

# ArcGIS-Based Nitrate Load Estimation Toolkit ([ArcNLET](#)) for Estimation of **Nitrogen Load** from **Septic Systems** to Surface Water Bodies: Models, Softwares, Applications, and Perspectives

Ming Ye ([mye@fsu.edu](mailto:mye@fsu.edu))

Department of Scientific Computing  
Florida State University

Indian River Lagoon BMAPs Nutrient Reduction Projects Meeting  
5/13/2014

# Outlines

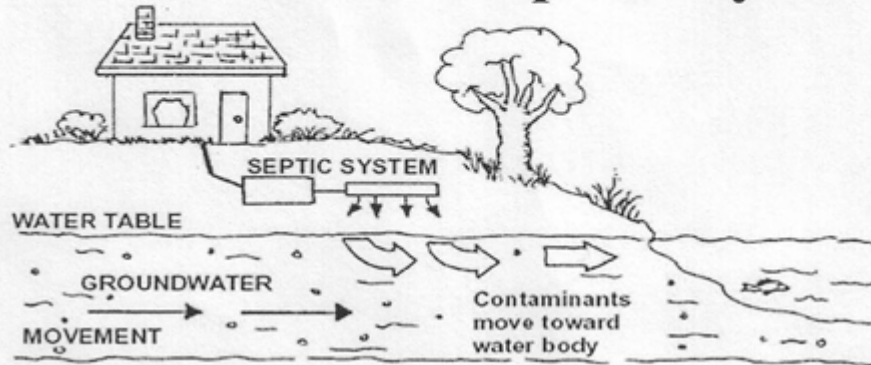
- Introduction of ArcNLET
  - Rational of developing ArcNLET
  - Functions of ArcNLET and associated software
  - Data requirements of using ArcNLET
- ArcNLET modeling for the City of Port St. Lucie, the City of Stuart, and Martin County
- On-going ArcNLET modeling for IRC
- Suggestions and comments

# ArcNLET Project Team

- **Contract Manager:**
  - Rick Hicks (FDEP) (Richard.W.Hicks@dep.state.fl.us)
- **Principal Investigators:**
  - Ming Ye (FSU) ([mye@fsu.edu](mailto:mye@fsu.edu))
  - Paul Lee (FDEP) (retired in 2012)
- **Graduate Students:**
  - Raoul Fernandes (Graduated in 2011)
  - Fernando Rios (Graduated in 2010)
- **Post-docs:**
  - Yan Zhu (2014-present)
  - Huaiwei Sun (2012-2013)
  - Liying Wang (2010-2012)

# Septic Systems and Nitrogen Loads

## The Septic Tank Home Wastewater Treatment and Disposal System



- Septic systems contribute approximated 8.3 million pounds to the Bay, about **5%** of the total nitrogen load (USEPA, 2013).
- While this is not the largest source of nitrogen pollution to the Bay, it is important to reduce the load from septic systems in the effort to improve water quality.
- Given the trends in population growth, nitrogen loads from septic systems are **expected to increase**.
- Sustainable decision-making and management of nitrogen pollution due to septic systems are urgently needed.

## A Model Program for Onsite Management in the Chesapeake Bay Watershed

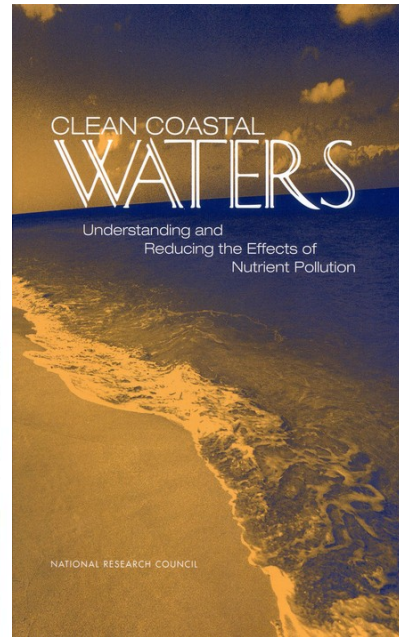
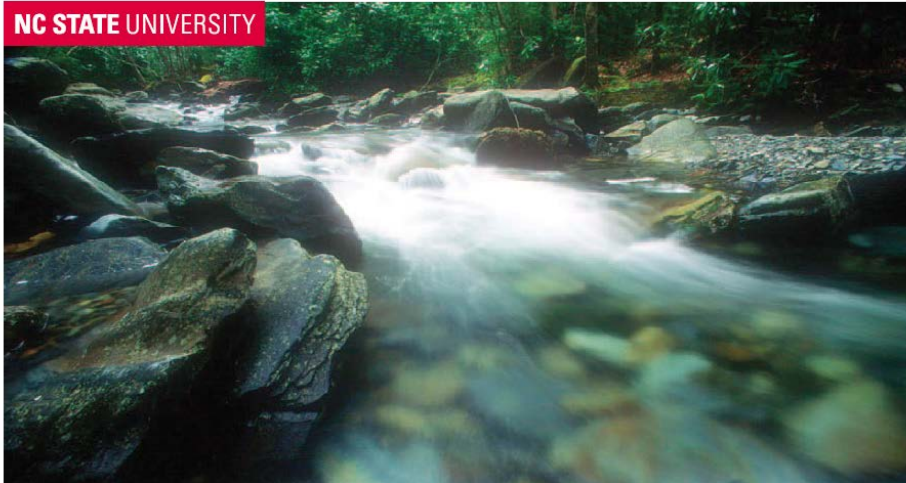
June 2013

Prepared by:  
U.S. Environmental Protection Agency  
Office of Wastewater Management



## Potential Nitrogen Contributions from On-site Wastewater Treatment Systems to North Carolina's River Basins and Sub-basins

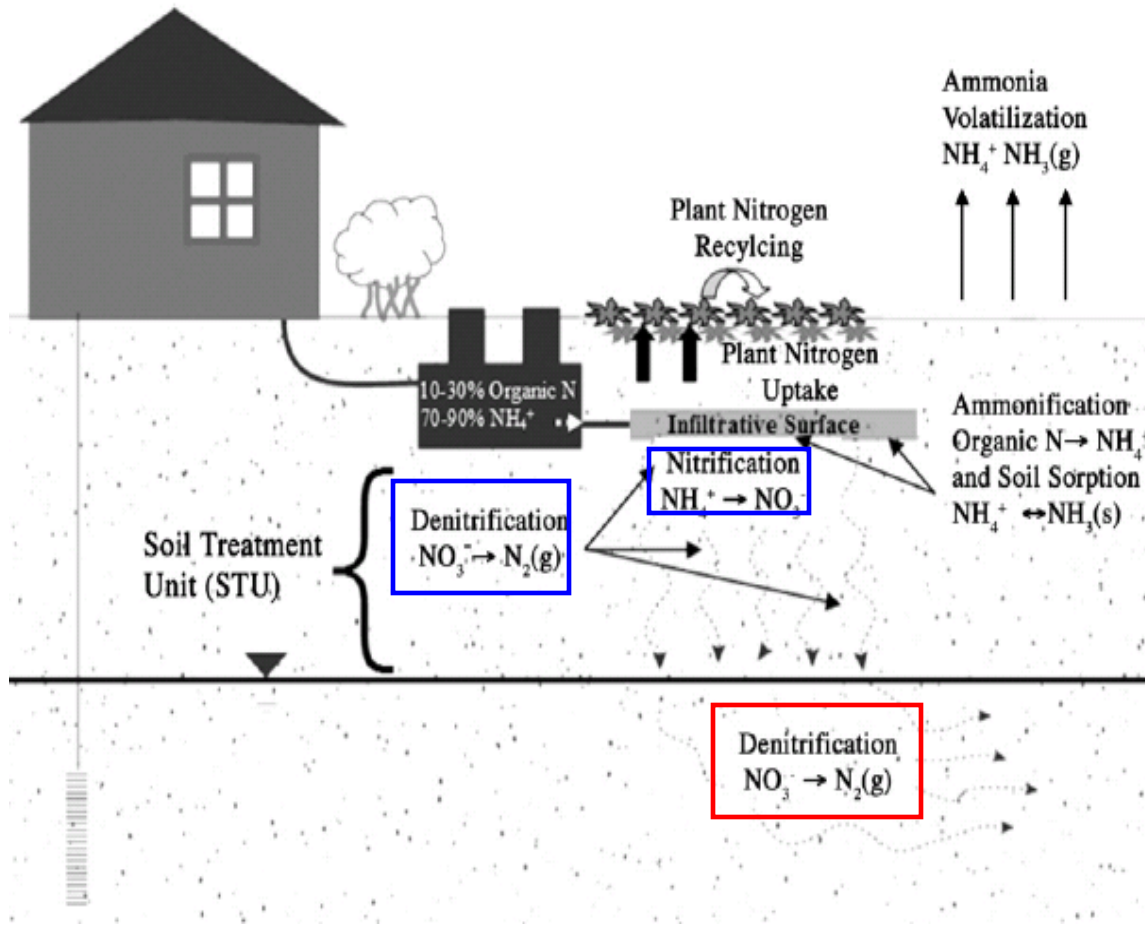
*North Carolina Agricultural Research Service (2007)*



**Recommendation:**  
Improve models so  
they are more useful  
to coastal managers  
(National Research  
Council, 2000).

- “**Little is known**, however, about the extent of nitrogen (N) loadings to soils from on-site wastewater treatment systems in North Carolina.”
- “As a result, **existing models and nutrient management plans** for the state’s watersheds, such as the Neuse River basin wide nutrient reduction plan developed by the N.C. Department of Environment and Natural Resources (N.C. DENR, 1997), have typically **ignored these potential inputs.**”

# Schematic of an Onsite Sewage Treatment and Disposal System and Subsurface Nitrogen Transformation and Removal Processes



**Soil Processes:** Simulated using **VZMOD**

- Unsaturated flow
- Solute transport
- Nitrification and denitrification

**Groundwater Process:** Simulated using **ArcNLET**

- Groundwater flow
- Solute transport
- Denitrification

**ArcNLET-MC:** Quantify uncertainty of ArcNLET simulations

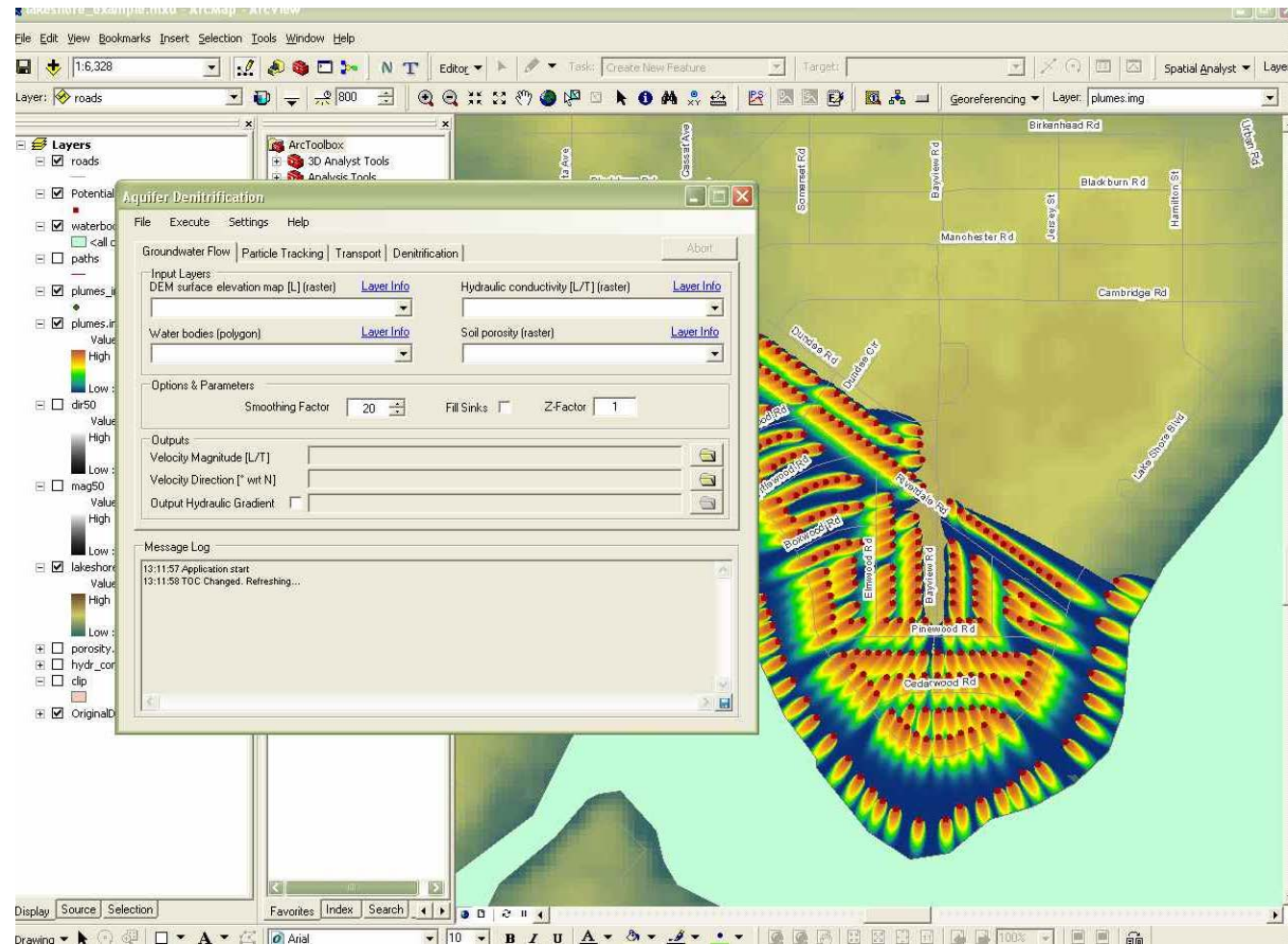
# Why Developing ArcNLET?

