

# Data Uncertainty Estimation Tool for Hydrology and Water Quality (DUET-H/WQ):

## Estimating Measurement Uncertainty for Monitoring and Modeling Applications

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Agricultural  
Research  
Service

# Objectives

- Present background information on uncertainty in flow and water quality data
- Describe the Data Uncertainty Estimation Tool for Hydrology and Water Quality (DUET- H/WQ)
- Present results of DUET- H/WQ application to measured data
- Briefly discuss relevance to model calibration and validation



# Introduction

**“Should it not be required that every... (field and modeling study) ...attempt to evaluate the uncertainty in the results?” Beven (2006)**

**“The use of uncertainty estimation... (should be)...routine in hydrological and hydraulic science.” Pappenberger, Beven (2006)**

- **Data uncertainty is almost always ignored in analysis and reporting of H/WQ data**
  - **In spite of such calls for uncertainty analysis.**
  - **In spite of the fact that all measurements are inherently uncertain.**



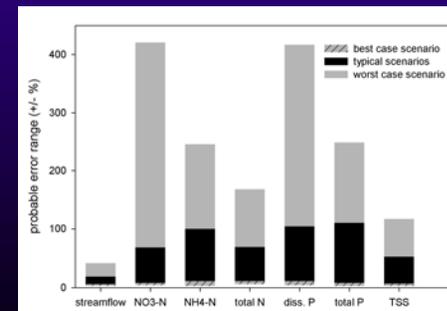
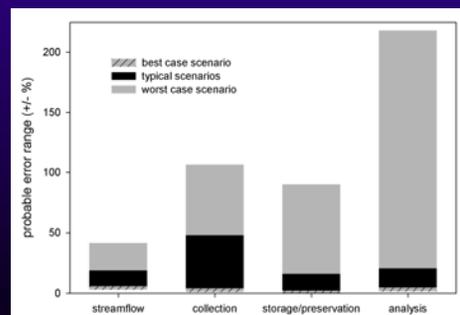
# Introduction

- Why is data uncertainty typically ignored?? Until recently...
  - An adequate understanding of H/WQ measurement uncertainty had not been established.
  - No complete uncertainty (error propagation) analysis had been conducted on measured H/WQ data.
  - No easy-to-use tool was available to assist with uncertainty estimation in H/WQ.



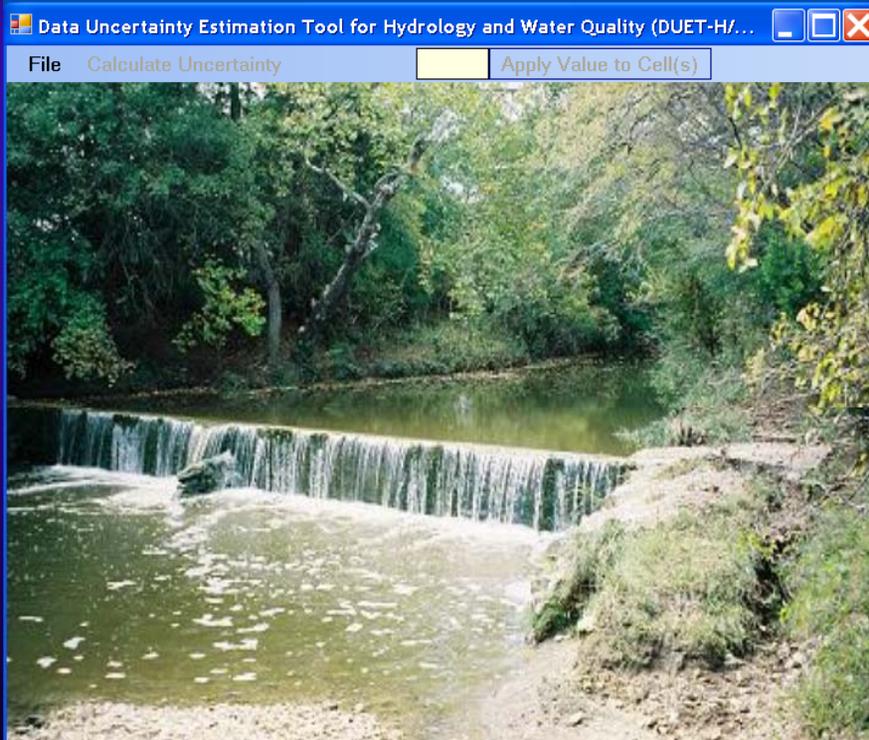
# Uncertainty Estimation Framework (2006)

- Focused on Q, TSS, N, and P data for small watersheds
- Provided published uncertainty estimates for data collection steps within each of four procedural categories
  - discharge measurement, sample collection, sample preservation/storage, laboratory analysis
- For arbitrary “data quality” scenarios (best, typical, worst)
  - compared uncertainty introduced by each procedural category
  - calculated cumulative uncertainty in resulting data



# DUET- H/WQ (2009)

- Based on 2006 framework
- Added “data processing and management” procedural category



DUET-H/WQ - Load Uncertainty

Click on each button below to estimate load uncertainty.

