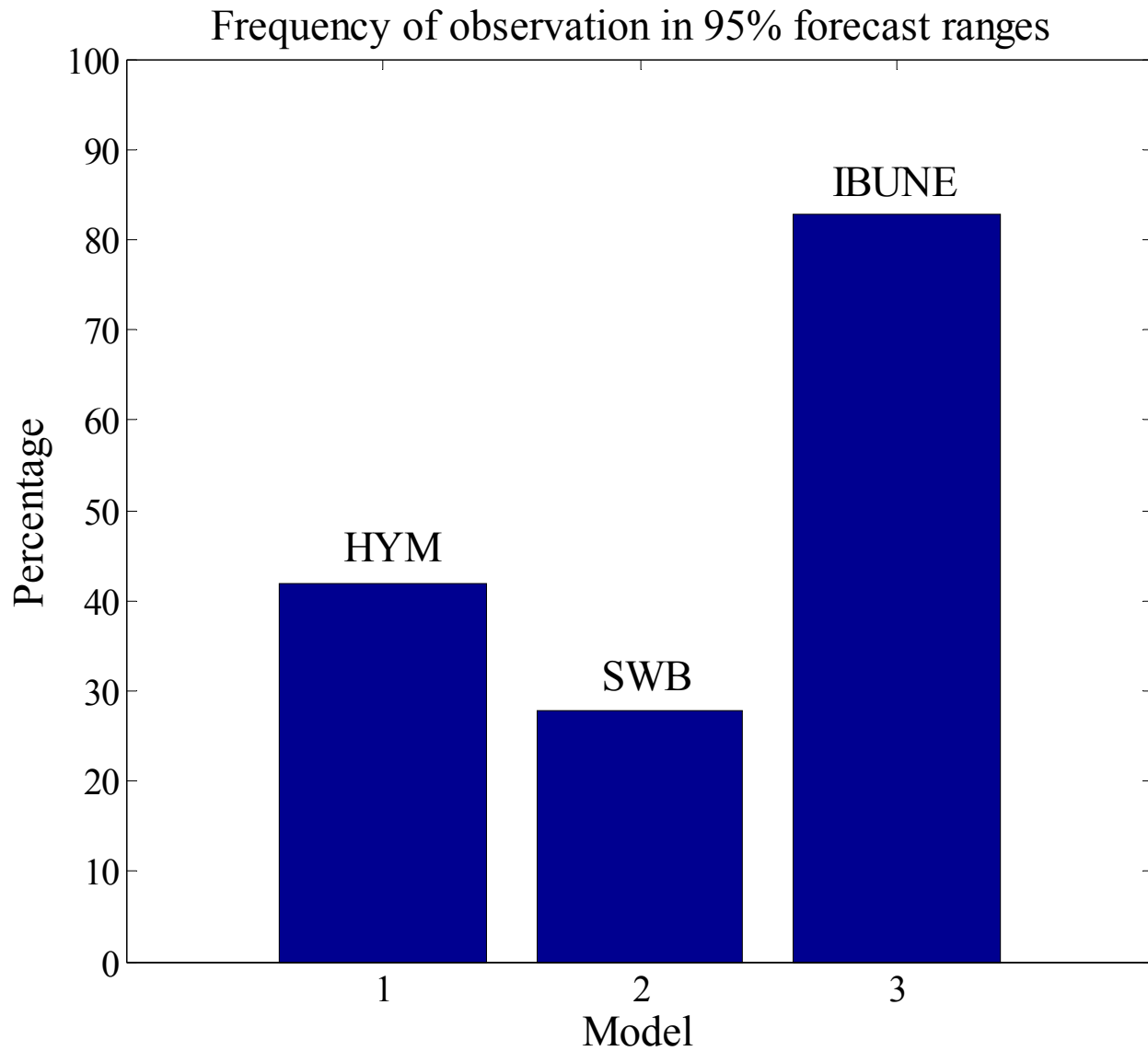
MRMS distributions



MABS distributions



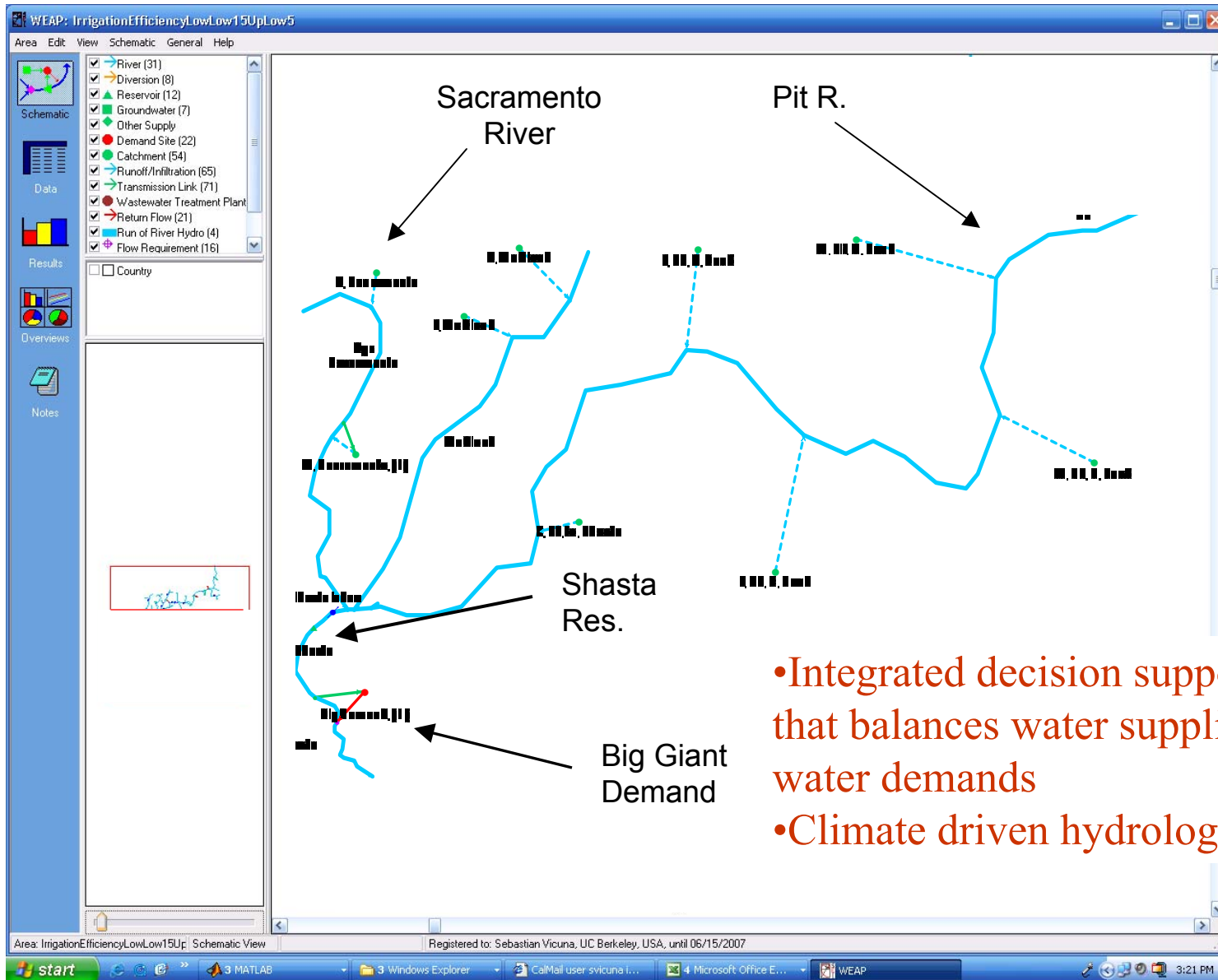
# IBUNE versus individual models



# Propagation of hydrological uncertainty

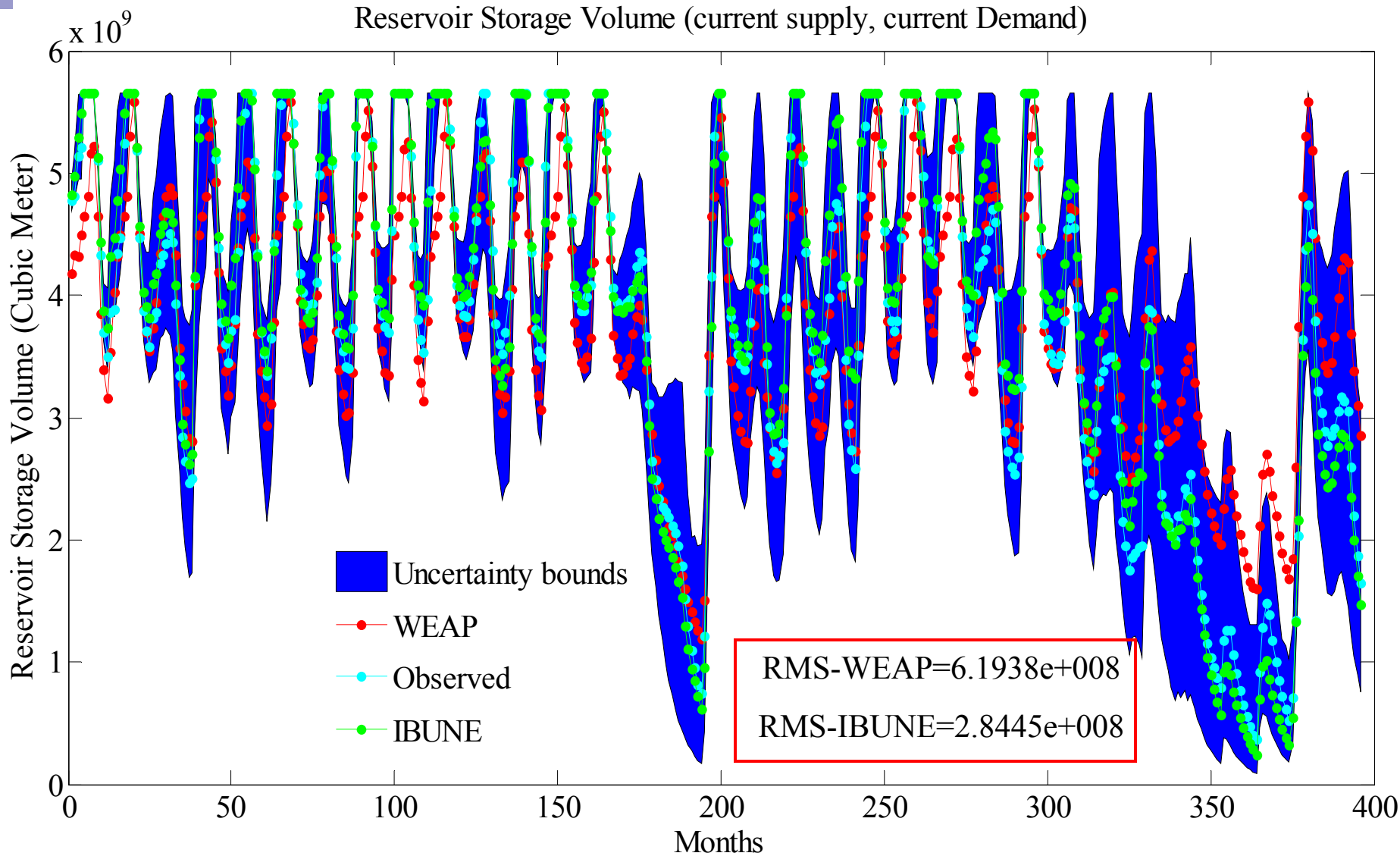
- Propagate the estimated uncertainty through a water management and planning model such as WEAP.
- Looking at the inflow to Shasta Dam.
- **Single aggregated demand** which represents the water demand south of Shasta.
- Evaluating the **reliability of water supplies** by analyzing the estimated uncertainty.
- Two scenarios:
  - Scenario 1: current supplies, current demand
  - Scenario 2: current supply, future demand (considering population growth for year 2030)