- There is no **suitable tool** for estimating nitrate load to meet TMDL requirements and perform nitrogen BMAPs. Existing tools are either too simple or too complex.
- Develop a **simplified model** that consider **key hydrogeologic processes** of groundwater flow and nitrate fate and transport.
- Implement the model by developing a **user-friendly ArcGIS extension** to
  - Simulate nitrate fate and transport including the denitrification process
  - Consider multiple septic tanks
  - Provide a management and planning tool for environmental management and regulation
- Disseminate the software and conduct **technical transfer** to FDEP staff and other interested parties.

# What is ArcNLET?

## ArcGIS-based Nitrate Load Estimation Toolkit

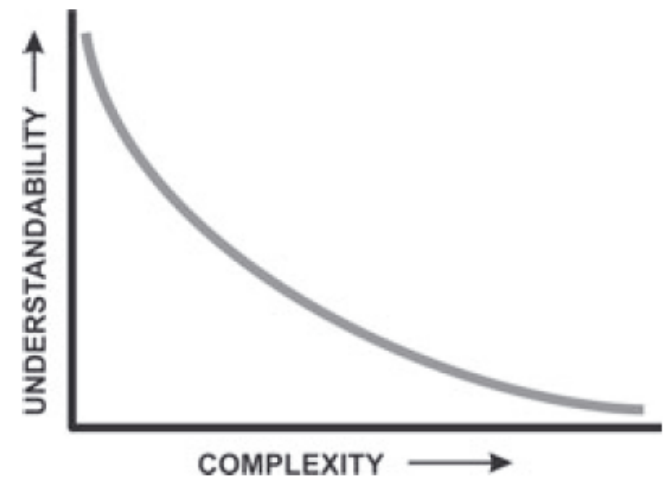
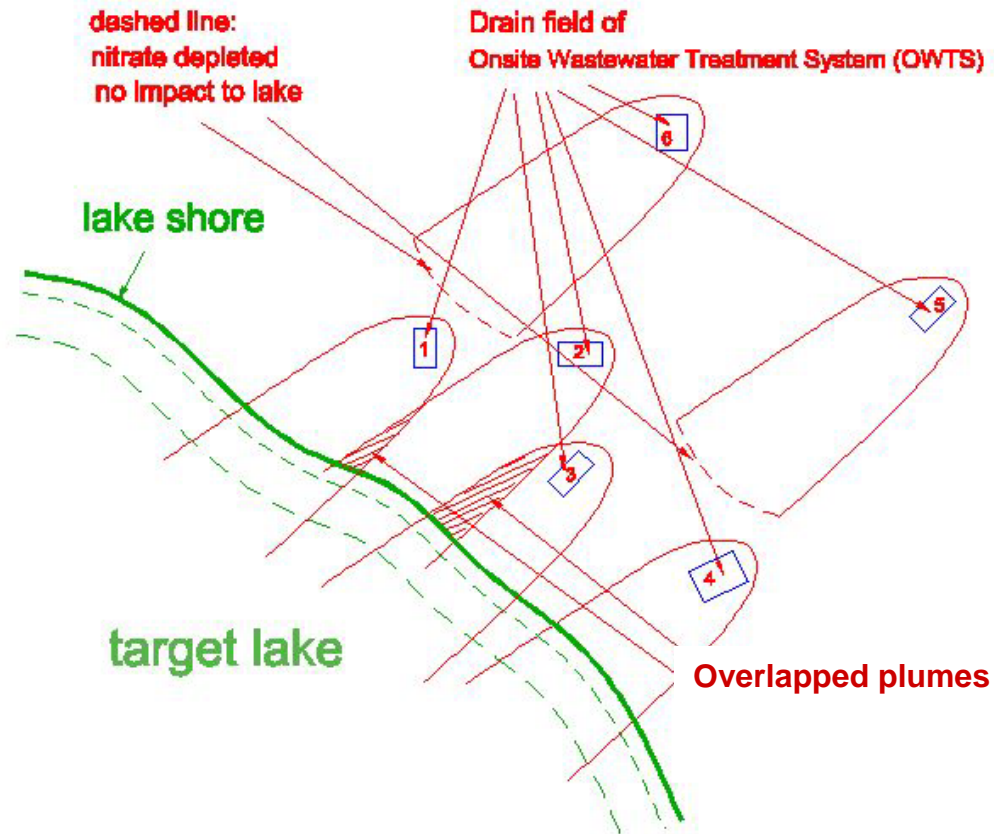
- A simplified conceptual model of groundwater flow and solute transport
- Implementation as an ArcGIS extension
- Calculation of nitrate plume and nitrate load



Compatible with ArcGIS 9.3, 10.0, and 10.1

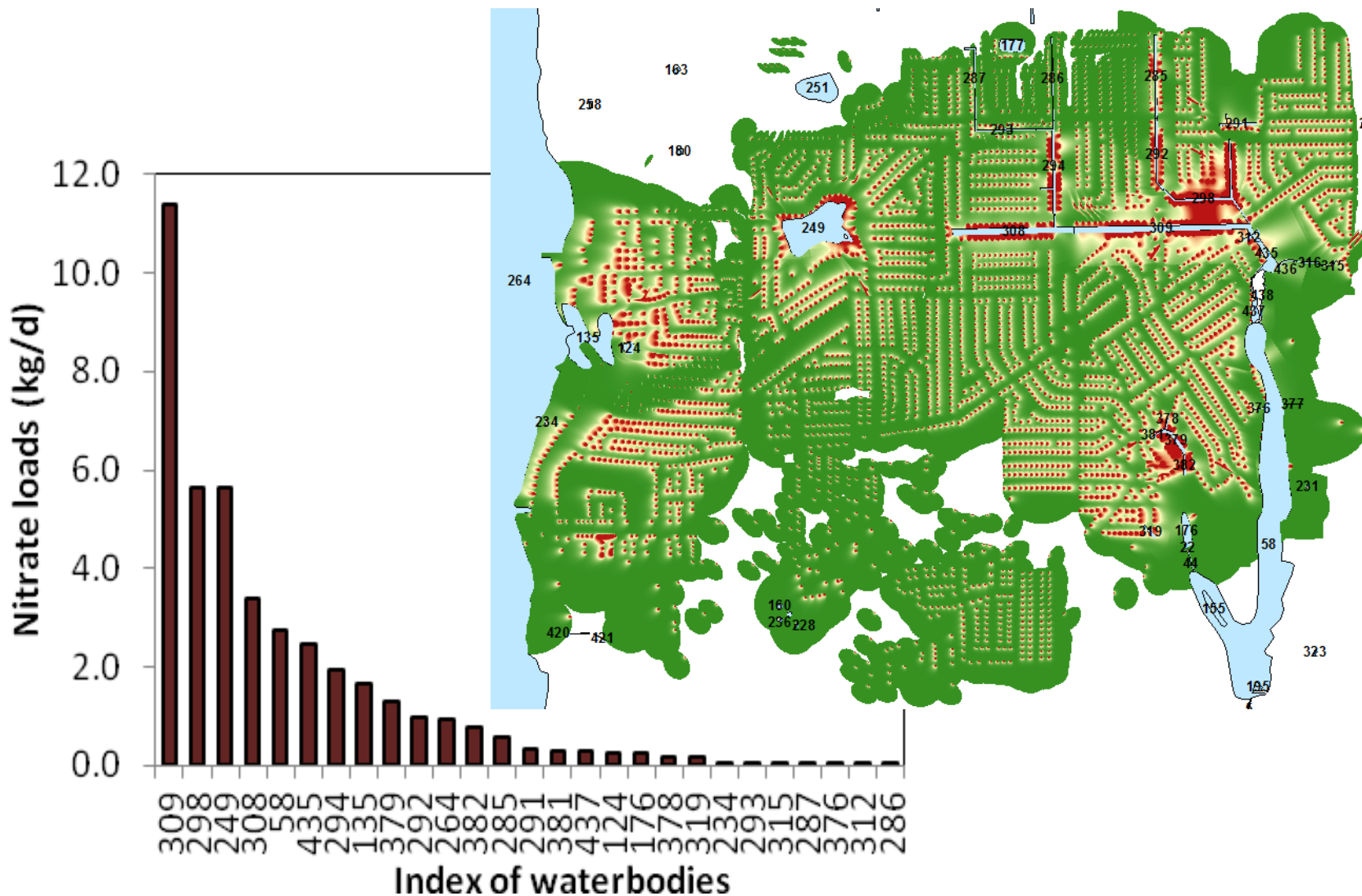


**Simplified Conceptual Model** to consider key hydrogeologic processes involved in nitrate transport:



- **Groundwater flow model** to estimate
  - flow path
  - flow velocity
  - travel time
- **Nitrate transport model** to consider
  - Advection
  - Dispersion
  - Denitrification
- **Load estimation model** to estimate nitrate load<sup>9</sup>

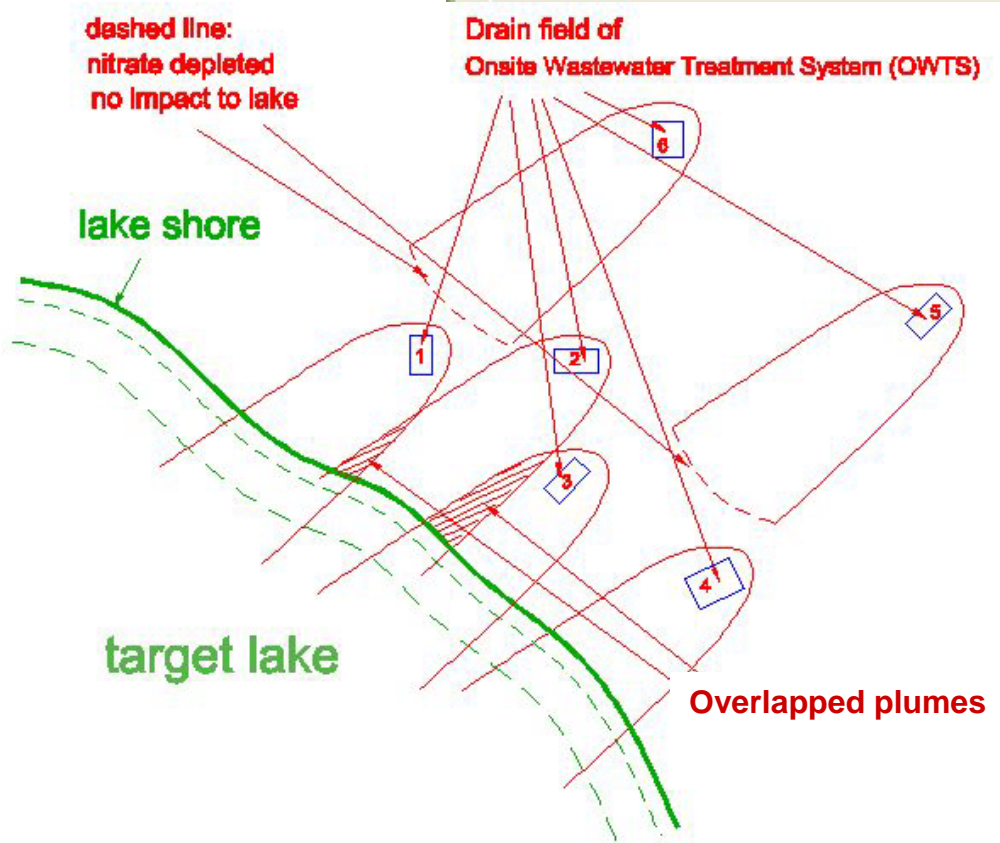
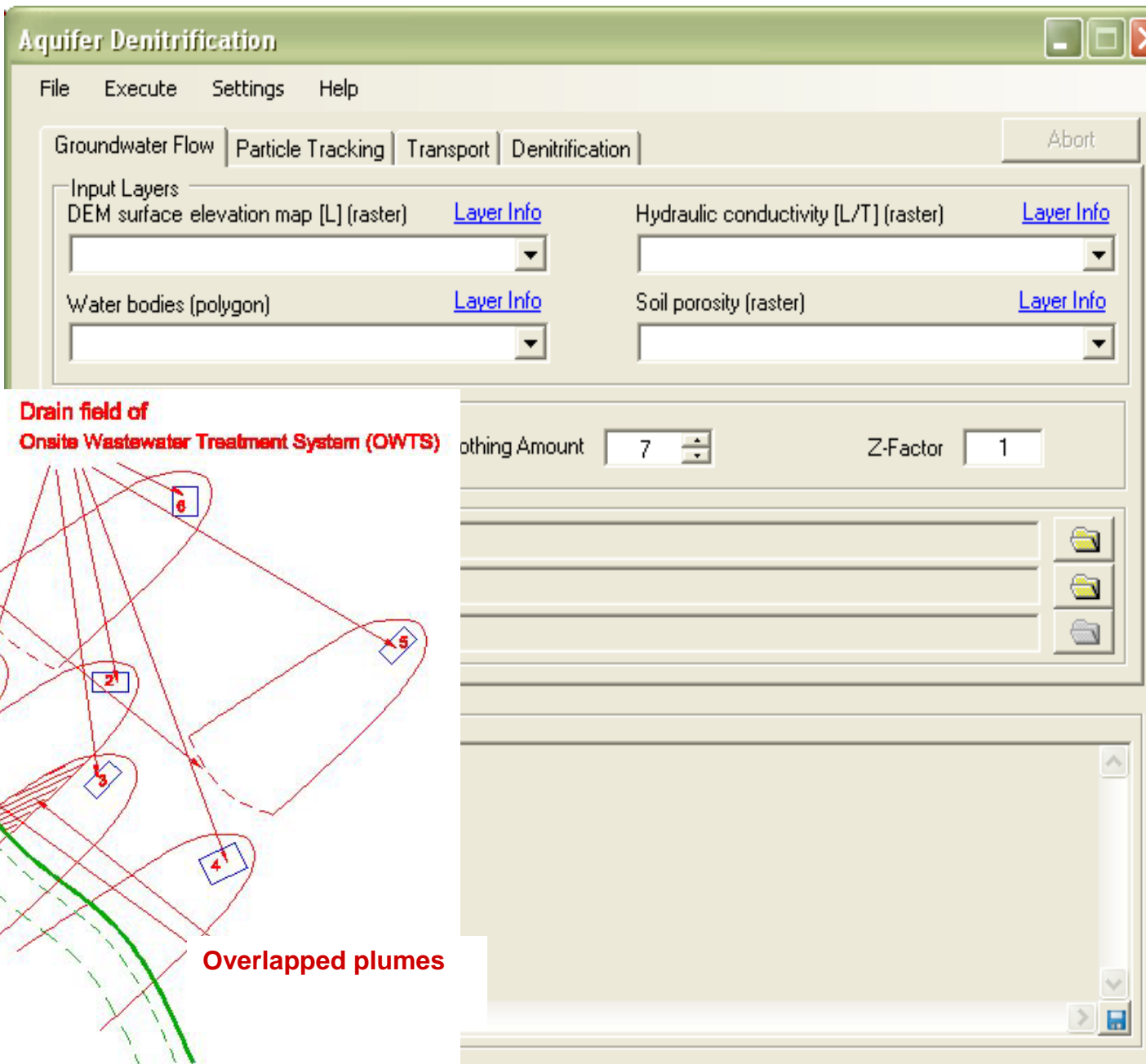
# Illustration of simulated nitrate plumes and nitrate load



