

# ***Annual Report by Work Group 2 on Uncertainty Analysis and Parameter Estimation***

**Tom Nicholson, U.S. Nuclear Regulatory Commission**

**Dr. Yakov Pachepsky**

**Professor Mary Hill, University of Kansas**

*2015 ISCMEM Annual Public Meeting*

*October 28 - 29, 2015*

*U.S. Army Corps of Engineers, Davis, CA*



# Outline

- Work Group 2 (WG2) Objective and Goals
- Members and Participants
- Seminars at the WG2 Meetings
- Activities and Technical Projects
- Methodologies, Tools and Applications
- Forward Strategy
- Recommendations for FY2016

# Work Group Objectives

- Coordinate ongoing and new research conducted by U.S. Federal agencies on:
  - parameter estimation
  - uncertainty assessmentin support of environmental modeling & applications
- Focus on strategies and techniques
- Includes **sensitivity analysis**

*What is needed to achieve this objective?*

Coordination of research staff and their management thru efficient and targeted use of our limited resources.

# Work Group Goals

- **Basics:**
  - ✓ Develop a creative, collaborative environment to advance
    - parameter estimation in the context of model development .
    - sources of uncertainty in the context of model predictions.
  - ✓ Develop a common terminology.
  - ✓ Identify innovative applications.
- **Existing Tools:** Identify, evaluate, and compare available analysis strategies, tools and software.
- **New Tools:** Develop, test, and apply new theories and methodologies.
- **Exchange:** Facilitate exchange of techniques and ideas thru teleconferences, technical workshops, professional meetings, interaction with other WGs and ISCMEM
- **Communicate:** Develop ways to better communicate uncertainty to decision makers (e.g., evaluation measures, visualization).



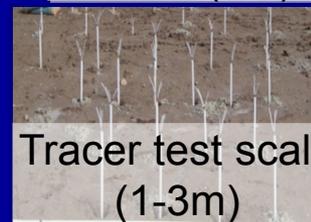
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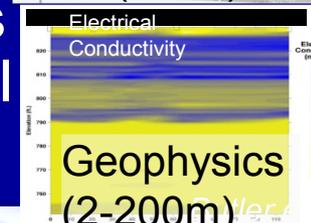
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Intermediate  
scale (2m)



Tracer test scale  
(1-3m)



Geophysics  
(2-200m)

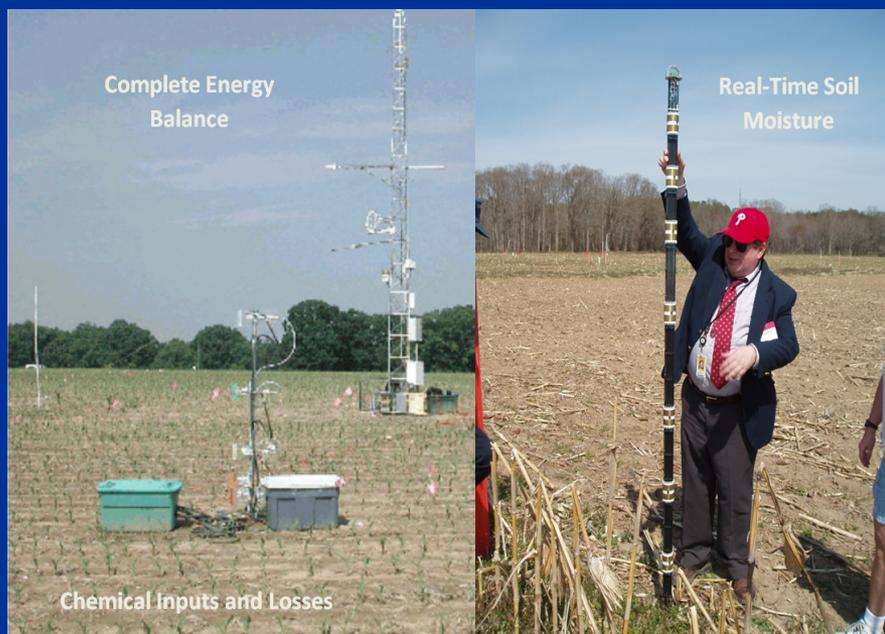


Plume scale  
(2000m)

# Members and Participants

from U.S. Federal agencies, universities, and industry

- Tom Nicholson, NRC, co-Chair
- Yakov Pachepsky, ARS, co-Chair
- Mary Hill, U. Kansas, co-Chair
- Ming Ye, Florida State U
- Ming Zhu, DOE
- Gary Curtis, USGS
- Brian Skahill, USACOE
- Matt Tonkin, SSPA
- Gene Whelan, EPA-Athens
- Steve Yabusaki, PNNL
- Sanja Perica, NOAA/NWS
- Larry Deschaine, HydroGeologic, Inc.