# WEAP model



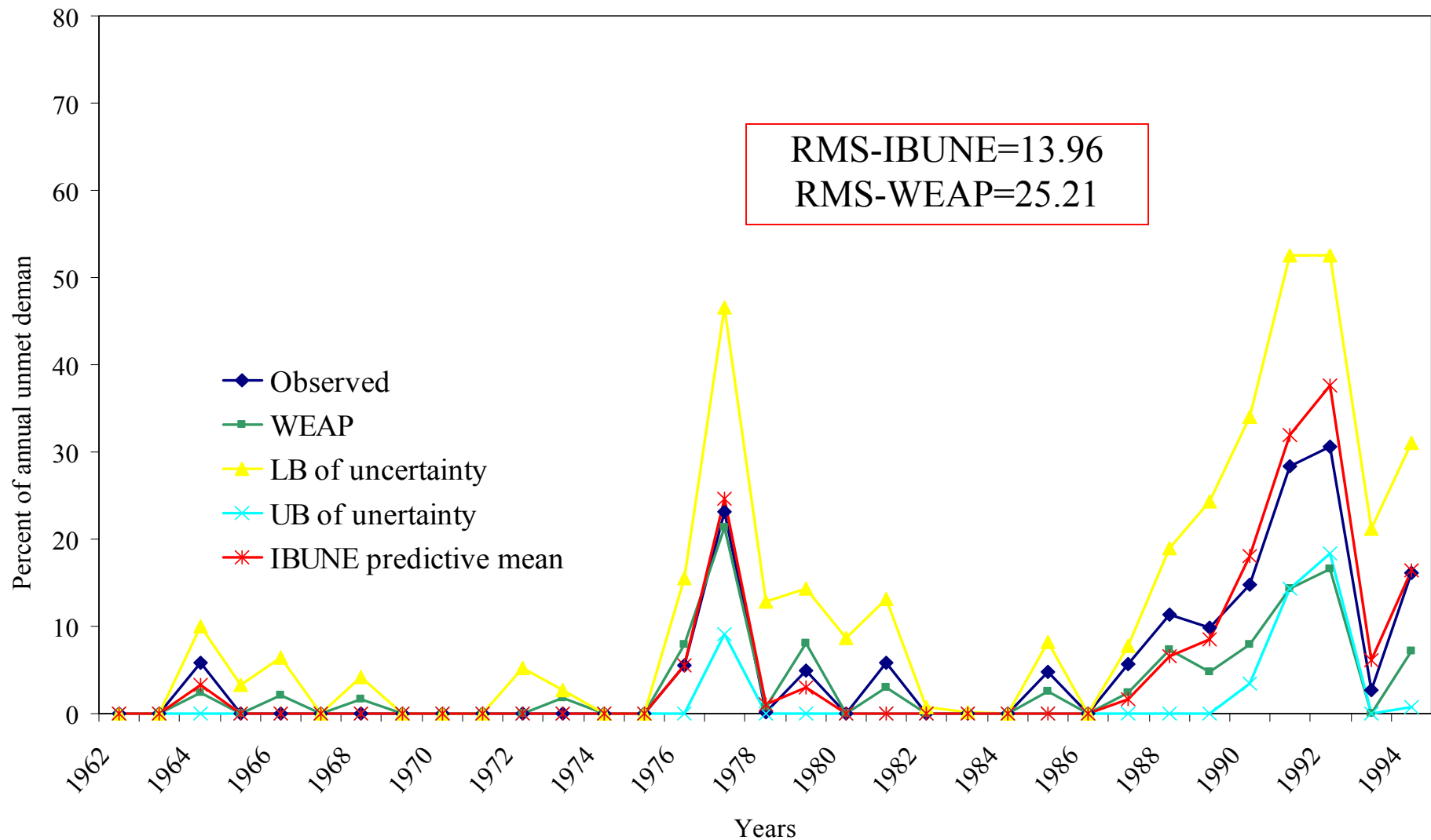
- Integrated decision support system model that balances water supplies and multiple water demands
- Climate driven hydrology