Select option

Use default load uncertainty

Calculate load uncertainty

[uncertainty  $\pm 2$ ]

Calculate Discharge Uncertainty	22.6
Calculate Sample Collection Uncertainty	18.7
Calculate Preservation and Storage Uncertainty	14.3
Calculate Laboratory Analysis Uncertainty	15.3
Enter Data Processing and Management Uncertainty	0

Load Uncertainty 36

Cancel OK

# DUET- H/WQ

- Uses the RMSE method to determine uncertainty
  - within each procedural category

DUET-H/WQ - LookUp Table for calculation of uncertainty in discharge measurement

Select the published value for each step or source of uncertainty

Individual discharge measurement	Uncertainty	Reference
Direct - area-velocity method - poor conditions	±20%	Sauer and Meyer (1992)
Direct - area-velocity method - average conditions	±6%	Sauer and Meyer (1992)
Direct - area-velocity method - ideal conditions	±2%	Sauer and Meyer (1992)
Direct - area-velocity method - ideal conditions	±2%	Boning (1992)
Direct - area-velocity method - ideal conditions (0.2,0.8d velocity)	±6.1%	Pelletier (1988)
Direct - area-velocity method - ideal conditions (0.6d velocity)	±8.5%	Pelletier (1988)
Manning's equation - Stable, uniform channel; surveyed reach and cross-section; accurate "n" estimate	±15%	Slade (2004)
Manning's equation - Unstable, irregular channel; surveyed reach and cross-section; poor "n" estimate	±35%	Slade (2004)
Direct - area-velocity method	±5% to ±15% (average ±9.3%)	Tillary et al. (2006)
Indirect - culvert equation	±15%	Tillary et al. (2006)

± 6 %  
(Click to change)

Continuous discharge measurement	Uncertainty	Reference
Pre-calibrated flow control structure (properly designed and installed) with periodic meter checks	±5% to ±8%	Slade (2004)
Pre-calibrated flow control structure (properly designed and installed)	±5% to ±10%	Slade (2004)
Stable channel with stable control, 8-12 stage-discharge measurements per year	±10%	Slade (2004)
Shifting channel, 8-12 stage-discharge measurements per year	±20%	Slade (2004)
Natural channel, ideal conditions	±6%	Boning (1992)
Instream velocity meter	---	N/A
OTHER -	---	N/A

± 6 %  
(Click to change)

Continuous stage measurement	Uncertainty	Reference
Float recorder	±2%	Cooper (2005), unpublished data
Float recorder	±3 mm	Hershey (1975)
KPSI series 173 pressure transducer	±0.1%, ±0.022% thermal error	KPSI (2005)
ISCO 730 bubbler flow module	±0.035 ft ±0.0003 * ft * temp. change from 72 deg. F	Teledyne ISCO (2005)
Campbell Scientific SR50-L ultrasonic distance sensor	Larger of ±1 cm or 0.4% of distance to water surface	Campbell Scientific (2003)
OTHER -	---	N/A

± 2 %  
(Click to change)

Effect of streambed condition	Uncertainty	Reference
Stable, firm bed	±0%	Sauer and Meyer (1992)
Mobile, unstable bed	±10%	Sauer and Meyer (1992)
OTHER -	---	N/A

± 4 %  
(Click to change)

Cumulative uncertainty in discharge measurement ± 9.6 %

Cancel OK

$$E_Q = \sqrt{\sum (E_{Q1}^2 + E_{Q2}^2 + E_{Q3}^2 + E_{Q4}^2)}$$

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± 6 %  
(Click to change)

**Continuous discharge measurement**

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± 2 %  
(Click to change)

**Effect of streambed condition**

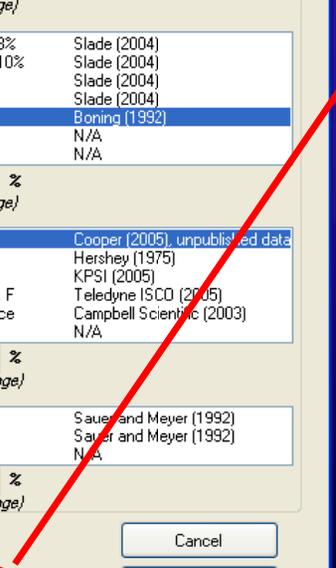
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± 4 %  
(Click to change)

Cumulative uncertainty in discharge measurement ± 9.6 %

Cancel  
OK

$$E_Q = \sqrt{\sum (E_{Q1}^2 + E_{Q2}^2 + E_{Q3}^2 + E_{Q4}^2)}$$



# DUET- H/WQ

- Uses the RMSE method to determine uncertainty
  - within each procedural category
  - for individual measured discharge, concentration, load values