# Software Download and References

- **ArcNLET**: <http://people.sc.fsu.edu/~mye/ArcNLET>
- **VZMOD**: <http://people.sc.fsu.edu/~mye/VZMOD>
- **Peer-reviewed publications:**
  - Ye, M., J.F. Rios, and L. Shi (2014), A new ArcGIS-based software of uncertainty analysis for nitrate load estimation, *Ground Water*, **Software Spotlight**, Accepted.
  - Rios, J.F. (*student*), M. Ye, L. Wang, P.Z. Lee, H. Davis, and R.W. Hicks (2013), ArcNLET: A GIS-based software to simulate groundwater nitrate load from septic systems to surface water bodies, *Computers and Geosciences*, 52, 108-116, 10.1016/j.cageo.2012.10.003.
  - Wang, L. (*post-doc*), M. Ye, J.F. Rios, R. Fernandes, P.Z. Lee, and R.W. Hicks (2013), Estimation of nitrate load from septic systems to surface water bodies using an ArcGIS-based software, *Environmental Earth Sciences*, DOI 10.1007/s12665-013-2283-5.
  - Wang, L. (*post-doc*), M. Ye, P.Z. Lee, and R.W. Hicks (2013), Support of sustainable management of nitrogen contamination due to septic systems using numerical modeling methods, *Environment Systems and Decisions*, 33, 237-250, doi:10.1007/s10669-013-9445-6.

# ArcNLET Functions: Graphic User Interface



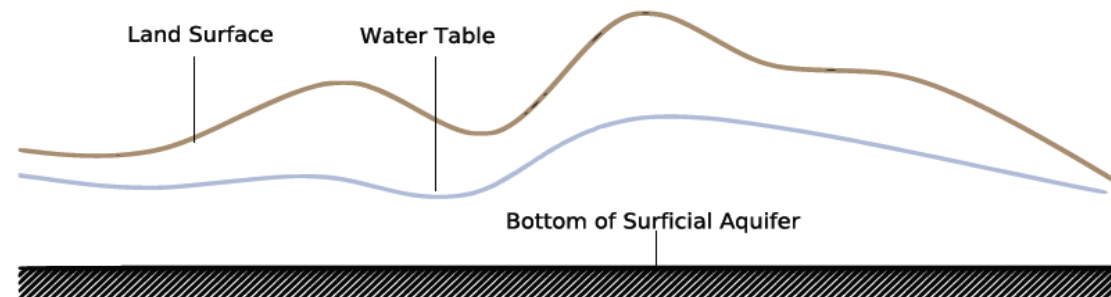
# Simplifications and Limitations in Groundwater Flow Modeling

## Simplifications:

- Treat water table as subdued replica of topography (Process topographic to approximate shape of water table)
- Use Dupuit assumption to simulate 2-D, horizontal groundwater flow

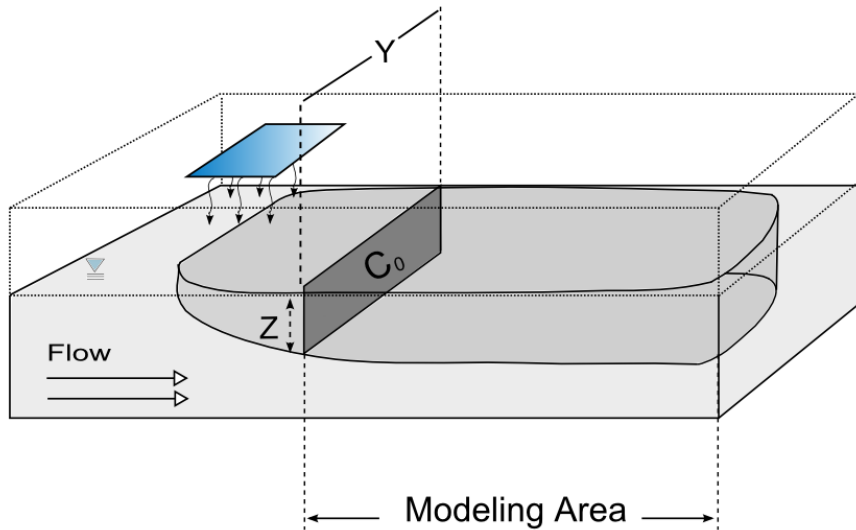
## Limitations:

- Steady-state flow
- 2-D flow instead of fully 3-D flow

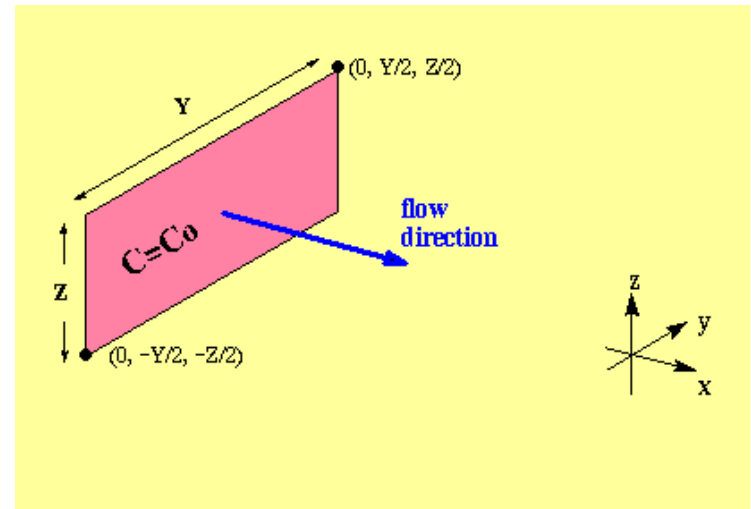


# Simplifications and Limitations in Nitrate Transport Modeling

EPA BIOCHLOR model



Domenico analytical solution



$$\frac{\partial C}{\partial t} = \alpha_{\ell} v \frac{\partial^2 C}{\partial x^2} + \alpha_{T_h} v \frac{\partial^2 C}{\partial y^2} + \alpha_{T_v} v \frac{\partial^2 C}{\partial z^2} - v \frac{\partial C}{\partial x} - kC$$

Dispersion

Advection Decay

Denitrification

$$C(x, y, z, t) = \frac{C_0}{8} F_1(x, t) F_2(y, x) F_3(z, x)$$

# Simplifications and Limitations in Nitrate Transport Modeling

- **Simplifications:**

- Analytical solution of transport model with uniform flow
- Linear kinetic reaction for denitrification process

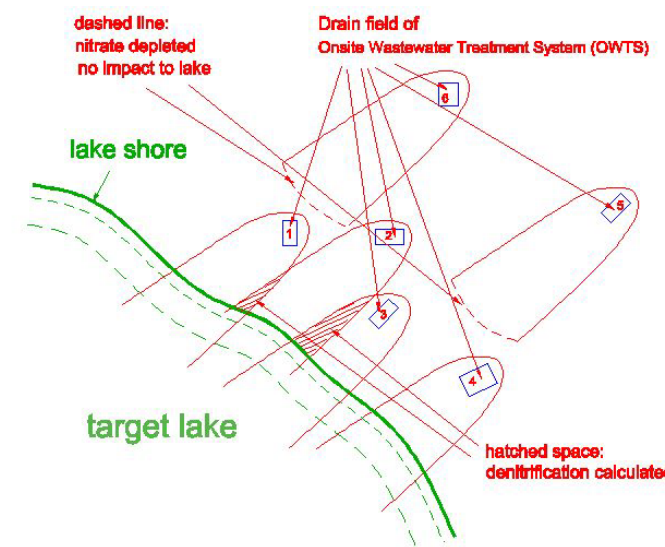
- **Limitations:**

- Only consider nitrate (a new module is being developed to simulate ammonium)
- Pseudo-3D model
- Steady state model
- Use of empirical or calibrated value of decay coefficient

# Input Data of ArcNLET

All input data files are in ArcGIS format.

- Locations of **septic tanks**
- Locations of **water bodies**
- **Topography** (DEM: Digital Elevation Model):  
Process it to obtain water table
- **Hydrogeological and transport** parameters
  - Smoothing factor (used to process topography)
  - Hydraulic conductivity (from SSURGO)
  - Porosity (from SSURGO)
  - Dispersivity
  - Decay coefficient of denitrification
  - Source load and concentration