# Reservoir Storage Volume-current supply, current demand

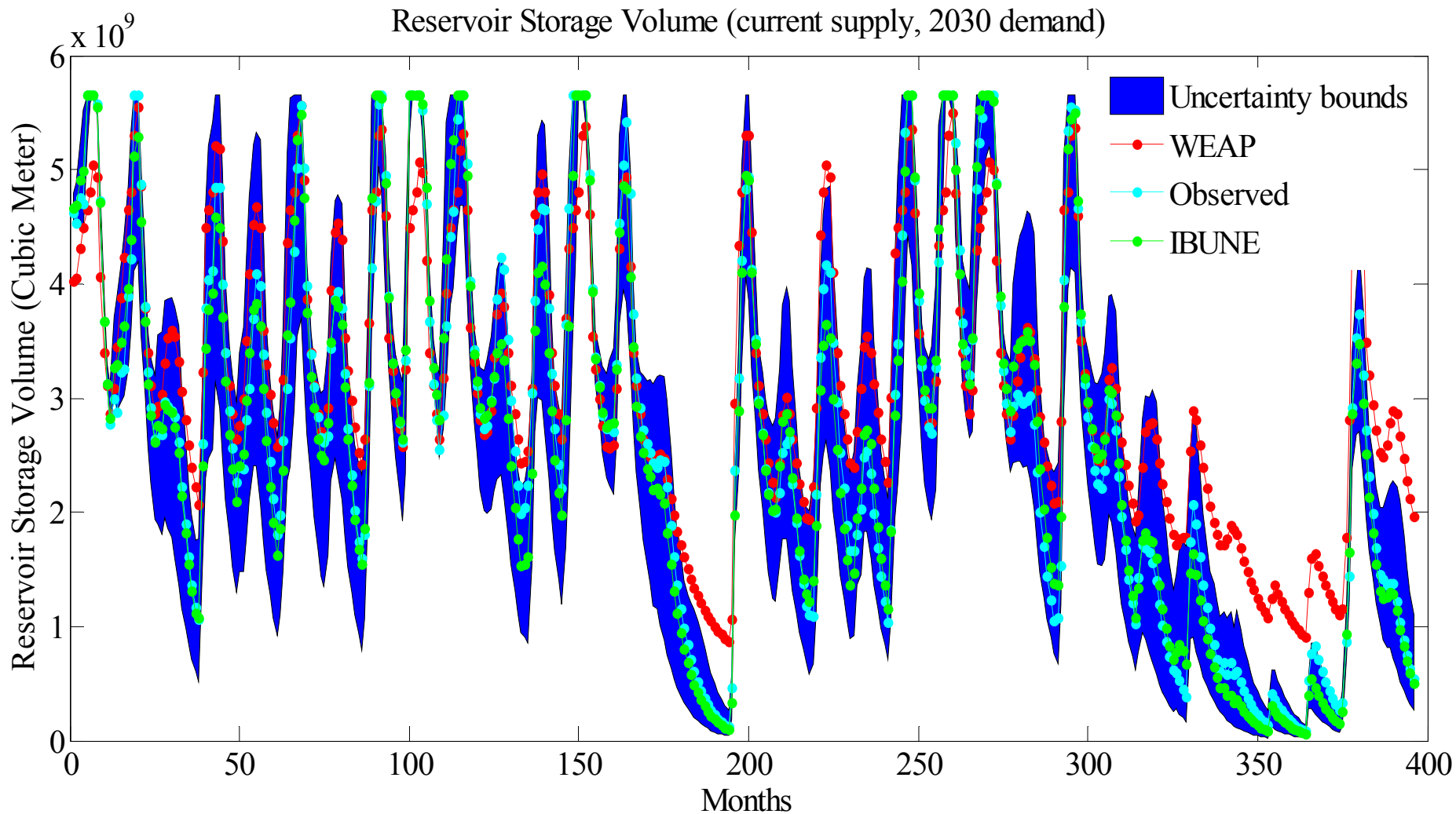


# Percent of annual unmet demand-current supply, current demand

## Percent of Annual Unmet Demand

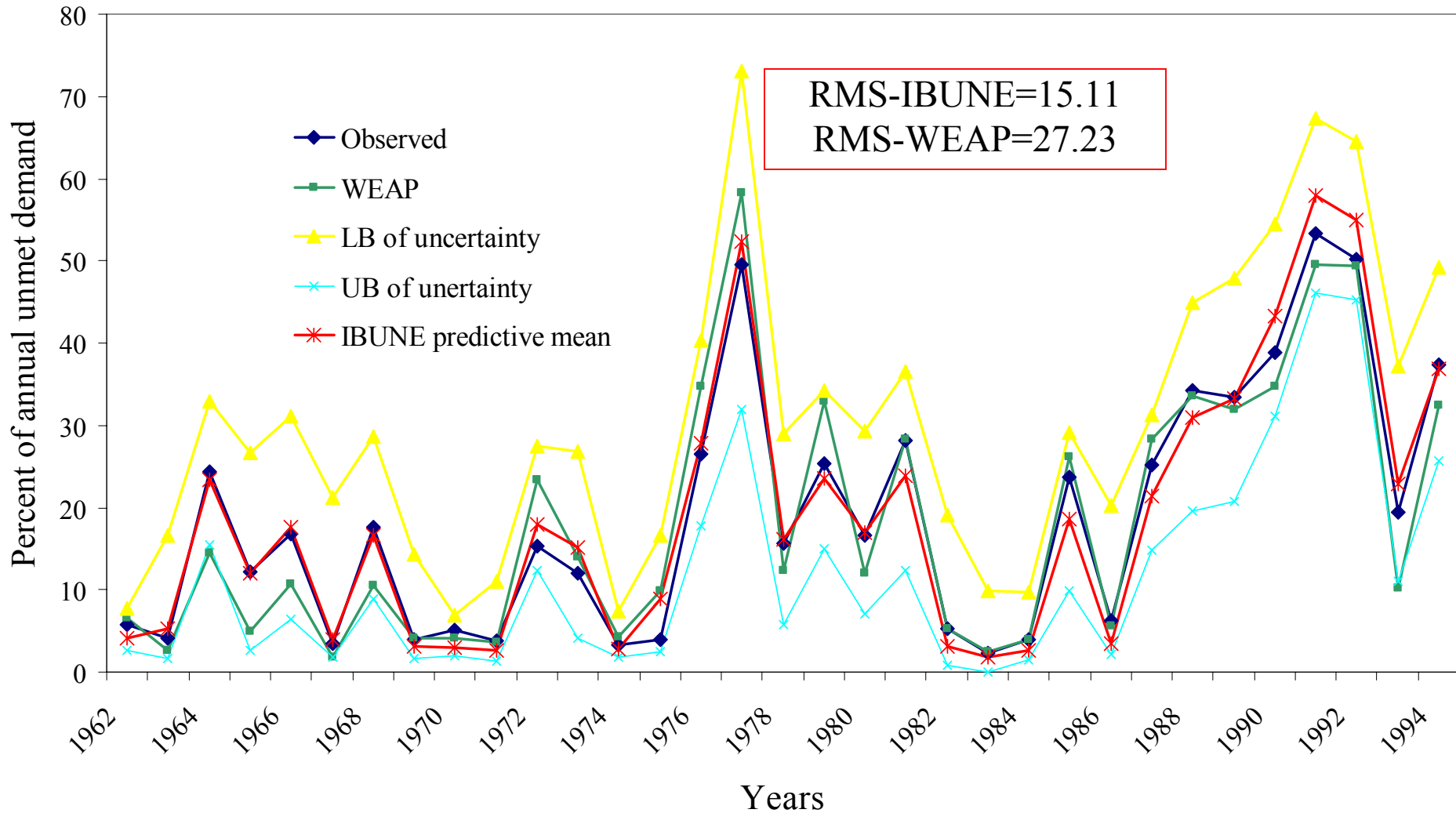


# Reservoir Storage Volume-current supply, 2030 demand



# Percent of annual unmet demand-current supply,2030 demand

## Percent of Annual Unmet Demand