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(Click to change)

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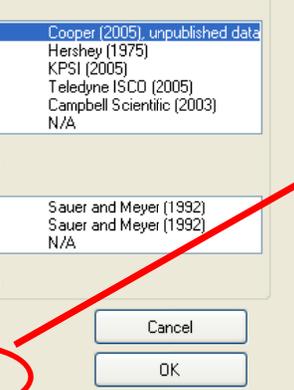
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OTHER -	---	N/A

± 4 %  
(Click to change)

Cumulative uncertainty in discharge measurement : **9.6 %**

Cancel  
OK

$$EP = \sqrt{\sum (E_Q^2 + E_C^2 + E_{PS}^2 + E_A^2 + E_{DPM}^2)}$$

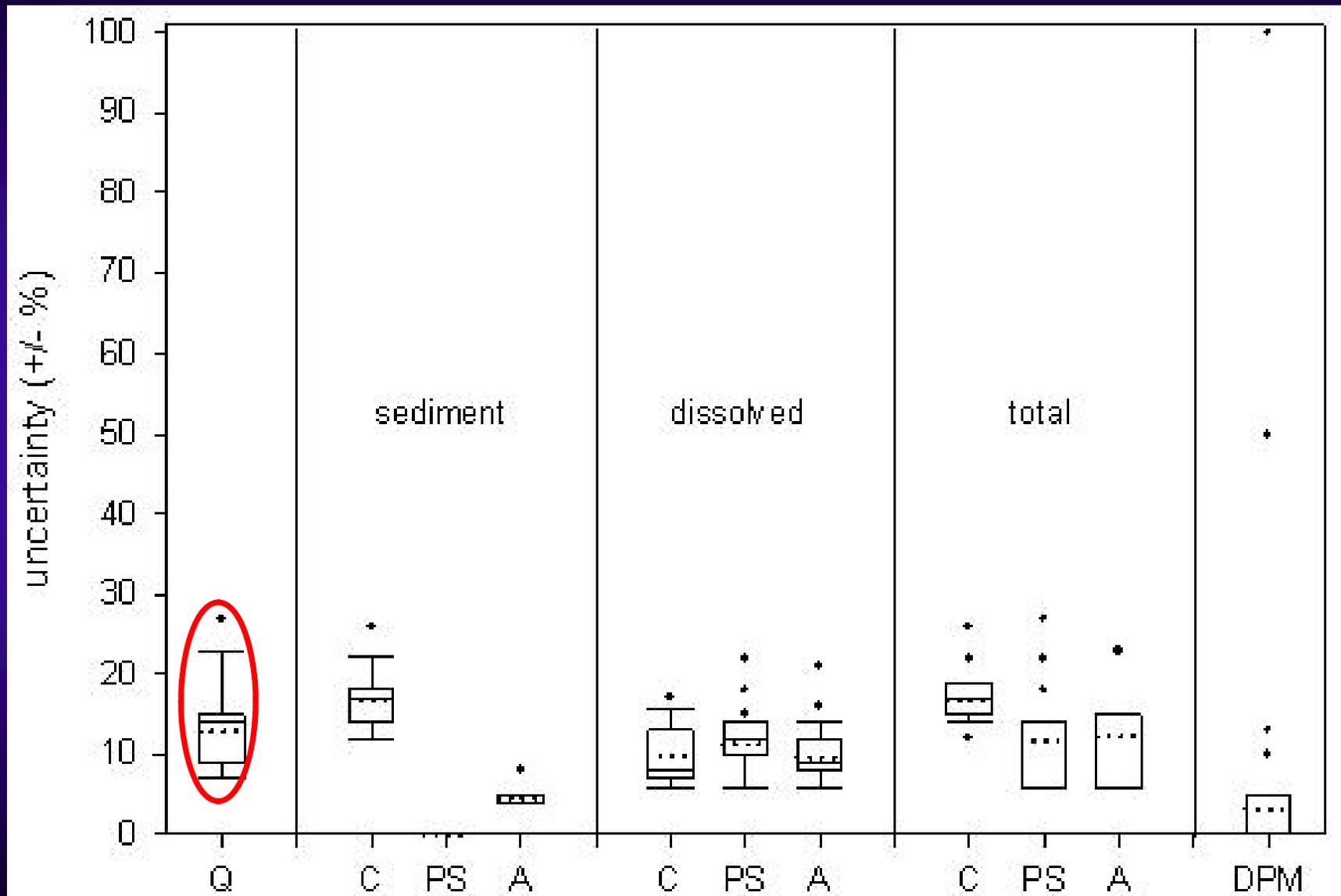


# DUET- H/WQ Application

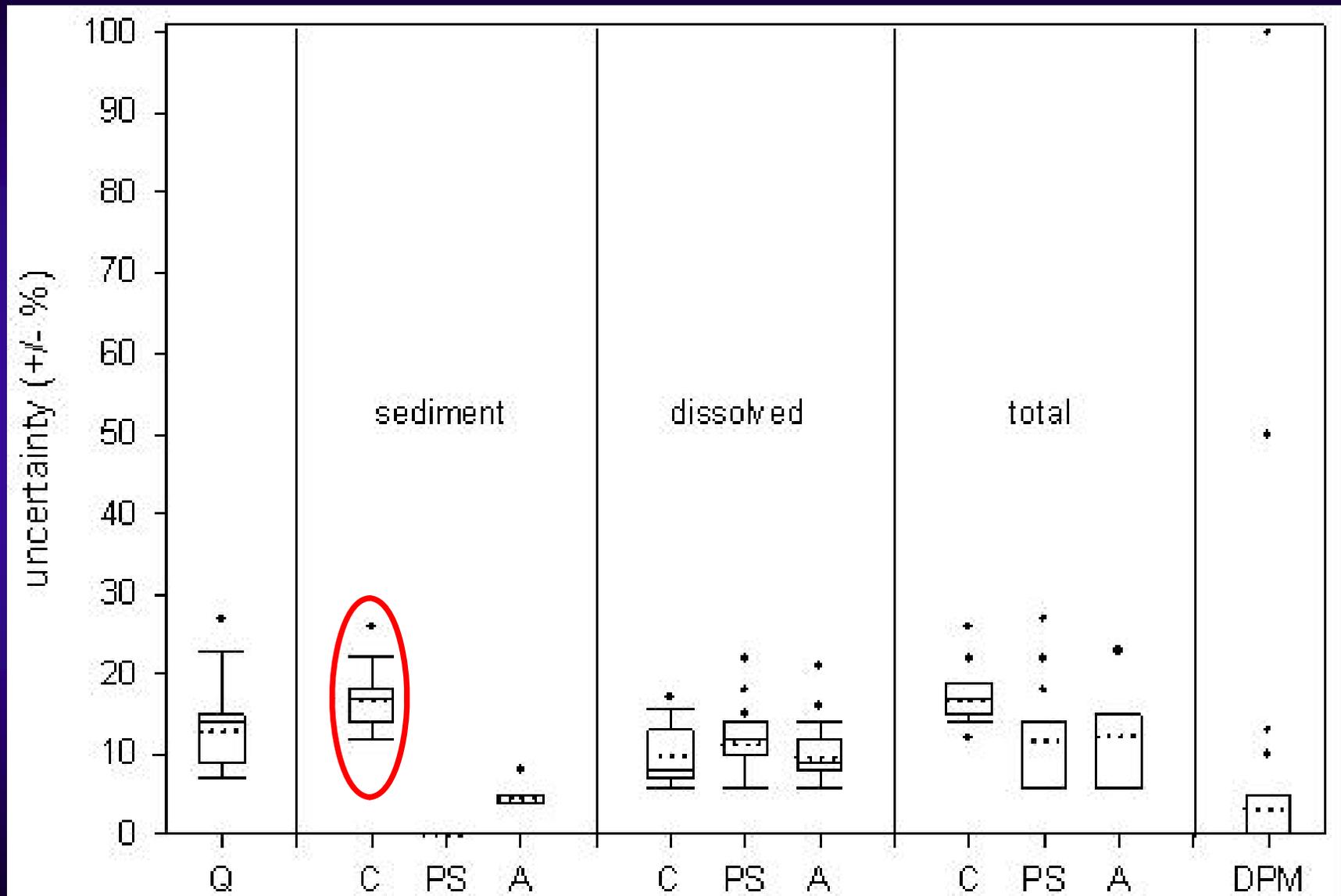
- Applied to real-world data sets from five monitoring projects
  - various hydrologic settings, land uses, watershed sizes, and field and laboratory techniques
- Estimated uncertainty in measured Q, TSS,  $\text{NO}_3\text{-N}$ ,  $\text{PO}_4\text{-P}$ , total N, and total P data
  - 131 storm events