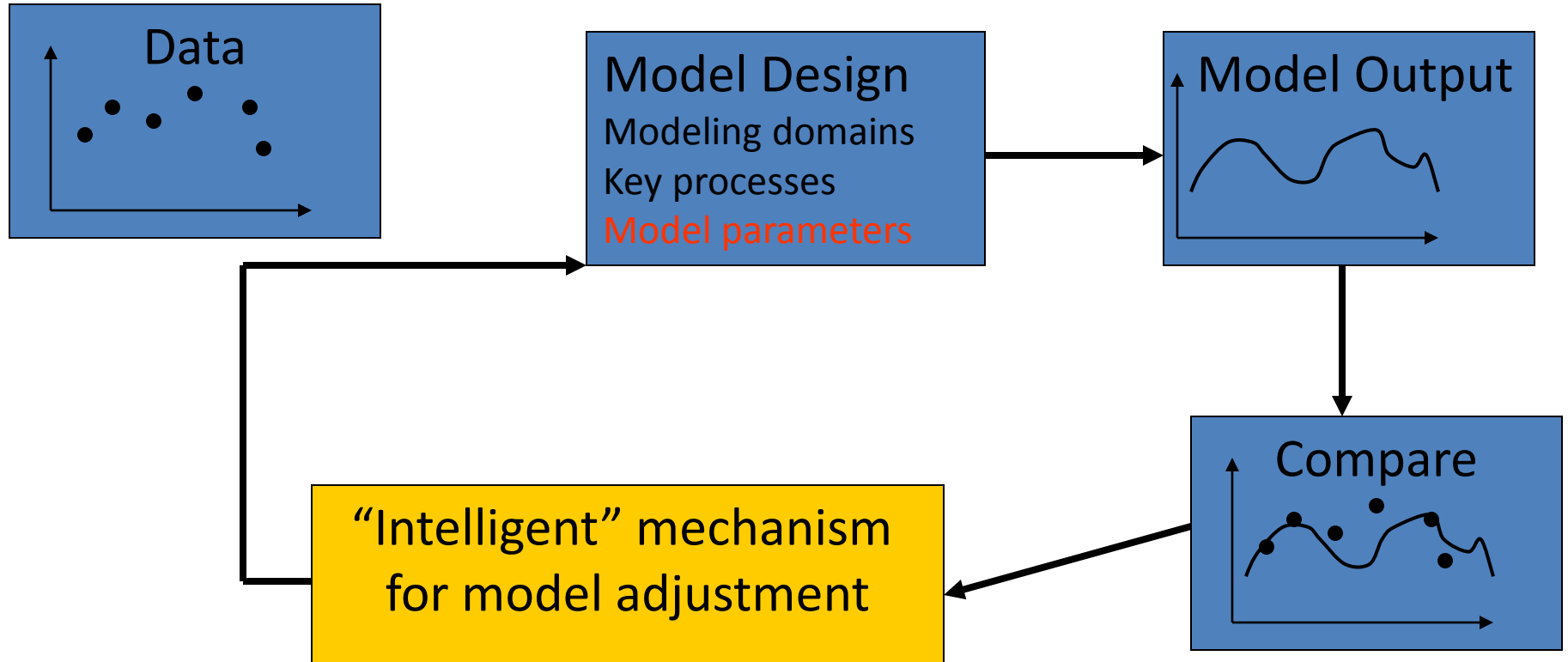
# Requirements on Potential Users

- The **GUI make it easier** for some with little experience in analyzing groundwater transport problems to apply a solute-transport model to a field problem.
- **Users of ArcNLET need to have**
  - **Basic knowledge of hydrogeology** such as concepts of groundwater flow and solute transport
  - **Intermediate level of ArcGIS skills** for preparing input files and visualizing software output files
- A model (simple or complex) is **not an end in itself**, but a tool to organize one's thinking and engineering judgment.
- **Interpretation and improvement of ArcNLET results require**
  - **Fundamental understanding** of groundwater flow and solute transport
  - **Familiarity with site-specific information** such as geology and hydrogeology
- It may be useful to **test and tune the model** for several representative sites to find representative parameter values and use them for prediction.

# Model Calibration

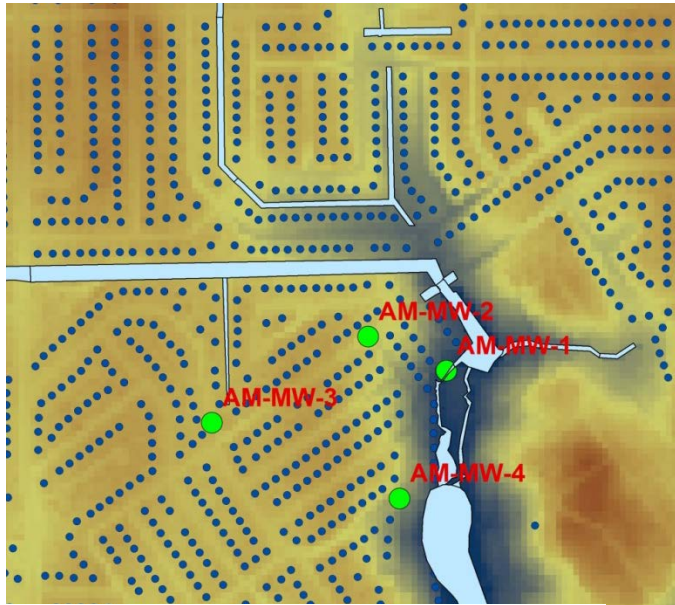
- The ArcNLET model requires several model **parameters** that are largely **unknown**, which is common in groundwater modeling.
- The parameter values may be obtained from literature review, but the values are **not site-specific**.
- A better way to determine site-specific parameter values is **model calibration** to adjust the parameter values to match model simulations to **site observations** of system state variables such as hydraulic head and nitrate concentration.

# Manual Model Calibration: Trial and Error

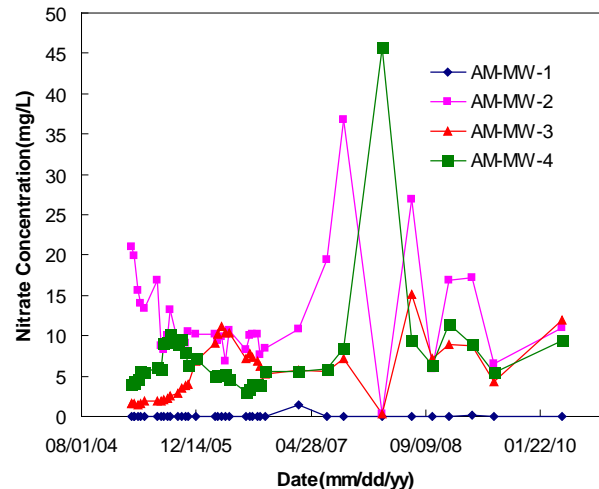
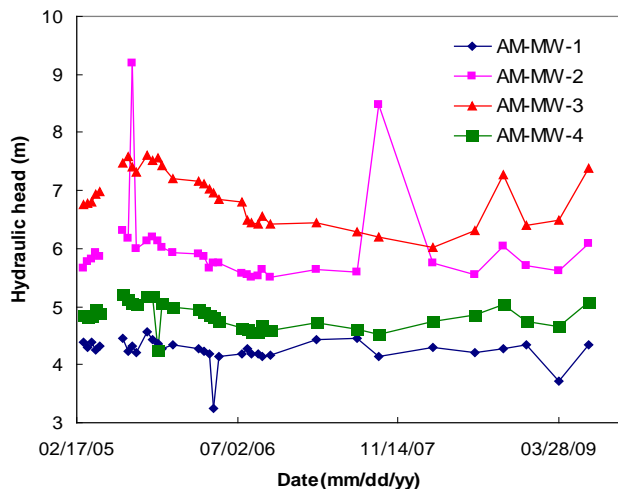


# Example Model Calibration

Eggleston Heights with 3,500 OSTDS

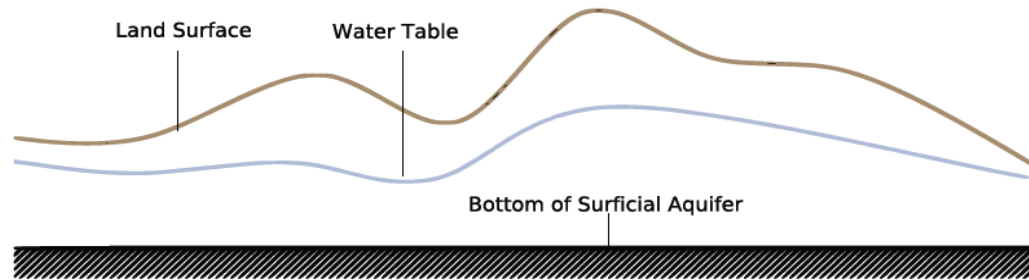


- Two neighborhoods in the City of Jacksonville:
  - Eggleston Height
  - Julington Creek
- Relatively large amount of observations of hydraulic head and nitrate concentrations are available.

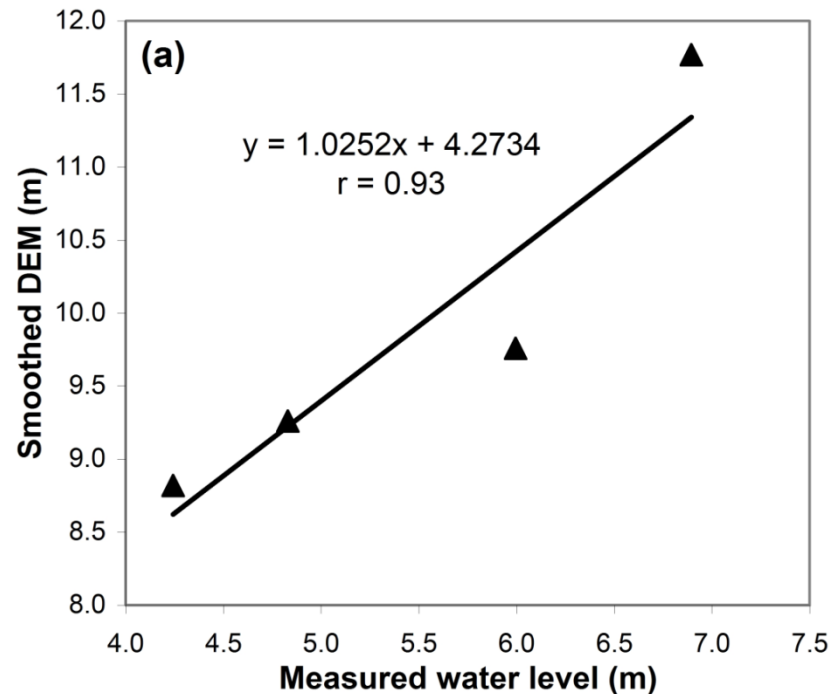
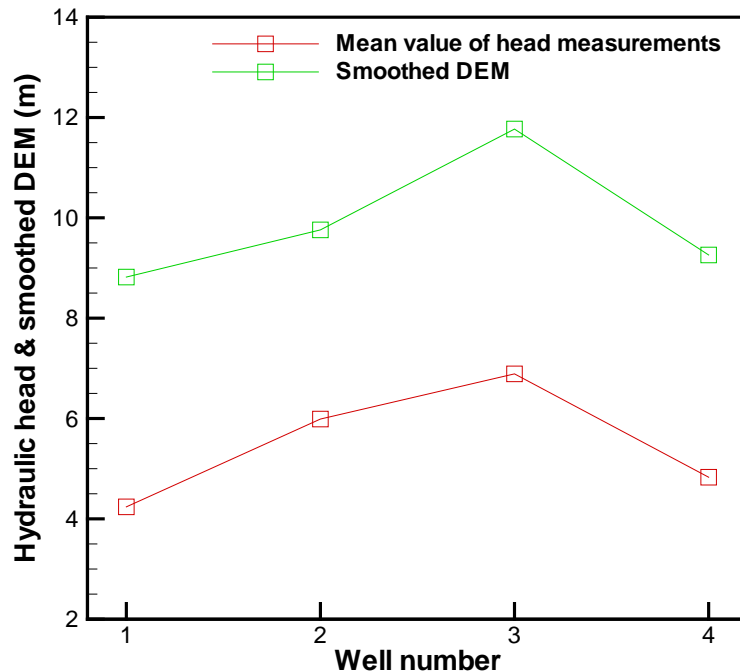


**Average values** are used as the **calibration targets**.

# Model Calibration Results: Heads

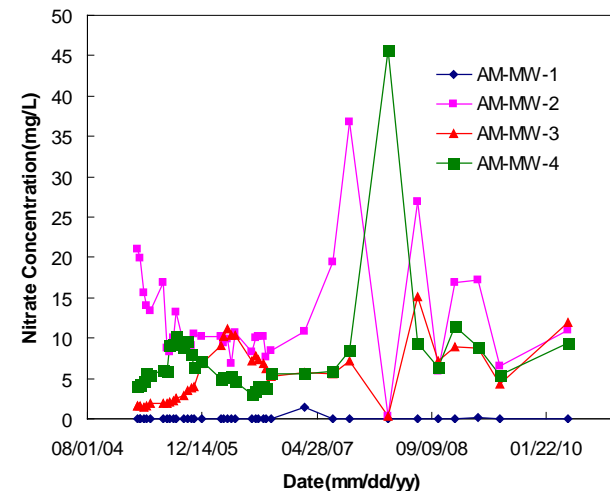
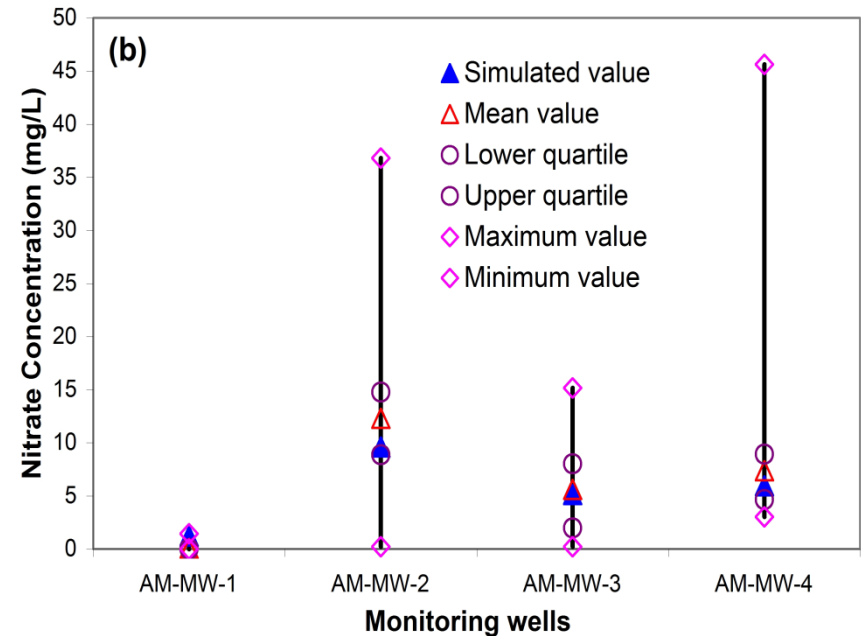


The smoothed DEM agrees well with the mean observed hydraulic head, because the **correlation coefficient** (0.93) and the **slope of linear regression** (1.03) are close to one.