# Preliminary conclusion

- IBUNE is an innovative steps toward higher accuracy and **more reliable hydrological forecasts** including floods and water supply.
- Accounting for **model structural uncertainty** (considering multiple models) considerably improves prediction of water management variables.
- More accurate prediction of these variables can lead to **more efficient operation** of reservoir consequently more efficient management of water resources.
- More precise assessment of uncertainty in the future events can help more reliable decision making and also provide an opportunity to consider alternative operational coordination strategy.

# Thanks

## Questions?



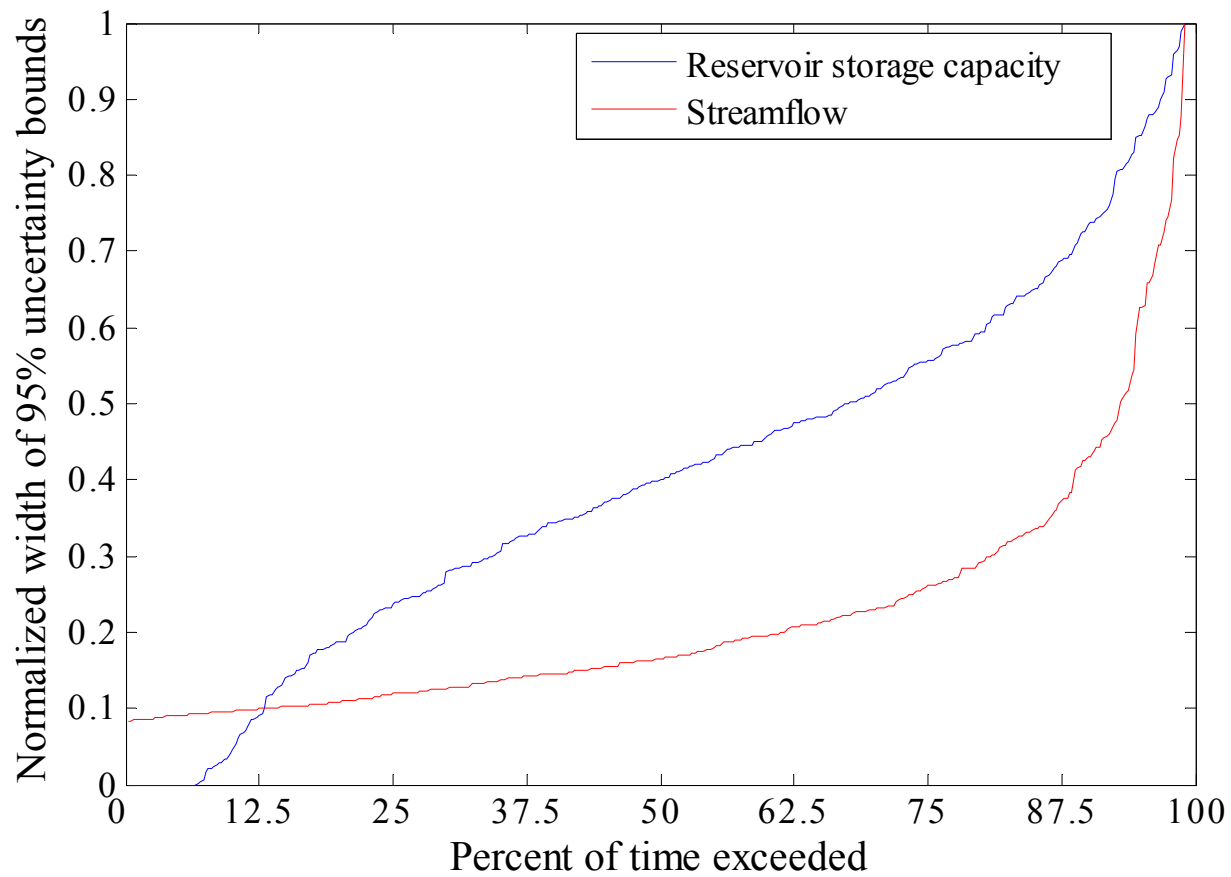
***Man is a complex being; he makes the deserts bloom and lakes die. (Gil Stern )***