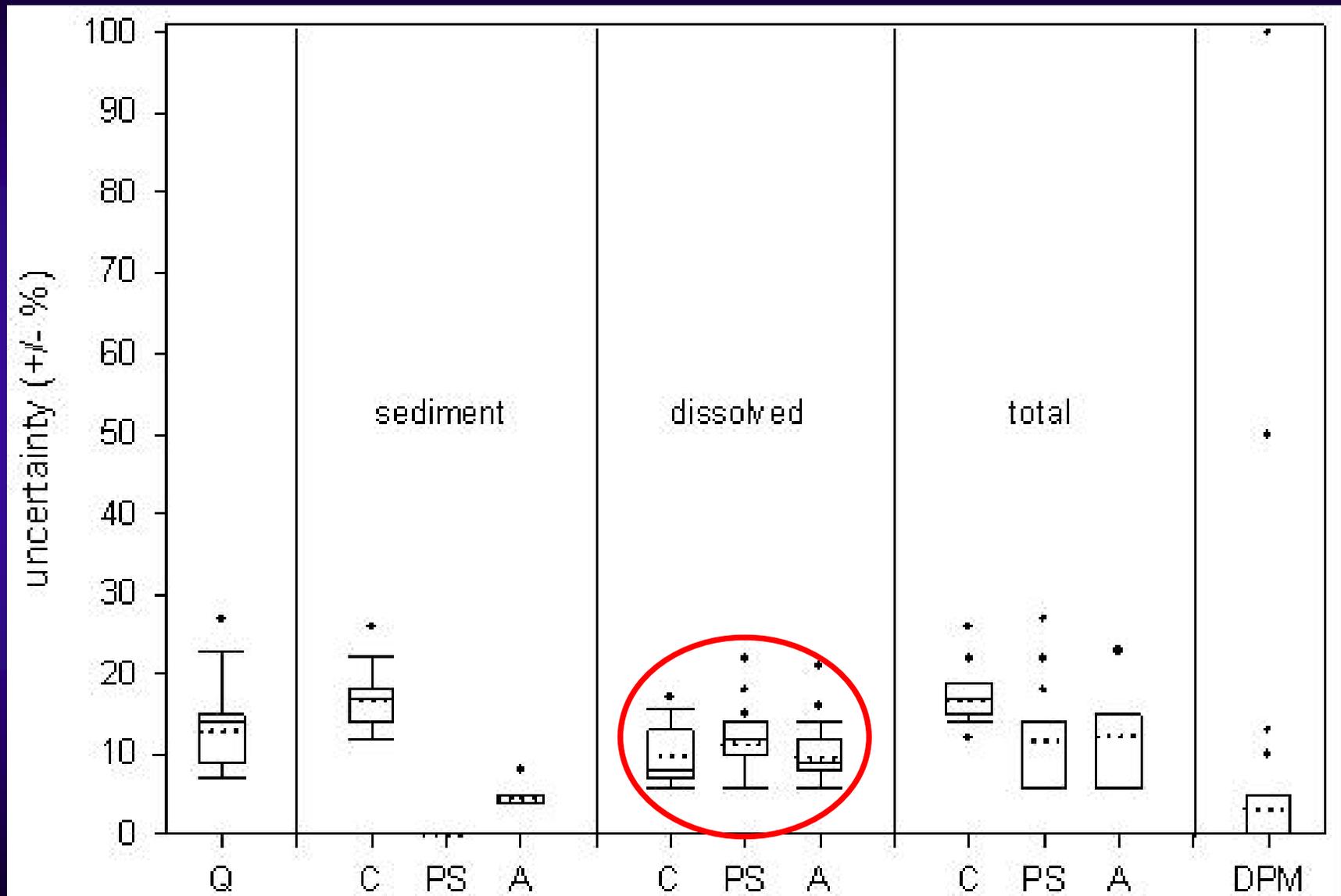
# DUET- H/WQ Application Results



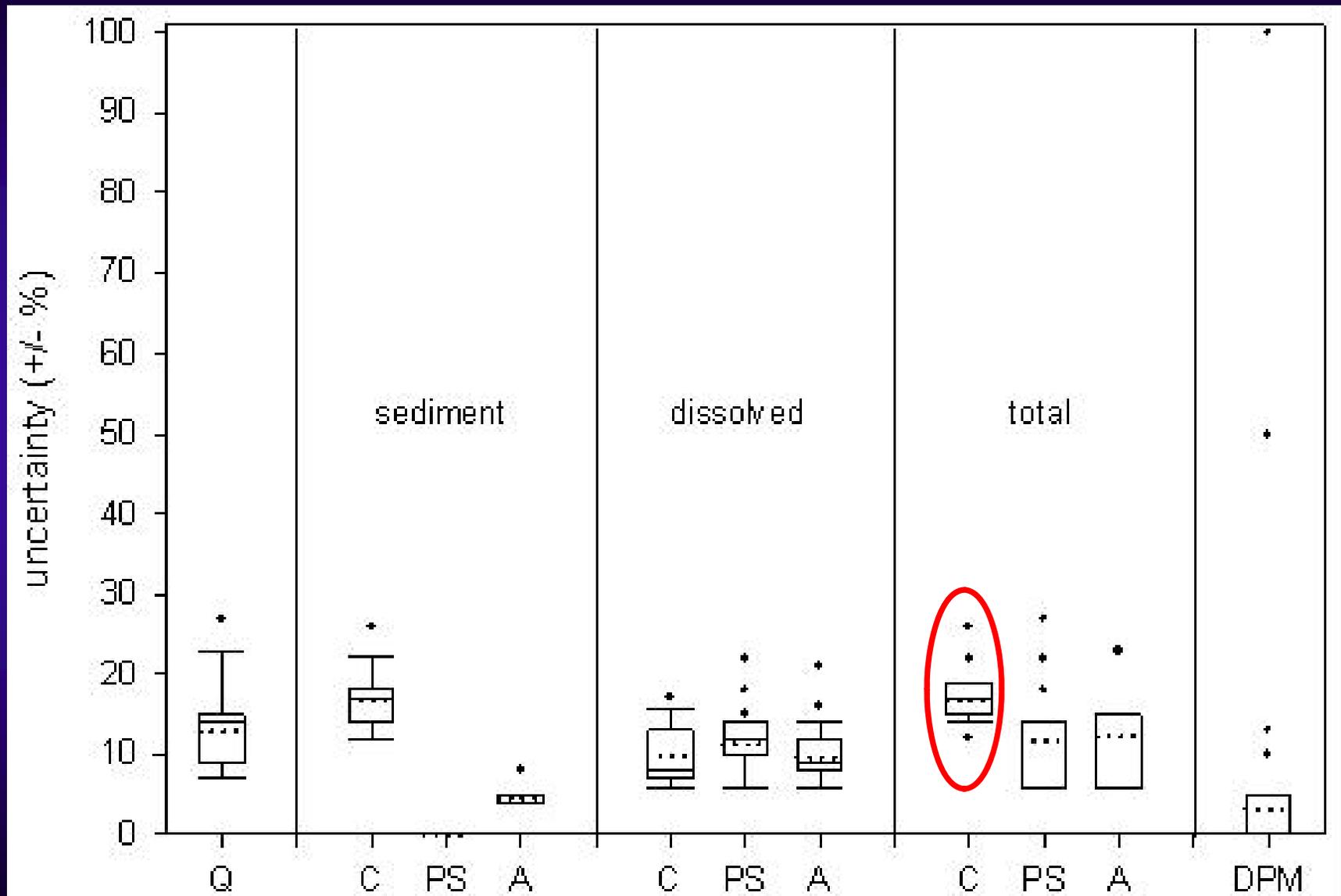