# Model Calibration Results: Nitrate Concentrations

- The simulated nitrate concentrations are **close to the mean** observations.
- Because of the **large variability** of concentration observations, it happens often that simulated nitrate concentrations deviate from mean observations.
- We consider that the calibration is reasonable if the simulations fall within the **inter-quartile** of the observed concentrations, which covers 50% of the data.



# Challenges: **Uncertainty** in Input Parameters and Load Estimates

Poetry of Donald H. Rumsfeld:  
*Feb. 12, 2002*  
*Department of Defense news briefing*

## **The Unknown**

As we know,  
There are *known knowns*.  
There are things we know we know.  
We also know  
There are **known unknowns**.  
That is to say  
We know there are some things  
We do not know.  
But there are also *unknown unknowns*,  
The ones we don't know  
We don't know.



The calibrated parameters are **just one possible combination**, and there may be other parameter combinations that give similar model fit but different load estimates.

# An Illustrative Example

## Parameter ranges:

Hydraulic conductivity ( $K$ ): 0.0864 ~ 30.4992 m/d

Longitudinal dispersivity ( $\alpha_L$ ): 0.21 ~ 21.34 m

Horizontal transverse dispersivity ( $\alpha_T$ ): 0.021 ~ 2.134 m

First-order decay coefficient ( $k$ ): 0.004 ~ 2.27 /d

Parameter set 1

Load=0.15 lb/day

$\alpha_L=2.113\text{m}$ ,  $\alpha_T=0.234\text{m}$

$k=0.008/\text{d}$

Parameter set 2

Load=0.25 lb/day

$\alpha_L=2.113\text{m}$ ,  $\alpha_T=0.234\text{m}$

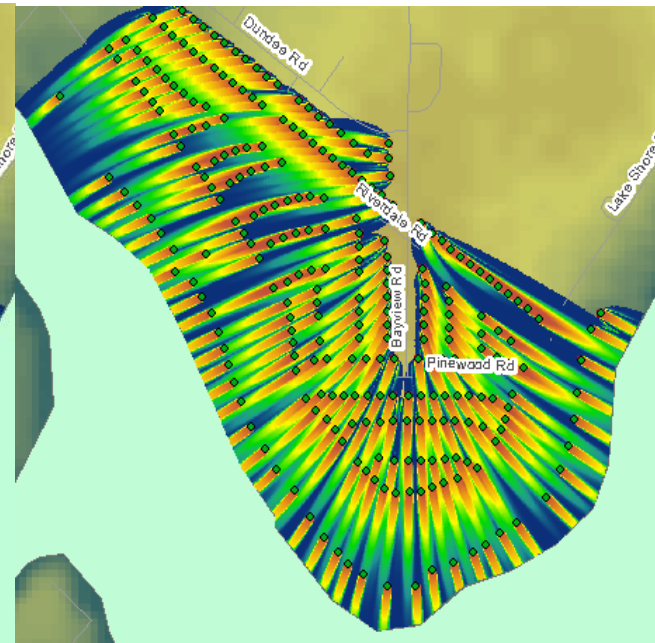
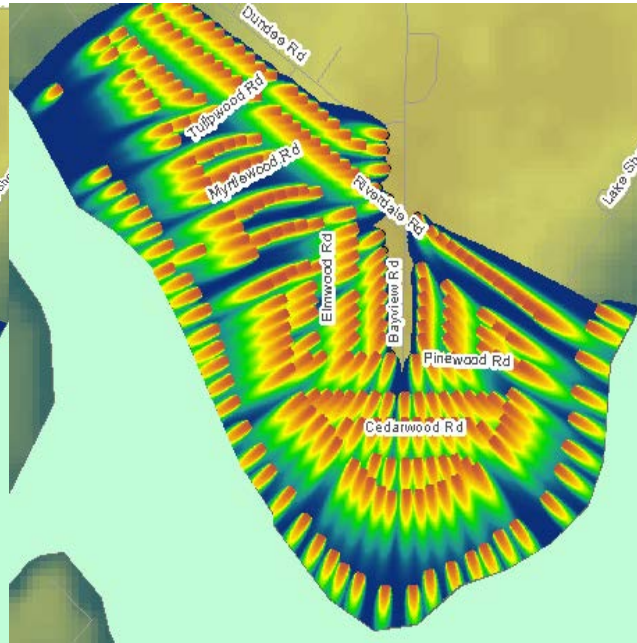
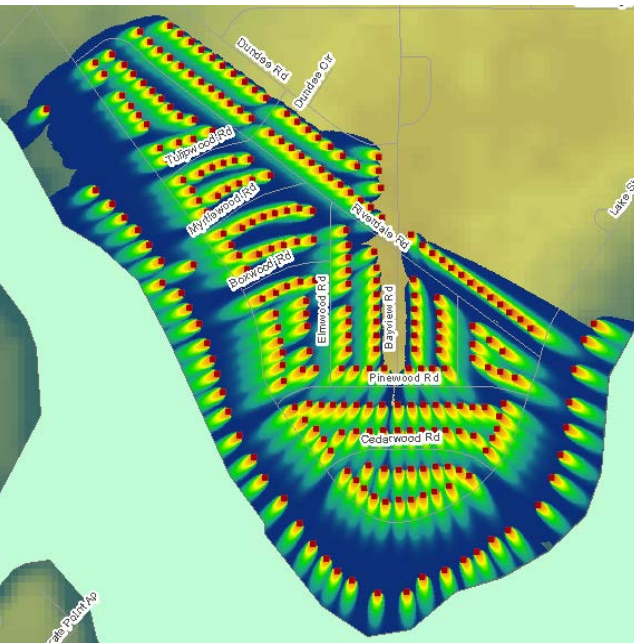
$k=0.004/\text{d}$

Parameter set 3

Load=0.60 lb/day

$\alpha_L=21.34\text{m}$ ,  $\alpha_T=0.021\text{m}$

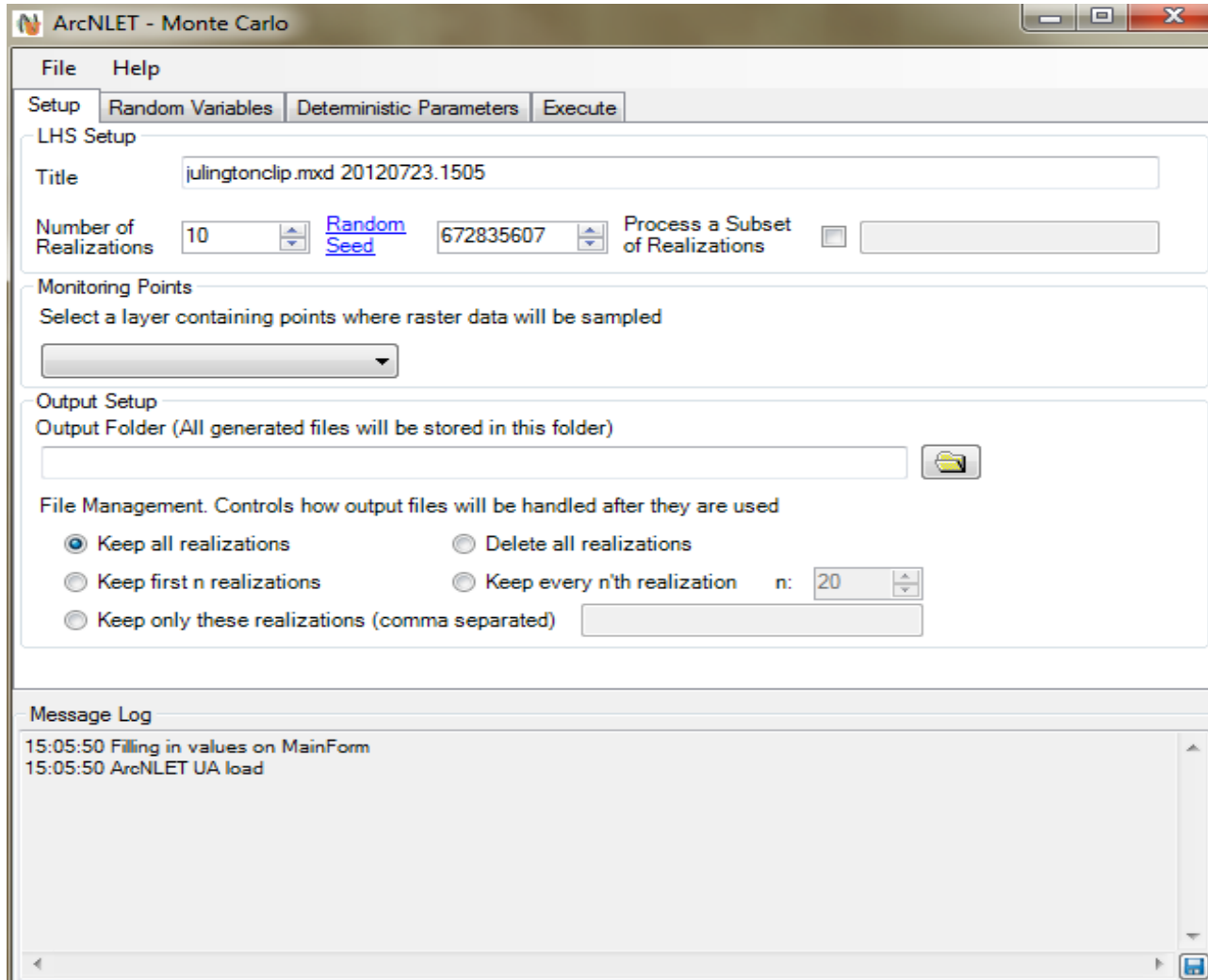
$k=0.004/\text{d}$





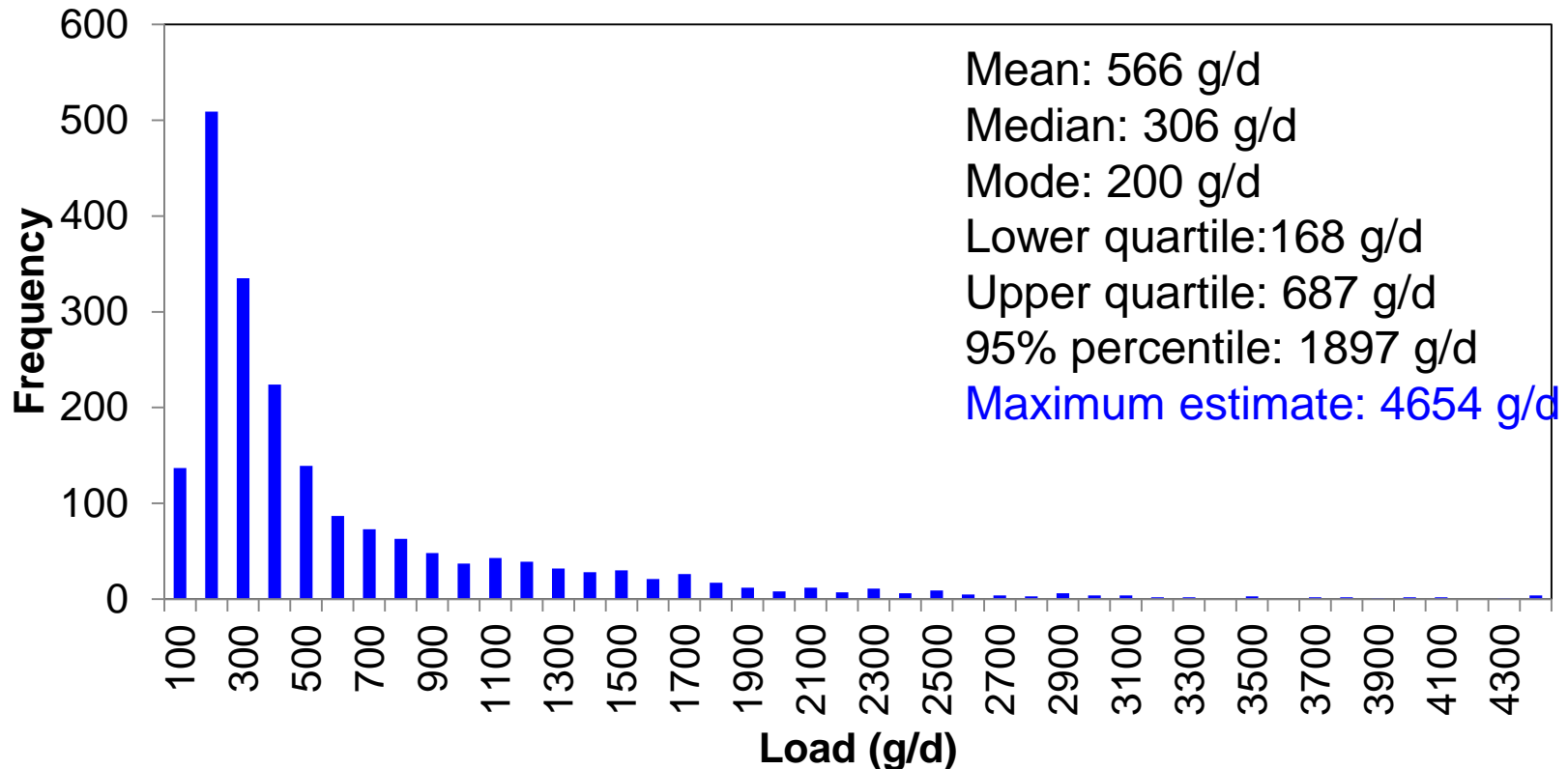
# ArcNLET-MC for Uncertainty Quantification

Recently released in ArcNLET 2.0.