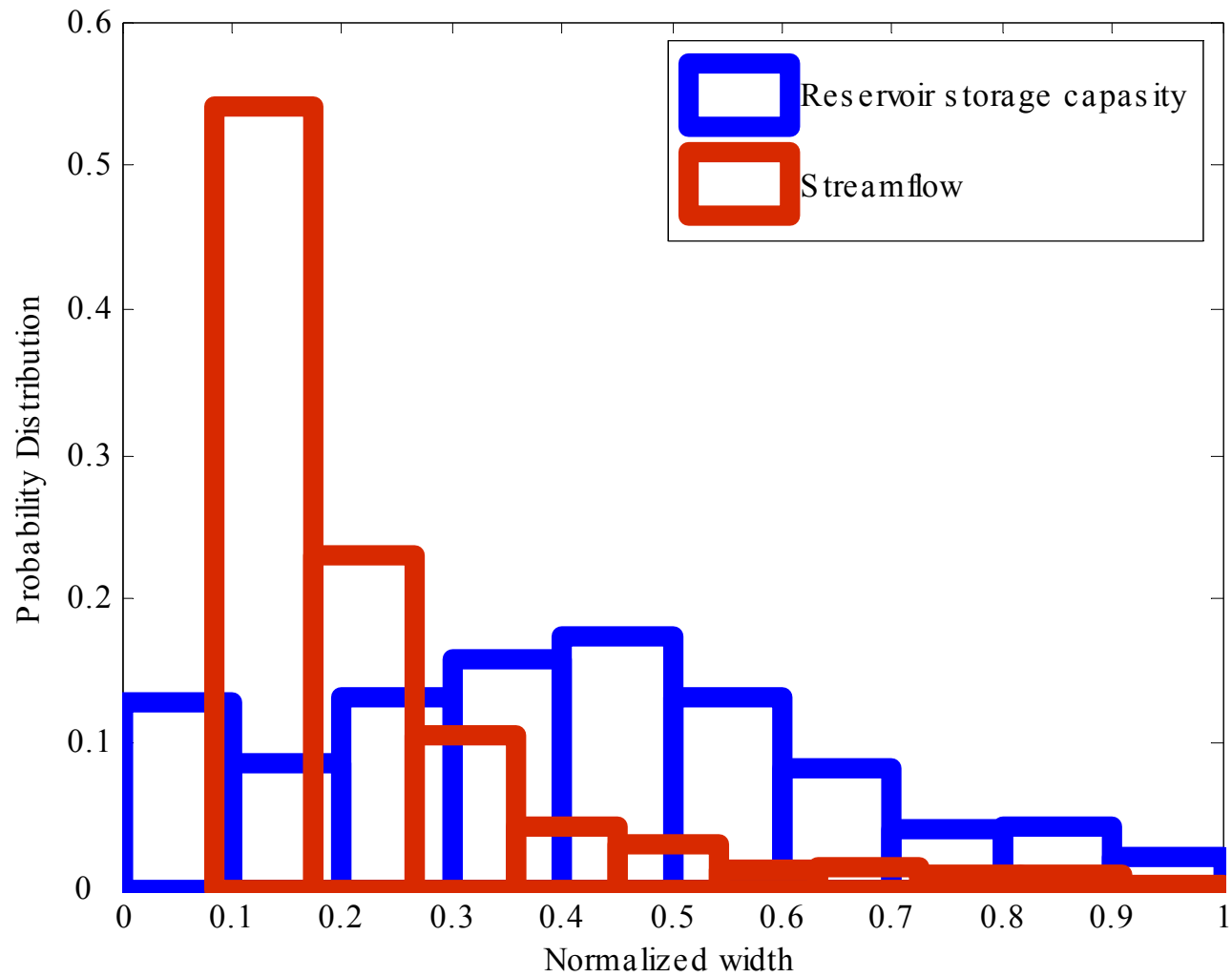
e.mail: [newshaajami@berkeley.edu](mailto:newshaajami@berkeley.edu)