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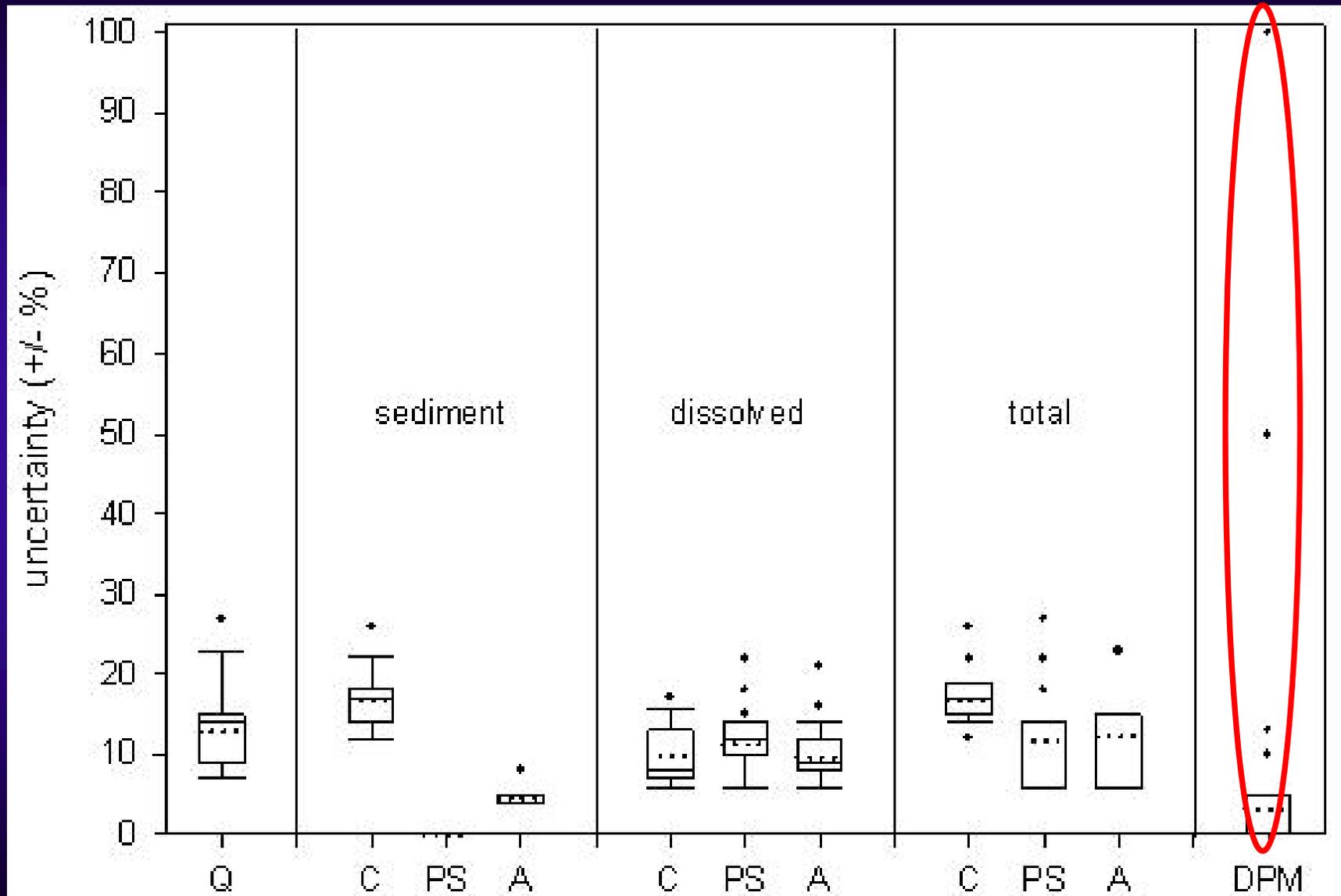
