Computer Models and Water Resources Management: Examples, Perspectives, and a Few Opinions Mary C. Hill University of Kansas, USA





#### Water Resource Problems Drought and floods

- Water supply
- Land subsidence
- Transboundary disputes
- Nuclear waste disposal
- Affects of climate change
- Contaminant remediation



Model execution times can be seconds to days.

#### Examples, Perspectives, and a Few Opinions

- Examples
  - Klamath Basin, Oregon a chronic situation
  - Deepwater Horizon Blowout an acute situation



Prepared in cooperation with the Klamath Water and Power Agency and the Oregon Water Resources Department

Evaluation of Alternative Groundwater-Management Strategies for the Bureau of Reclamation Klamath Project, Oregon and California



Scientific Investigations Report 2014–5054

## Klamath Basin, Oregon, USA Brian Wagner and Marshall Gannett U.S. Geological Survey



## Klamath Basin

- Not enough flow is leaving the Klamath to support salmon in the lower reaches.
- The salmon is critical to native American tribes
- The water is critical to farmers.
- Entities involved: Indian tribes, states of Oregon and Washington, US Bureau of Land Management, all people of the Klamath valley



#### Why 2001?





April 6, 2001- No. 19,739

RECLAMATIONS

Welcome to

Vlamath Fails

POPULATION: INSIGNIFICANT

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H&N photo by Gary

the Kla

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go dry for

By JOHN BRAGG &N Staff Writer Federal , annour

benefit of fish

No water for most farmers spokesman for Walden, said there was little to do now but try to minimize the damage. The announcement includ. ed word from the Department of Agriculture that most crops in the affected area are eligit ble for crop insurance or other assistance, including "prevented planting" payments for farmers who purchased crop insurance before the drought was declared. Farmers should contact their crop insurance agents for details, Reclama tion officials said. Sen. Gordon Smith will be in Klamath Falls Saturday morning for a town hall meeting at 10:30 a.m. at the Shilo Inn. Afterwards F have lunch nr

## Priorities shift to protect aquatic habitat

- In 2001, water-management priorities in the basin shifted to protect aquatic habitat.
- This realignment of water supply and demand has reduced surface water agriculture and increased demand for groundwater, particularly in drought years.

#### Why 2001?



#### Resolution

- Technical Goals
  - Protect environmental flows
  - Meet water demand
  - Evaluate effects of climate change
- Societal goals
  - Find constructive solutions
    - Involve stakeholders
    - Establish trust
- How?
  - Determine water demand as the larger
    - simulated value
    - value obtained directly from data
  - Federal agency BLM buys water from users in dry years



Brian Wagner & Marshall Gannett, USGS. Klamath Basin Science Conference. 2010

## Solution

- Supplemental groundwater volume purchased for the Bureau of Reclamation Klamath Irrigation Project, upper Klamath Basin, Oregon and California, 2001–10.
- Groundwater was not purchased in 2002, 2008, and 2009.



## Now

- Bureau of Reclamation provides yearly projections
- 2015 is a year of drought
- October 2014 through April 1, 2015, 96% of average precip, but snowpack is only 7% of average.
- Allocations to many water users are reduced.



## USGS collects data and makes it available at <a href="http://or.water.usgs.gov/projs\_dir/klamath\_cooperative\_monitoring/index.html">http://or.water.usgs.gov/projs\_dir/klamath\_cooperative\_monitoring/index.html</a>



USGS Home Contact USGS Search USGS

#### **Upper Klamath Basin Collaborative Groundwater Monitoring**

Home Klamath Groundwater Study Monitoring Partners - Groundwater Publications Contact - Disclaimer

#### **Upper Klamath Basin Collaborative Groundwater Monitoring Map**

A partnership between the USGS, the Oregon Water Resources Department, the California Department of Water Resources, and the Klamath Water and Power Agency

This web page provides access to current and historic groundwater-level data collected by monitoring partners, as well as water-level graphs and maps showing net water-level changes between any two time periods. Data for individual wells are filtered to remove measurements taken during active pumping because they do not accurately represent conditions in the aquifer.