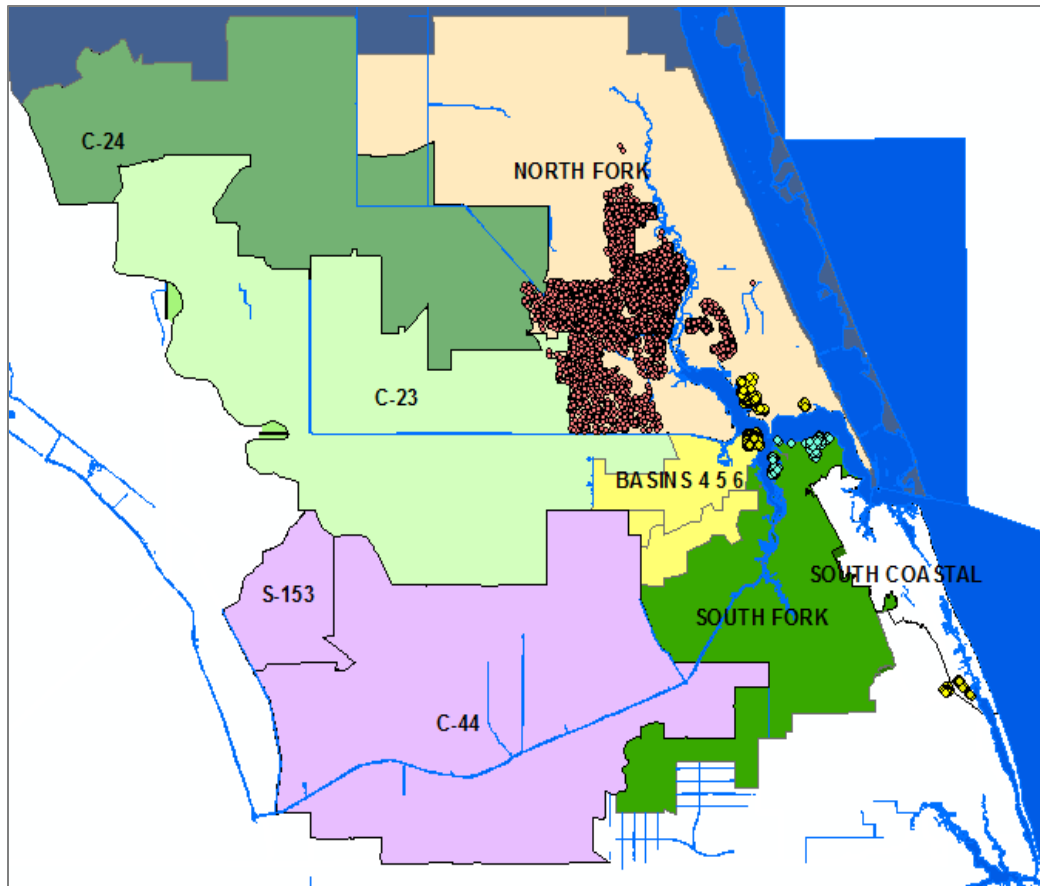
# Uncertainty Analysis

## Histogram of Load



- The load estimation has **large uncertainty**.
- **Uncertainty reduction** can be achieved if more data and information becomes available.

# ArcNLET modeling for the City of Port St. Lucie, the City of Stuart, and Martin County



A [technical report](#) has been submitted to FDEP. It can be requested from me or Katie directly.

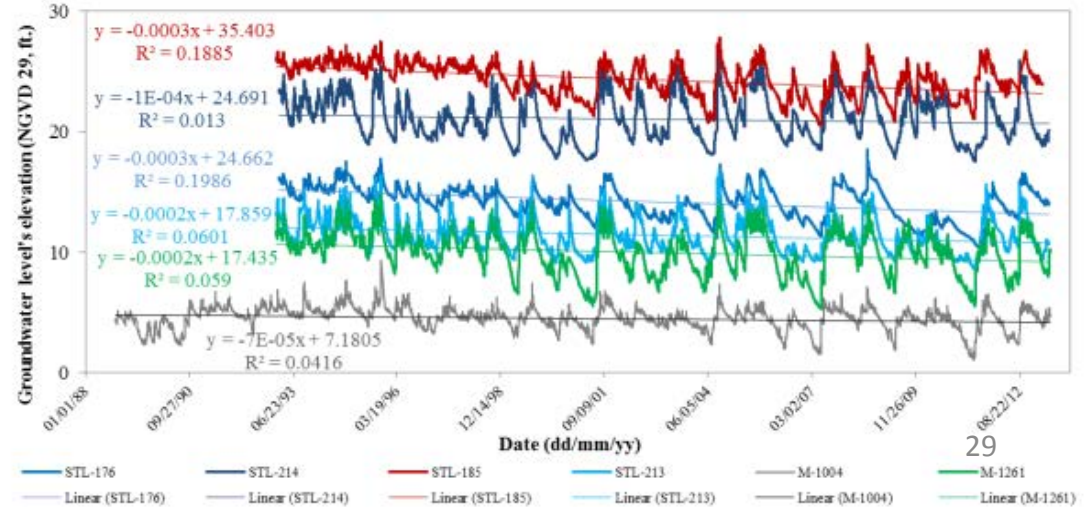
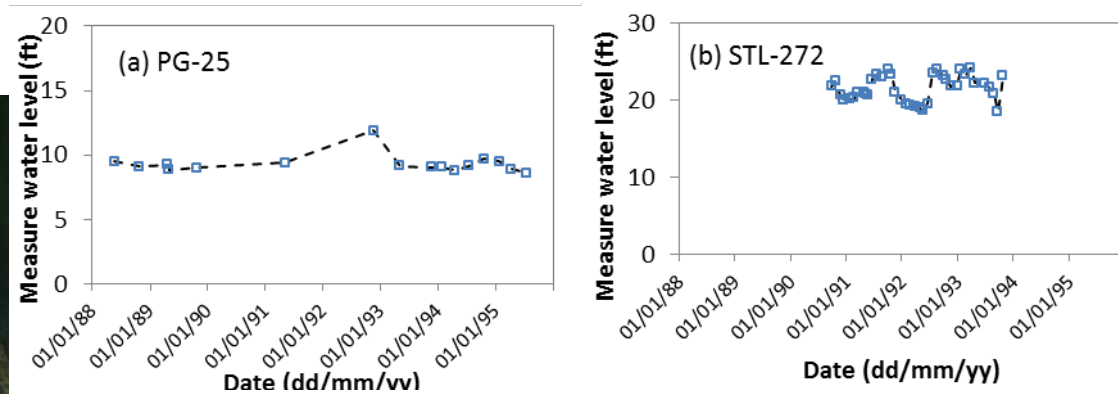
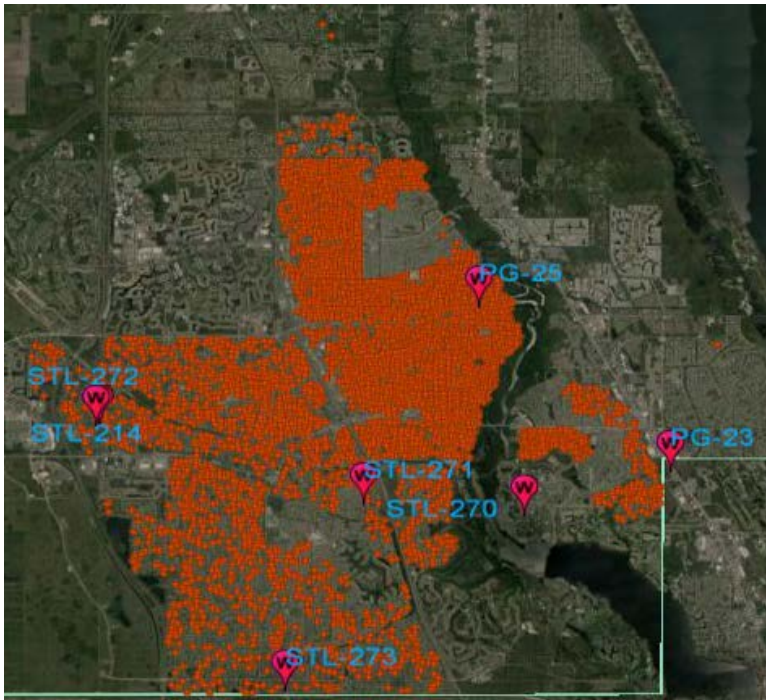
# Modeling Procedure

For each site, whenever site-specific data are available,

- **Compile historical data** to understand groundwater flow and nitrogen transport at the modeling sites. (Chapter 3)
- **Select calibration data** of hydraulic head and nitrogen concentration to estimate ArcNLET flow and transport model parameters. (Chapter 3)
- **Calibrate the ArcNLET model.** (Chapter 4)
- **Simulate nitrogen transport** at the modeling site, using the calibrated model. (Chapter 4)
- **Estimate the nitrogen load.** (Chapter 4)
- **Conduct Monte Carlo simulation** to address uncertainty in model parameters. (Chapter 5)

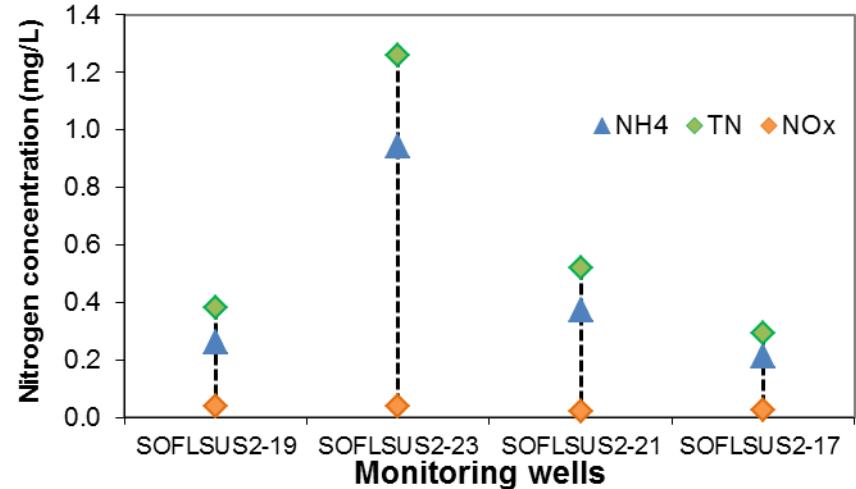
# Compiled Data: Water Level

The data in the modeling sites are **old** (measured in the period of 1988-1995), but their average values are still **representative** of the groundwater conditions of the modeling sites.



# Compiled Data: Nitrogen Concentration

- Observations of nitrogen concentrations are extremely scarce.
- Four data are available in the City of Port St. Lucie and one data in Martin County.
- The data at well PG-25 was measured in 1976-1977. The other four data were measured in 2008.