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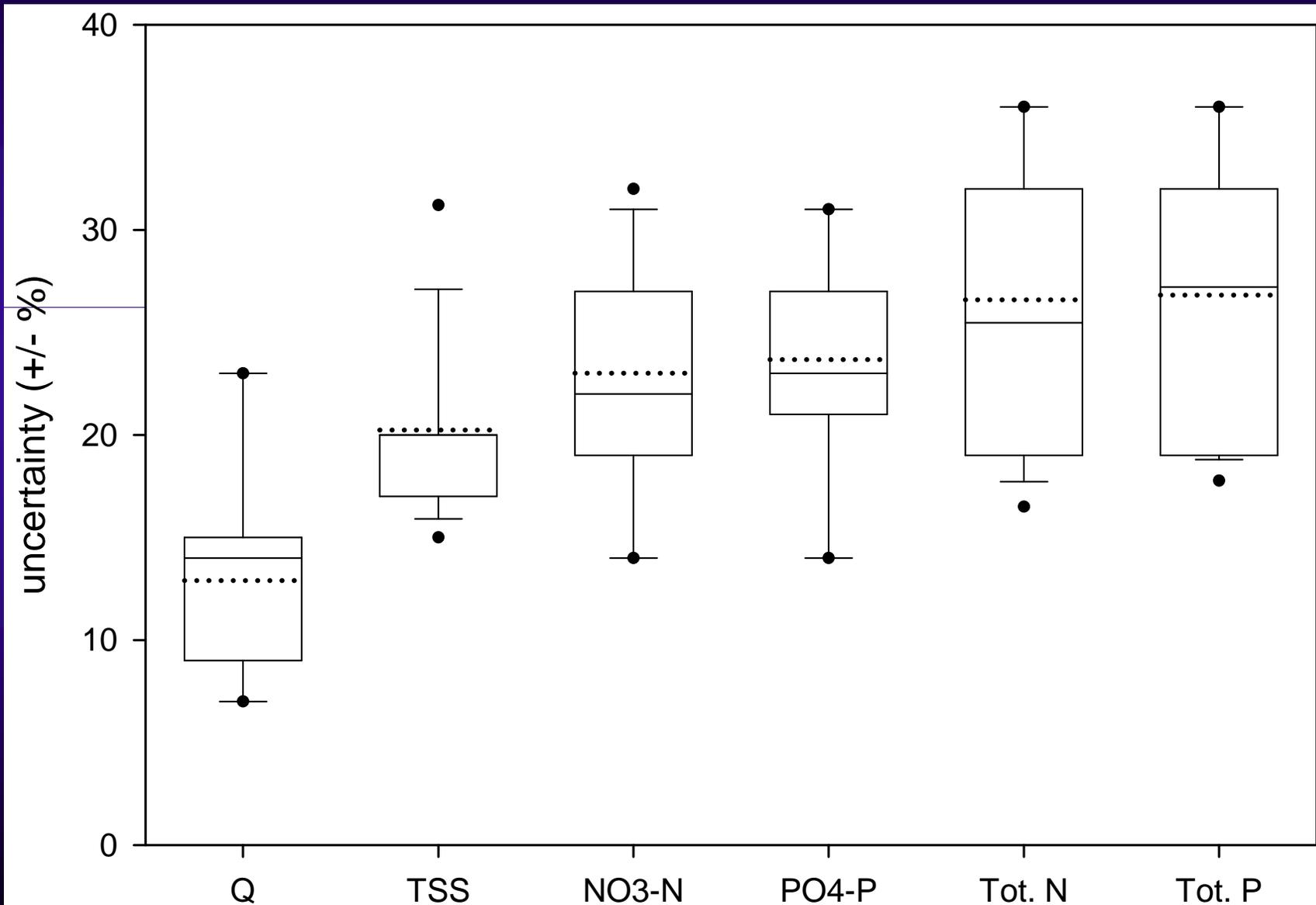
# DUET- H/WQ Application Results