**Basic Map Features Tutorial** 

#### 



## Role of Modeling in this work

- Provided a focal point for data collection, analysis, and interpretation
- Helped people involved to understand the problem and adapt to being proactive and constructive
- Provides a continuing tool for deciding how much groundwater to pump each year

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# Simulation of Flow of the Deepwater Horizon Blowout

From Report by Hsieh 2010

Presented by Mary C Hill

#### Groundwater Modeling in a Time of Crisis



#### MODFLOW

Computer Simulation of Reservoir Depletion and Oil Flow from the Macondo Well Following the Deepwater Horizon Blowout

By Paul A. Hsieh









Open-File Report 2010–1266

U.S. Department of the Interior U.S. Geological Survey



#### Groundwater Modeling in a Time of Crisis





#### Deepwater Horizon Blowout, April 20, 2010

- July 15, 2010 (86 days): the Macondo well was shut in to begin the Well Integrity Test.
- A computer simulation was carried out to analyze the shut-in pressure data obtained during this test in order to:
  - assess reservoir depletion resulting from oil flow during the 86 days from blowout to shut in
  - estimate oil flow rate from the well
  - estimate of total volume of oil discharged
- These results have been critical to deciding what compensation is owed by the oil producer, BP

## Why was MODFLOW Used?

- MODFLOW was originally designed to simulate the flow of groundwater in aquifers.
- It can be readily adapted for simulating flow of oil in reservoirs under single-phase and isothermal conditions
  - Changed interpretation of the model input and output.
  - The model and data input structure stay the same

#### Simulated dimensions of the oil reservoir





## Cross-section of the Macondo Well







## Final Results

- Oil flow from damaged well ~ 50,000 barrels per day
- Total spill ~ 4.1 million barrels
- These results could only be obtained through modeling

#### Examples, Perspectives, and a Few Opinions

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- Perspectives. More can be obtained from models than matching observations and making predictions
  - What about the model is important and unimportant?
  - Of the data used in model development, what was important?
  - How sure is the prediction?
  - What new data would be most important?

#### Example: Maggia Valley, southern Switzerland





Goal: Integrated hydrologic model to help manage the ecology of this altered hydrologic system.

#### Foglia 2007, 2009, 2013



#### Maggia Valley, southern Switzerland

Series of studies to identify and test a useful, computationally frugal protocol with which to develop the eventual integrated hydrologic model, which will be computationally demanding. Use the component surface and groundwater models for the tests.

- 1. Test frugal sensitivity analysis (SA) using cross-validation
  - Foglia + 2007 Ground Water
- 2. Demonstrate frugal optimal calibration method
  - Rainfall-Runoff model (Foglia + 2009 WRR)
- 3. Test of how well AIC, AICc, BIC, KIC identify models with good predictive ability using cross validation
  - Use SA and calibration methods (Foglia + 2013 WRR)



#### Which parameters are important and unimportant?

High bars (A) All pairs of L, Ks, and  $\theta$  parameters for soil types 2, 3, and 4 Parameter importance to observations, using CSS 25 indicate important are highly correlated (Statistic |PCC| close to 1.00) parameters observations, using 20 Learned 15 something! 10 Only a few parameters are 5 important and 0 they cannot all be Ks θ Mannings Coefficients estimated Overland flow **River order** For soil types 2-5, 8, 11 because of land/slope type 1-12 1-5 parameter interdependence.



#### Which observations are important and unimportant?



Death Valley regional flow system



# What new observations would be important (or not) to predictions?

Consider one potential new head observation in each cell of model layer 1.

Determine weights for the potential observations.

Here, same weighting strategy used as for weighting existing observations – weights smaller for heads in high-gradient areas.

Calculate  $opr_{(+1)}$  for each cell in the layer, even those with an existing observation, so that  $opr_{(+1)}$  is continuous over the whole map.



Hill and Tiedeman, 2007, fig. 15.10. p. 369

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- Opinions
  - Learn more from models by using convenient sensitivity analysis and uncertainty quantification methods
  - Hill et al 2015 Ground Water

#### FREEWAT

 An exciting new EU program that will allow more to be learned from a set of existing constructed models and provide approaches and tools for the future.





71 highly parallelizable model runs

#### Test Case

- Use simple test cases to understand
- Models vary in how the spatially distributed parameter K is represented.
  HO: homogeneous 3Z: 3 zones
  INT: interpolated

Predict flow to stream under pumping conditions



# Regression and Bayesian uncertainty intervals for a groundwater investigation



Lu et al. 2012 Water Resources Research

#### Diagnostic Tests for Computationally Frugal Methods



#### Model runs to understand model results

#### Calibration with heads only and

With concentration observations Here, explore Model calibrated with heads only

what difference does one type of observation make to predictions?

Plume lengths differ by a about a factor of 2.



Barlebo Hill Rosbjerg Jensen 1998 Nordic Hydrology