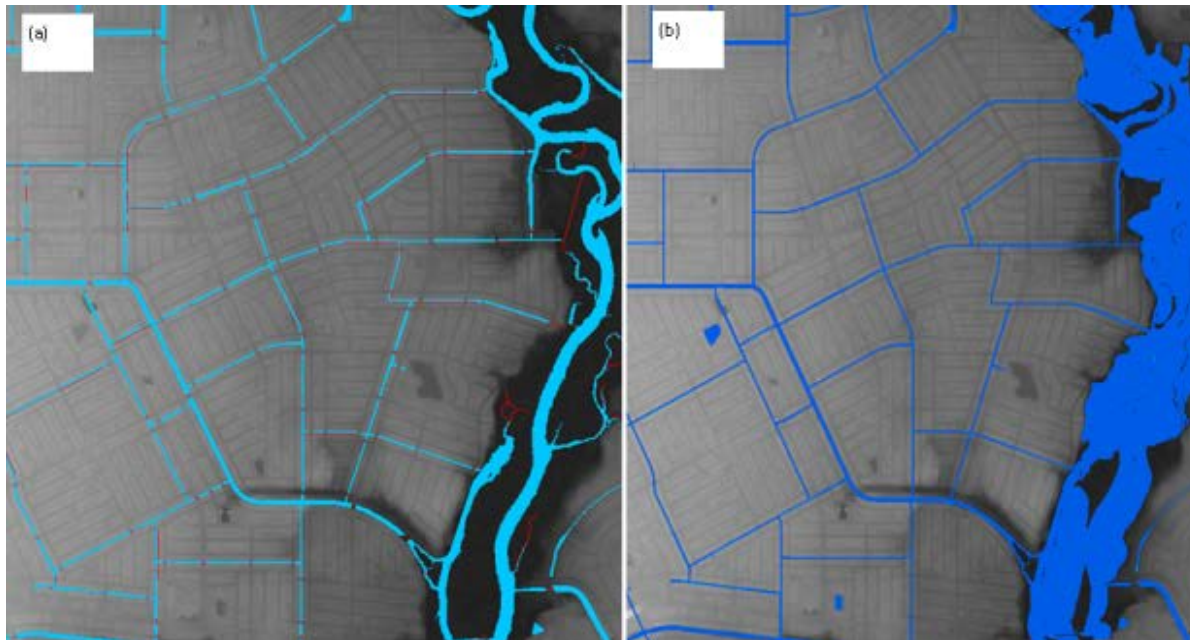
Area	Wells	Data source	NO <sub>x</sub>	NH4	TN/DIN
City of Port St. Lucie	SOFLSUS2-19	USGS	0.040	0.220	0.380
	SOFLSUS2-21	USGS	0.021	0.349	0.520
	SOFLSUS2-23	USGS	0.040	0.900	1.260
	PG-25	USGS	0.005	0.283	0.288
Martin County	SOFLSUS2-17	USGS	0.002	0.210	0.290

More data are necessary to validate the modeling results, improve nitrogen transport modeling, and reduce estimation uncertainty.

# Data for ArcNLET Modeling

- All the GIS data needed for ArcNLET modeling are available in the public domain or from local environmental agencies.
- **Local data** are important, e.g., the canals in the City of Port St. Lucie.

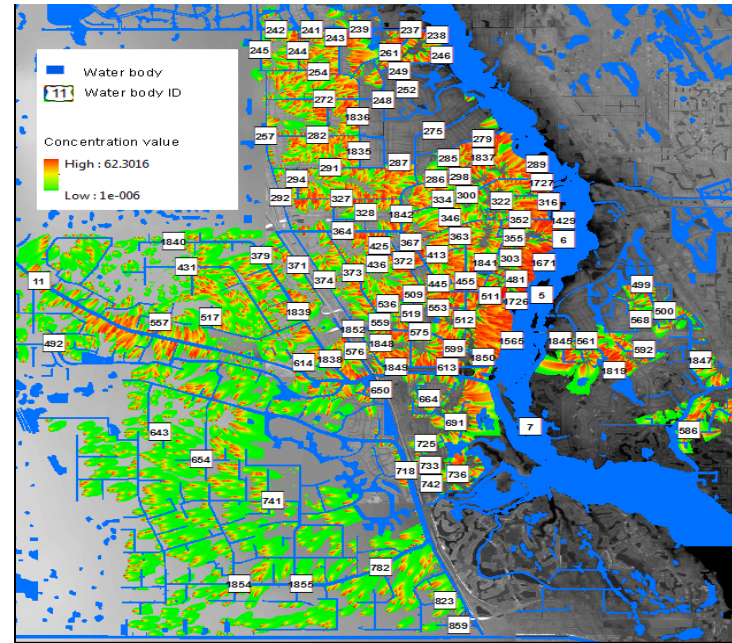
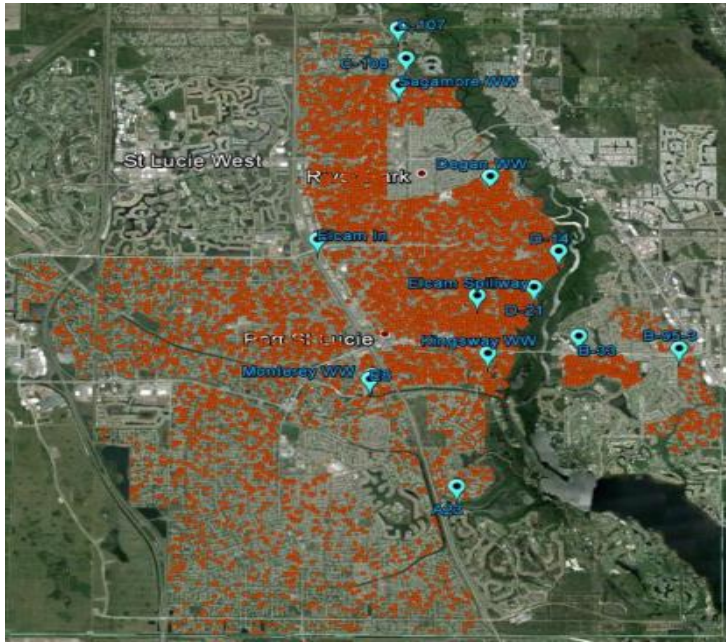
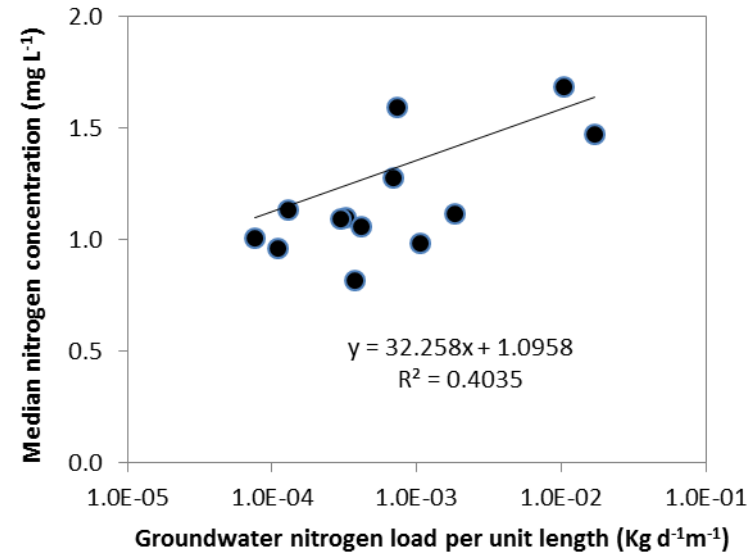
Local  
canal data



Local  
canal data  
+  
**National**  
NHD data

# Simulated Nitrogen Plumes

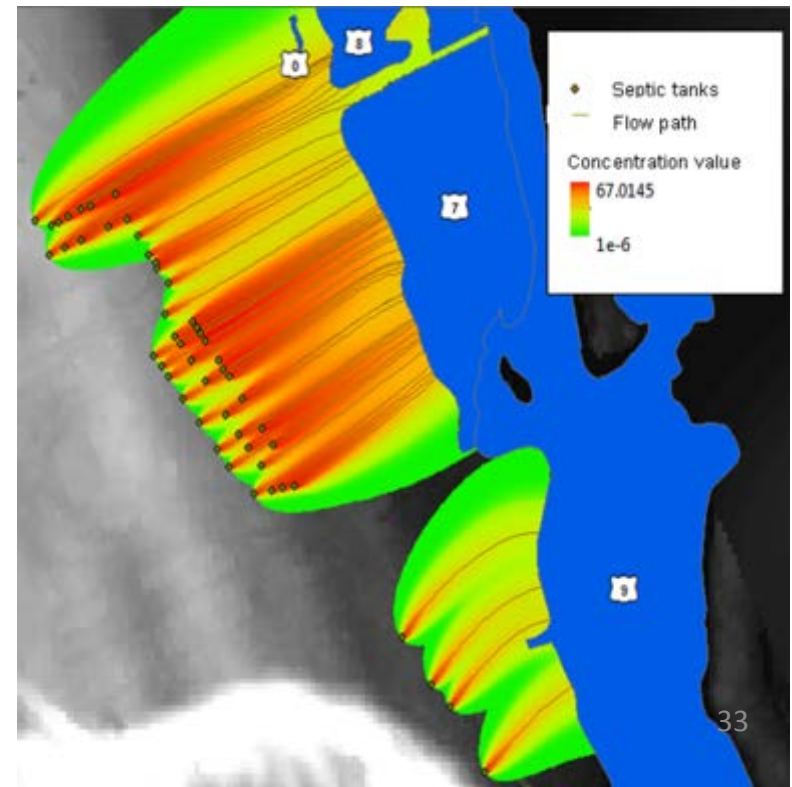
A strong correlation is observed between the **median values of surface water nitrogen concentration** and the **nitrogen loads to the corresponding surface water bodies**.





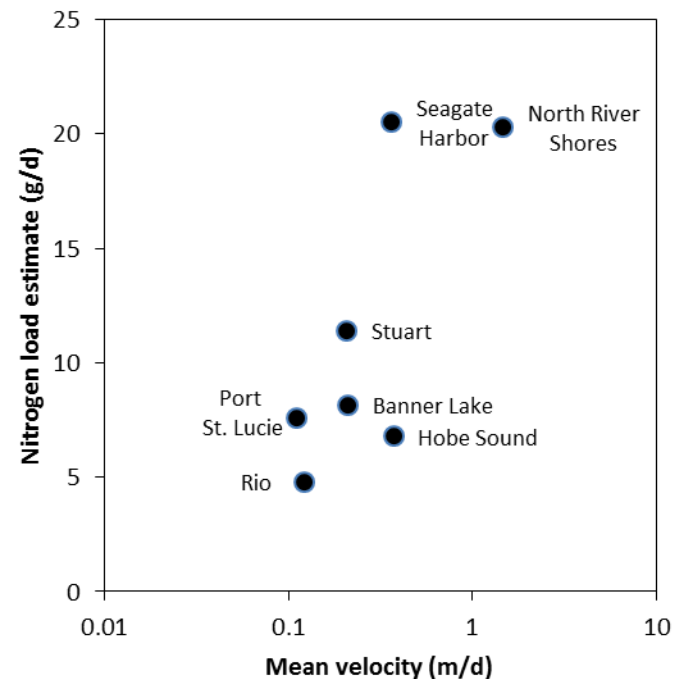
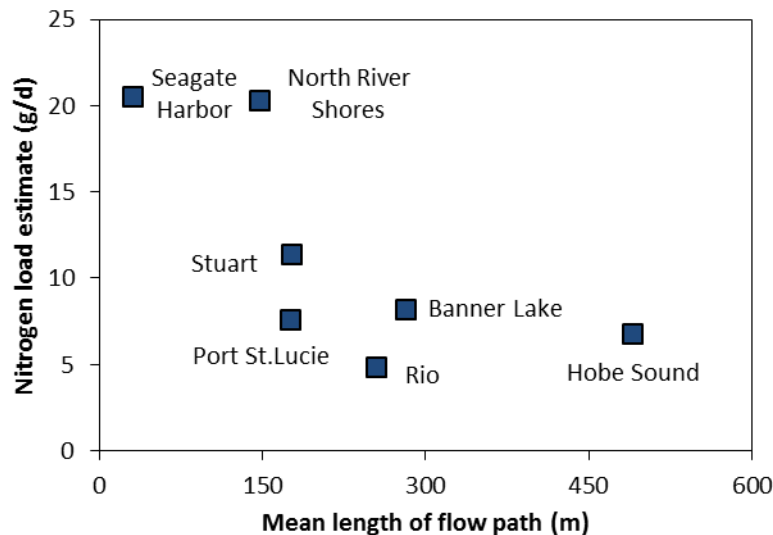
# Spatial Variability of Nitrogen Plumes

Spatial variability is obvious at different modeling sites, e.g., **Seagate Harbor** (left) (reduction ratio of 10.8%) and **Hobe sound** (right) (reduction ratio of 70.5%) in the Martin County.



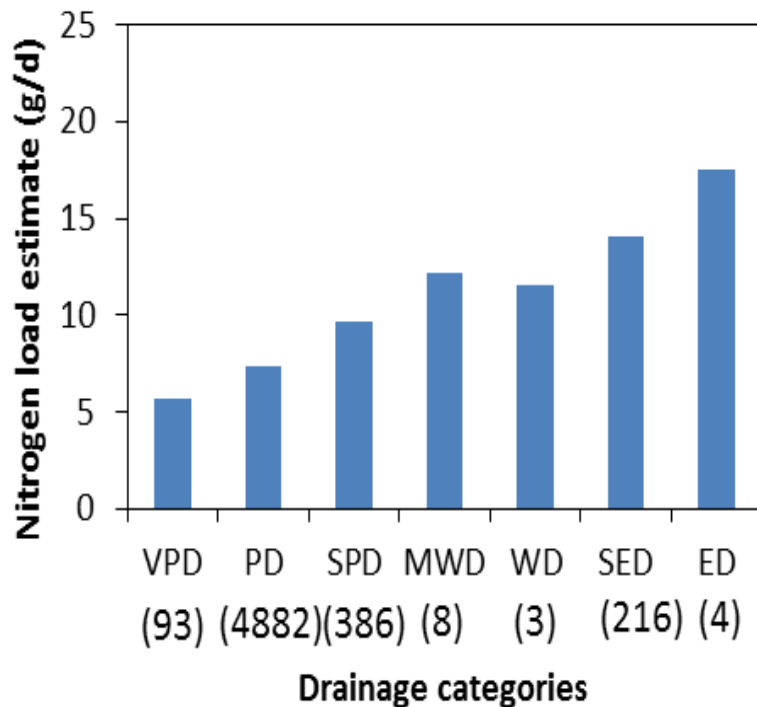
# Factors Controlling Load Estimate

- **Mean length of flow path** (left): long mean length of flow path corresponds to more denitrification and thus less load estimate.
- **Mean velocity** (right): larger mean velocity results in shorter travel time, less denitrification, and thus more load estimate.