# DUET- H/WQ Application Results



# DUET- H/WQ Application Results



# Closing Thoughts on Data Uncertainty

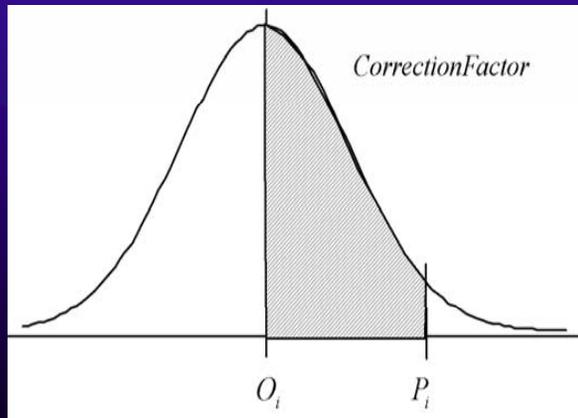
- Important for all H/WQ professionals to understand that...
  - measured streamflow and water quality data are uncertain
  - uncertainty increases dramatically without dedicated QA/QC
  - collection of high quality data requires considerable time, expense, personnel commitment
- Estimating uncertainty associated with measured data enhances both H/WQ monitoring and modeling
  - monitoring design
  - decision-making
  - scientific integrity
  - model calibration and validation



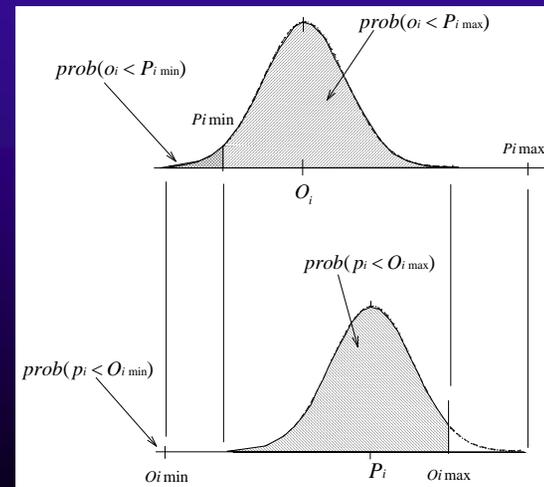
# Relevance to Model Application

- Measurement (data) uncertainty **does** impact H/WQ modeling
  - Typically, modelers imply that calibration and validation data are not uncertain ( $\pm 0\%$ ) by trying to reproduce measured values
  - A more appropriate approach attempts to simulate values within the uncertainty range of measured data

$$e_i = \frac{CF_i}{0.5} \times (O_i - P_i)$$



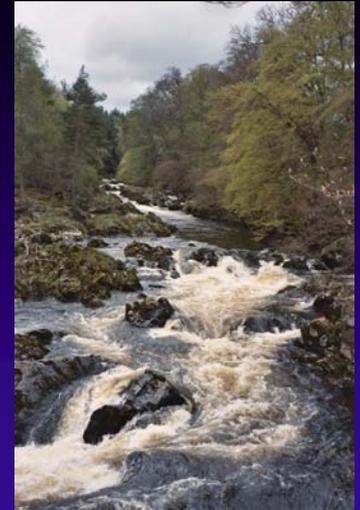
$$e(\text{meas} + \text{pred})_i = CF(\text{meas} + \text{pred})_i \times (O_i - P_i)$$



## Any Questions??

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### REFERENCES:

- Harmel, R.D., R.J. Cooper, R.M. Slade, R.L. Haney, and J.G. Arnold. 2006. Cumulative uncertainty in measured streamflow and water quality data for small watersheds. *Trans. ASABE* 49(3): 689-701.
- Harmel, R.D., D.R. Smith, K.W. King, and R.M. Slade. 2009. Estimating storm discharge and water quality data uncertainty: A software tool for monitoring and modeling applications. *Environ. Modelling Software* 24: 832-842.
- Harmel, R.D. and P.K. Smith. 2007. Consideration of measurement uncertainty in the evaluation of goodness-of-fit in hydrologic and water quality modeling. *J. Hydrol.* 337:326-336.
- Harmel, R.D., P.K. Smith, and K.L. Migliaccio. 2010. Modifying goodness-of-fit indicators to incorporate both measurement and model uncertainty in model calibration and validation. *Trans. ASABE* 53(1):53-63.