- Boris Faybishenko, LBNL
- Pierre Glynn, USGS
- Philip Meyer, PNNL
- Bill Cooper, NSF
- Debra Reinhart, NSF
- Bruce Hamilton, NSF
- You?

# Activities: Seminars

We conduct seminars to:

- review and discuss ongoing research studies and software development
- formulate proposals for field applications

## ***Uncertainty Analysis for Probable Maximum Precipitation Estimates***

Zoran Micovic, Ph.D., P.Eng., BC Hydro, Canada

Mel Schaefer, Ph.D., P.E., MGS Engineering Consultants, USA

George Taylor, M.S., CCM, Applied Climate Services, USA

NOAA/National Weather Service

Silver Spring, MD

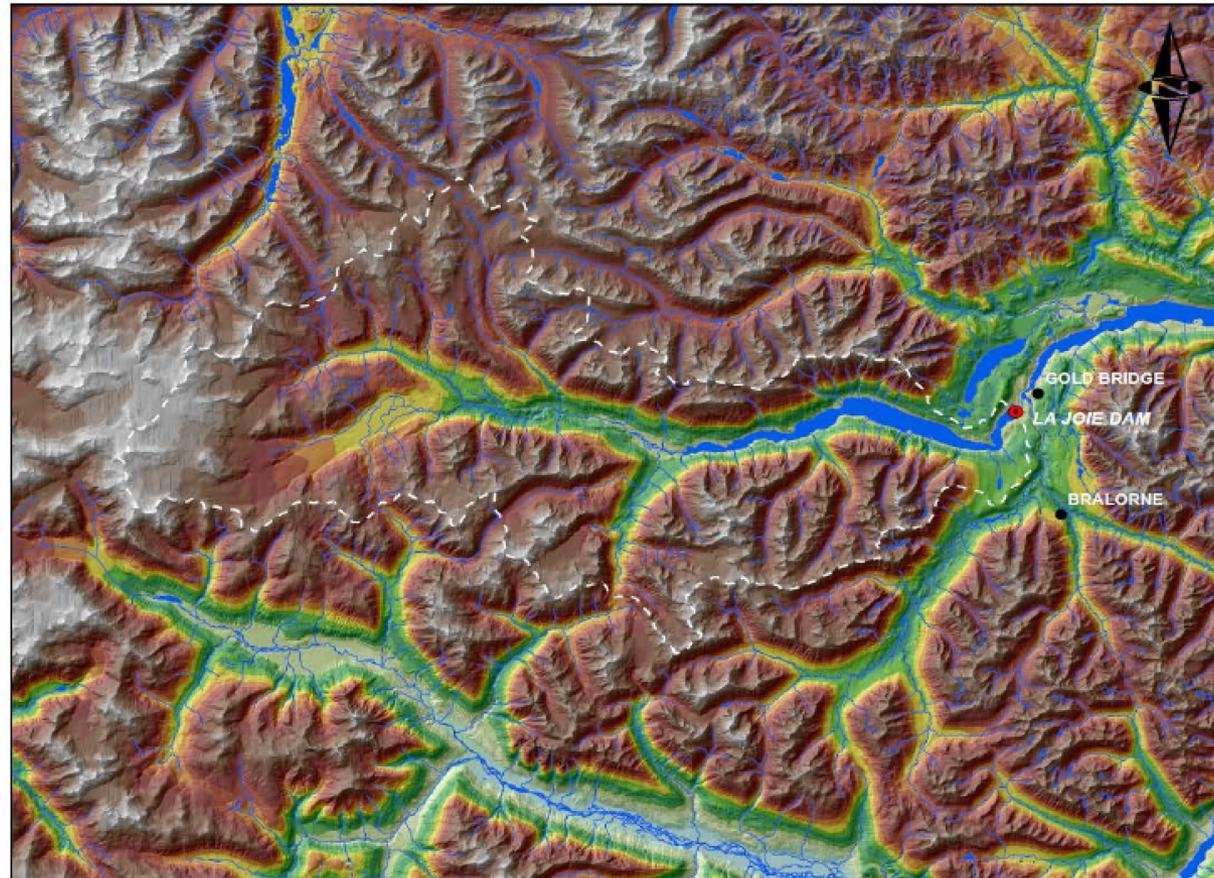
May 18, 2015

# OBJECTIVE OF THE UNCERTAINTY STUDY

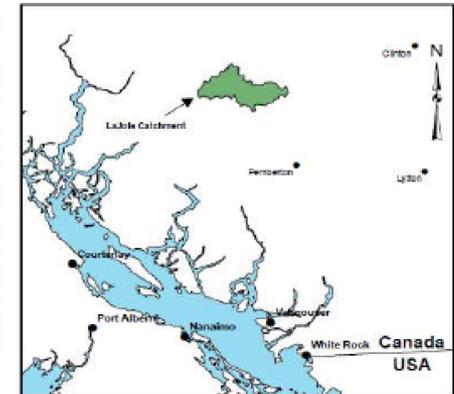
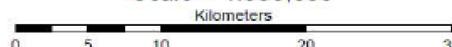
- To present a methodology for portraying the uncertain nature of PMP estimation by analyzing individual steps within the PMP derivation procedure whereby for each parameter requiring judgment, a range of possible values and associated likelihoods are specified
- The resulting range of possible PMP values can be compared with the previously derived operational single-value PMP, providing measures of the conservatism and variability of the original estimate
- To the knowledge of the investigators, this is the first time an uncertainty analysis has been conducted for a PMP derived through meteorological analyses