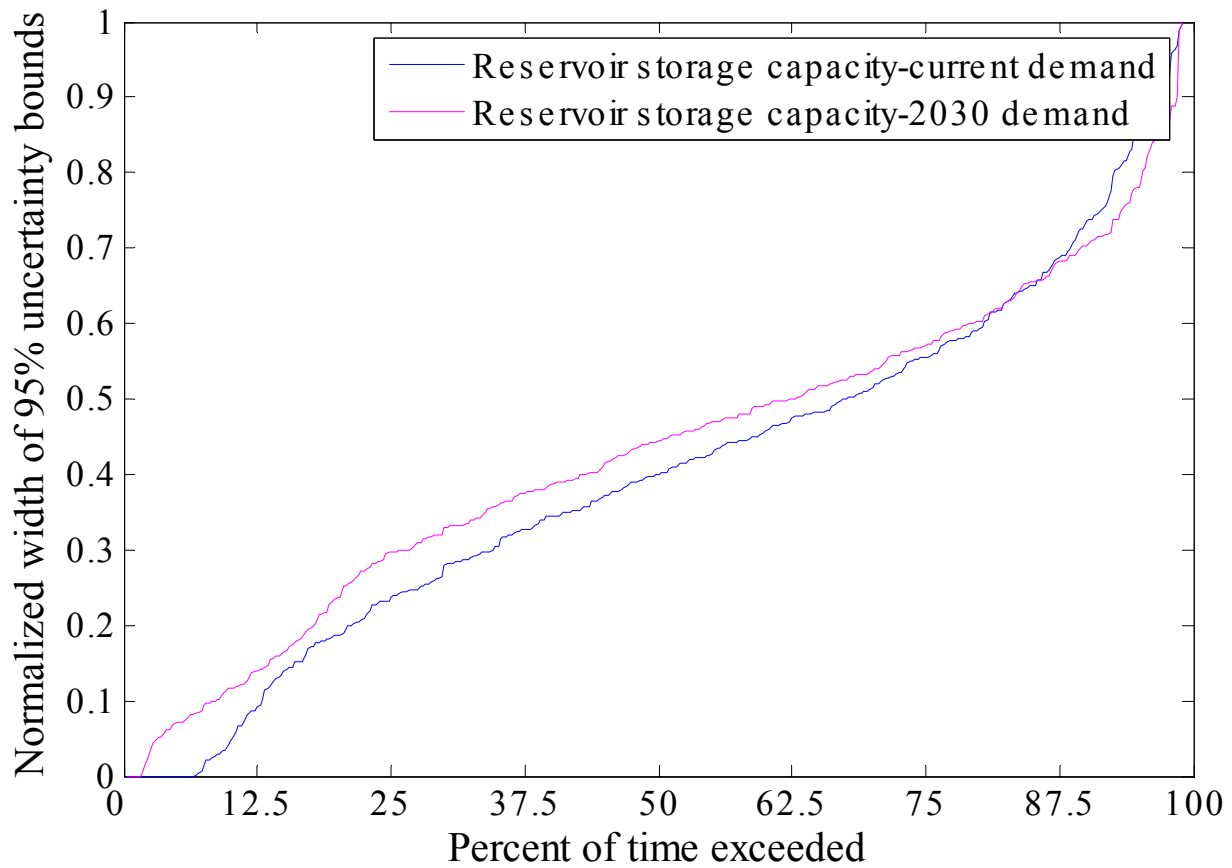
# Future steps....

- Assessing the uncertainty in input forcing.
  - Retrospective
  - Climate change
  
- We are still looking for better ways of analyzing and interpreting the impacts of hydrological uncertainty on future water supply.
  
- Also we would like to answer the following questions in our pilot project:
  - Will this accuracy lead to sustainable management of our limited water resources in the state of California?
  - What kind of alternative operational coordination strategy, considering the assessed uncertainty within the system, will decrease the risks in supply reliability and facilitates more efficient management of water resources?
  - What are the socio-economical impacts of more accurate quantification of uncertainty in the hydrologic component of the system?

# Normalized width of 95% uncertainty bound from streamflow to Reservoir







# A closer look: an excerpt of the hydrograph

Ensemble Model Predictions

