### **A Tool for Identification of Model Structure**

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## **Watershed Models**

# Hydrologic/water quality modeling to support decision making:

- Flood management
- Nonpoint source pollution
- Impacts of land use change/urbanization

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**Evolution of watershed models:** 

- Lumped to distributed
  - Remotely sensed data and GIS
- Finer spatiotemporal resolutions
- Empirical to physically-based
- Incorporation of more input and output variables
- Improving model performance

### **Model Structure**

# Tradeoffs between complexity, performance and identifiability:



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Fate and transport of ammonia nitrogen in Cedar Creek



## **In-Stream N Processes in SWAT**

#### **Optional in-stream component (QUAL2E):**

- It is left to the user to be activated
- It is not activated by default

#### **Comparison of two models**

- Model 1: in-stream processes were not activated
- Model 2: in-stream processes were activated

## **In-Stream N Processes in SWAT**

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#### **Sampling-based approach:**

- Structural complexity:
  - Number of input parameters and operations: *Petersen Matrix*
  - Linearity: Multivariate linear regression analysis
  - Multivariate interactions: *Tree-Structured Density Estimation*
- Performance:
  - Goodness-of-fit measures (e.g., Nash-Sutcliffe Coefficient)
  - Genetic algorithm optimization engine
- Identifiability:
  - Single parameters
  - Overall identifiability

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## **The Case Study**

**Performance:** 



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#### **Identifiability:**

#### Single parameters:

Regional Sensitivity

Analysis



**Identifiability:** Single parameters: *Regional Sensitivity Analysis* 



#### **Identifiability:**

- Overall model structure:

Tree-structured density estimation

Identifiability Criterion  $IC = \frac{m_T}{m} \times \frac{1}{V_T}$ 



### **The Case Study**

#### **The Tradeoff Plot:**



# **Closing Remarks**

#### Utility of the tool

- Testing new improvements in model structure
- Testing new spatiotemporal discretization schemes

#### Advantages

- Provides a unified framework for future model enhancements
- Facilitates communication between different research groups working on different aspects of the model
- Can potentially guide integration of models that operate at different spatial/temporal scales

Acknowledgments

# **Questions?**

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