# Uncertainty Analysis for Probable Maximum Precipitation Estimates

## LA JOIE WATERSHED, BC, CANADA



Scale = 1:300,000

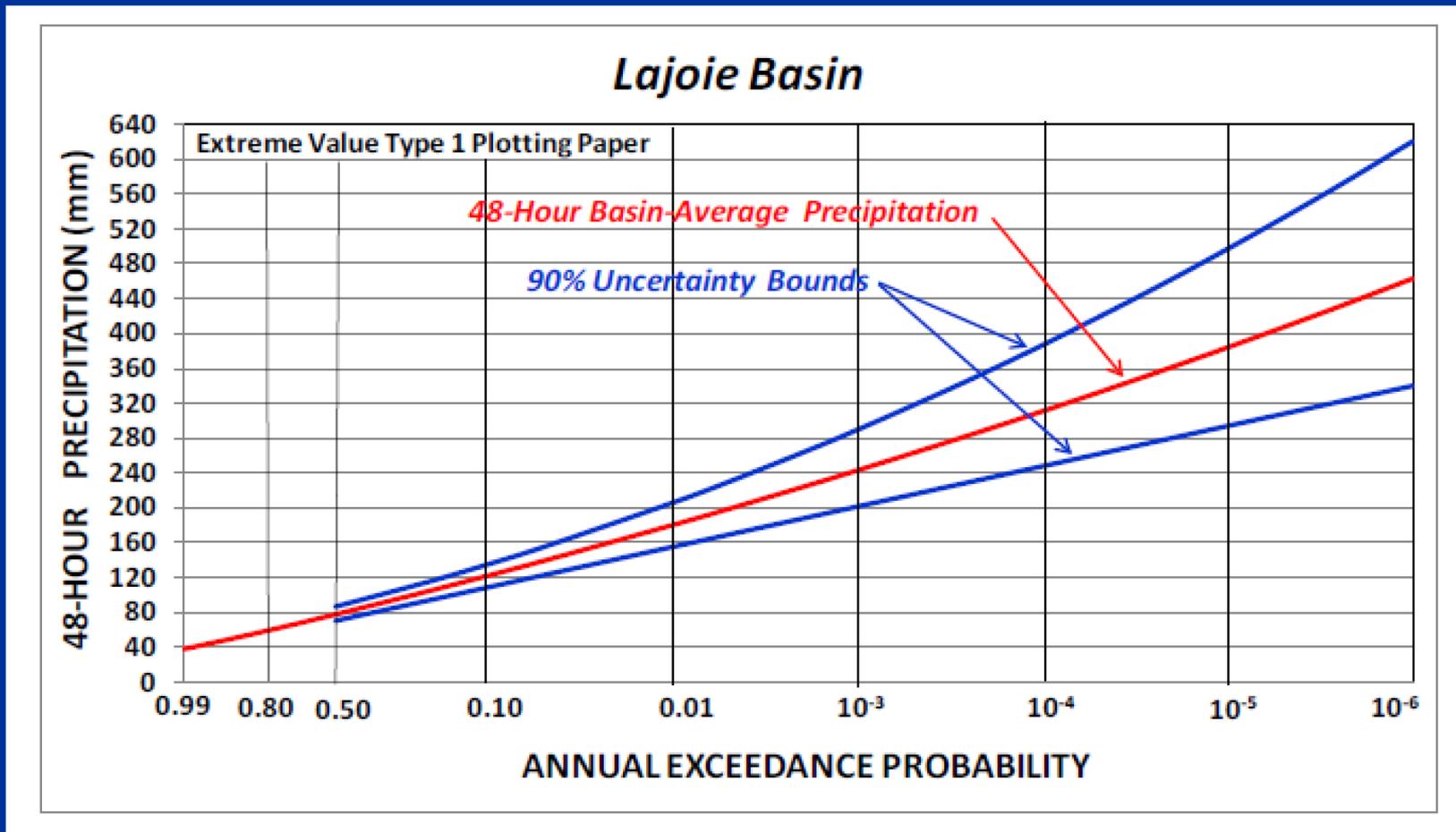


### LEGEND

#### Elevation (m)

280 - 400	1,601 - 1,750
401 - 550	1,751 - 1,900
551 - 700	1,901 - 2,050
701 - 850	2,051 - 2,200
851 - 1,000	2,201 - 2,350
1,001 - 1,150	2,351 - 2,500
1,151 - 1,300	2,501 - 2,650
1,301 - 1,450	2,651 - 2,800
1,451 - 1,600	2,801 - 3,000

- Uncertainty Analysis for PMP was conducted in a manner consistent with assumed existence of an upper limit to precipitation



Assumption: the slope of the precipitation-frequency relationship for extreme precipitation is sufficient that greater precipitation is possible with decreasing likelihood. However, there is a physical upper limit for precipitation for a given location, duration, and area size.

# METHODOLOGY FOR ASSESSING UNCERTAINTIES

- Identify sources of uncertainty which are the major contributors to the total uncertainty for a site-specific application
- Formulate procedures under the assumption there is a physical upper limit for precipitation for a given location, duration and area size
- Determine the range of plausible values for each of the parameters used in computation of PMP
- Develop a probability distribution or otherwise characterize the likelihood of parameter values over the range of values for each parameter
- Use Monte Carlo simulation methods to determine the distribution of possible PMP values, the best-estimate and uncertainty bounds and identify the likelihood of the originally adopted PMP value within the distribution
- Test the method on a watershed for which a single-value PMP has already been developed using conventional deterministic methods

# WG2 Forward Strategy

Energize the science and technology thru closer linkage to decision making:

- better understand the methods being used in parameter estimation and uncertainty analyses
- *establish a base set of model sensitivity analysis and uncertainty evaluation measures, in addition to the other performance measures*
- use and compare different methods in practical situations

# Recommendations for FY2016

- Expand multimedia scope and WG2 membership
- Assist development and creation of other working groups
  - Take advantage of the relevance of uncertainty and parameter estimation to all environmental modeling and monitoring fields.
  - Develop and conduct joint ISCMEM teleconferences
    - WG1 (Software System Design; design of uncertainty and parameter estimation software and data fusion)
    - WG3 (Reactive Transport Models and Monitoring; support decision making)
  - Act as an incubator to build support for new ideas
    - Proposed WG on monitoring based on the importance of monitoring to uncertainty and parameter estimation, and visa versa
- Sponsor technical workshops on endorsed studies
- ISCMEM Website
  - Develop a new Website to enhance Information Transfer of Technical Reports and Data Sources

# References

Micovic, Zoran; Schaefer, M.G.; and Taylor, G.H.; *Uncertainty analysis for Probable Maximum Precipitation estimates*, Journal of Hydrology 521 (2015) 360 – 373, Elsevier B.V., New York, NY

# I S C M E M

INTERAGENCY STEERING COMMITTEE ON  
MULTIMEDIA ENVIRONMENTAL MODELING

## Annual Public Meeting on Environmental Modeling