# Factors Controlling Load Estimate

In the City of Port St. Lucie, the load estimate increases when the **drainage condition** changes from very poorly drained to excessively drained, because nitrogen transport is faster in well-drained soil is faster than in poorly drained soil.



VPD: very poorly drained

PD: poorly drained

SPD: somewhat poorly drained

MWD: moderately well drained

WD: well drained

SED: somewhat excessively drained

ED: excessively drained

The number of septic systems corresponding to each drainage condition is given in the parentheses

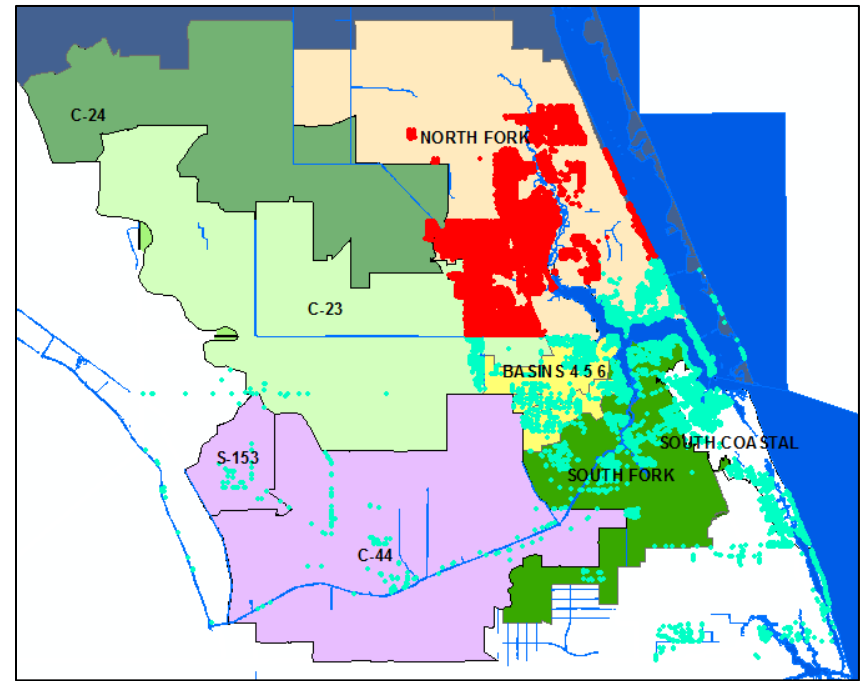
# Comparison with Literature Data

The nitrogen reduction ratios in this study have a **large range** but are comparable with the **literature data**, especially with that of Roeder (2008) obtained in the Wekiva Study.

Reference	Site Location	Daily nitrogen loads per septic system (g/d)	Daily nitrogen loadings to surface water per septic system (g/d)	Nitrogen reduction ratio
Roeder (2008)	Wekiva Study Area, FL	21.7		<b>70.0%<sup>a</sup></b>
Valiela et al. (1997)	Waquoit Bay, MA	23	9.87 <sup>b</sup>	<b>57.1%</b>
Meile et al. (2010)	McIntosh County, GA			<b>65-85 %<sup>c</sup></b>
This study	Port St. Lucie, FL	23	7.60	<b>67.0%</b>
	Stuart, FL	23	11.4	<b>50.4%</b>
	North River Shores, FL	23	20.3	<b>11.7%</b>
	Seagate Harbor, FL	23	20.5	<b>10.8%</b>
	Banner Lake, FL	23	8.15	<b>64.6%</b>
	Rio, FL	23	4.80	<b>79.1%</b>
	Hobe Sound, FL	23	6.78	<b>70.5%</b>

The septic system removal (actual and hypothetical) is

- absolutely worthy for the North Fork and Basin 4-5-6 sub-basins,
- (somewhat) worthy for the South Fork sub-basins,
- unworthy for C-24, C-23 and C-44/S-135 sub-basins.



	Basin 4-5-6	C-23	C-24	C-44/S-153	North Fork	South Fork
Percentage of nitrogen load from septic systems to BMAP estimated load	22.87%	0.03%	1.66%	0.00%	31.20%	10.33%
Percentage of load reduction of removed septic systems to BMAP required reduction	33.67%	0.05%	1.71%	0.00%	17.02%	1.35%
Percentage of load reduction to BMAP required reduction	<b>81.02%</b>	0.06%	3.25%	0.00%	<b>85.75%</b>	<b>25.76%</b>

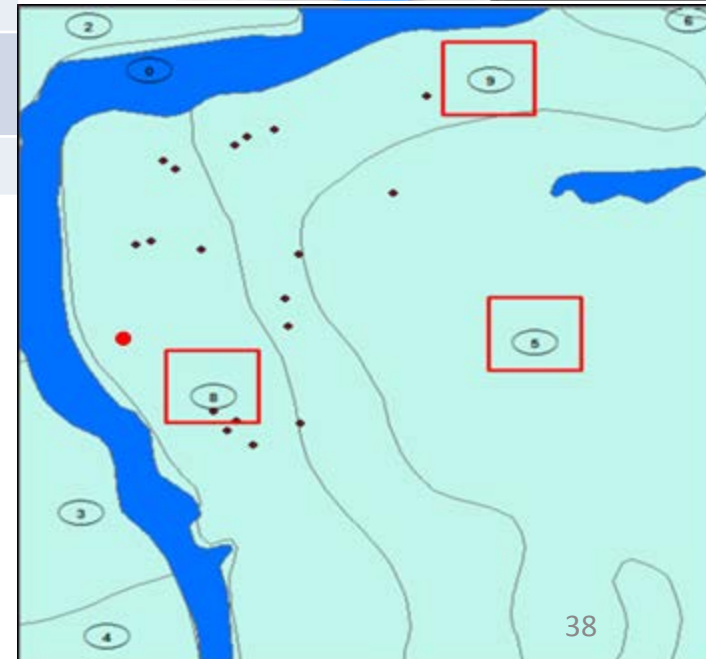
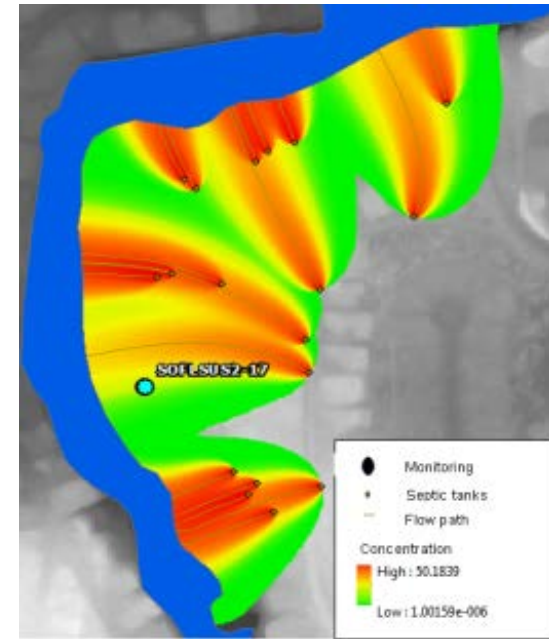
# Uncertainty Analysis: Compare with Field Observations

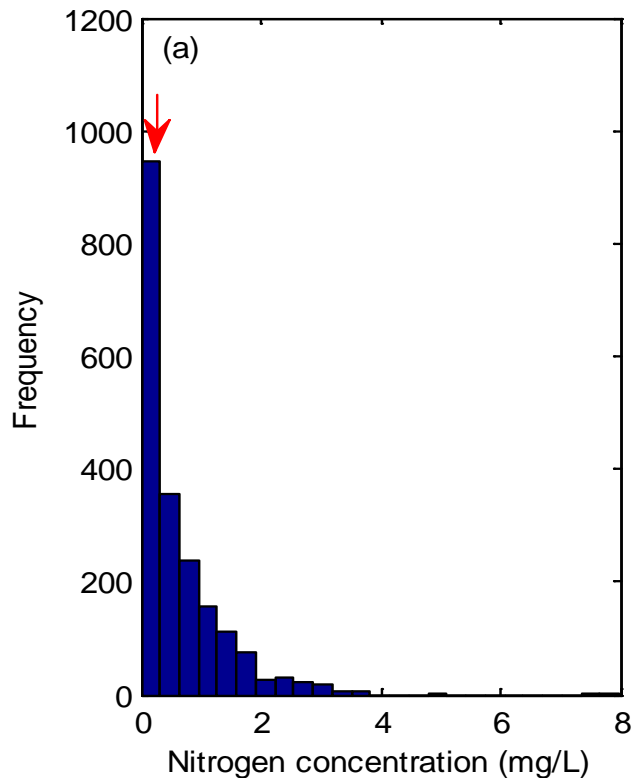
- A monitoring well is available at the site.
- Random parameters based on literature data

Parameter	Distribution	Minimum	Mode	Maximum
Smoothing Factor	Uniform	20	N/A	80
Longitudinal Dispersivity	Normal	1	N/A	100
Source Plane Concentration	Normal	25	N/A	80
Decay Coefficient	Lognormal	5.4E-5	N/A	0.015

- Random parameters (hydraulic conductivity) based on site-specific data.

Soil Zone FID	Minimum	Mode	Maximum
5	3.629	7.949	12.18
8	12.18	18.14	24.36
9	12.18	18.14	24.36

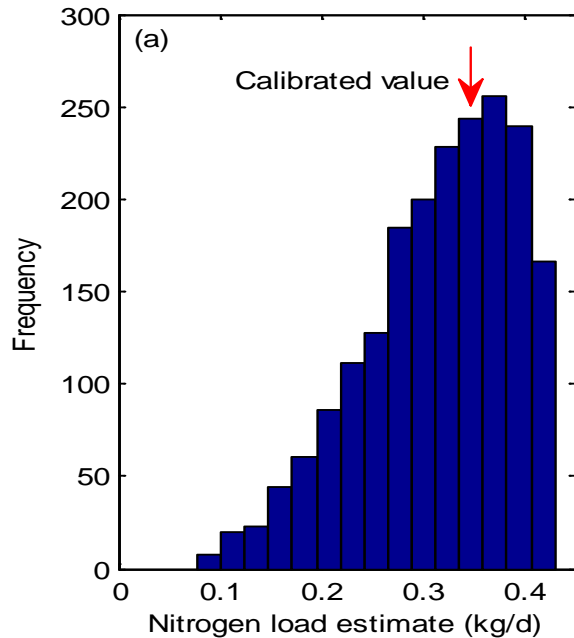




The **simulated concentration at the monitoring location** follows a lognormal distribution, which is attributed to the lognormal distribution of the first-order decay coefficient of denitrification, the most influential parameter to nitrogen concentration.

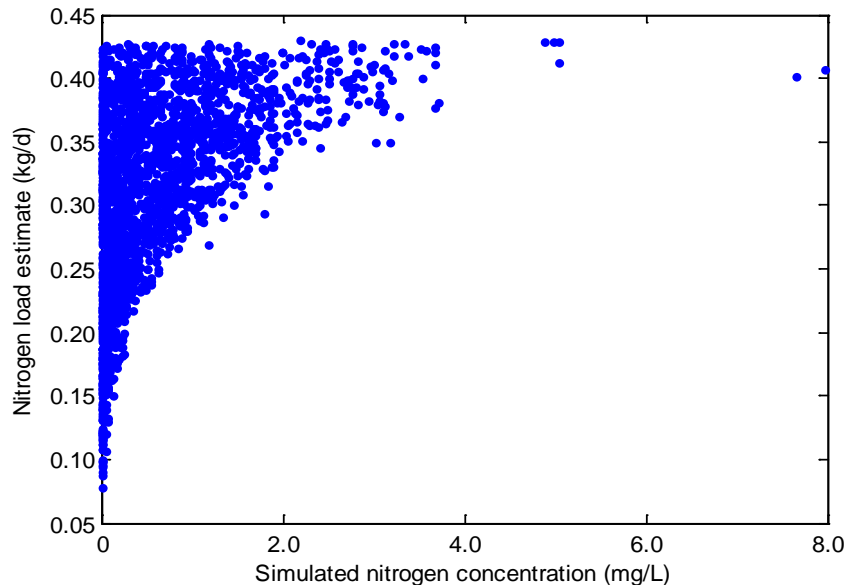
- The histogram indicates that, with the parameter distributions considered in this study, it is significantly more likely for the model to **simulate low concentration values** than to high values.
- This is **consistent with the low nitrogen concentration of 0.29 mg/L** observed at the monitoring well, suggesting that the calibrated model is likely to reflect nitrogen transport at the calibration site.

# Relation between Concentration and Load Estimate



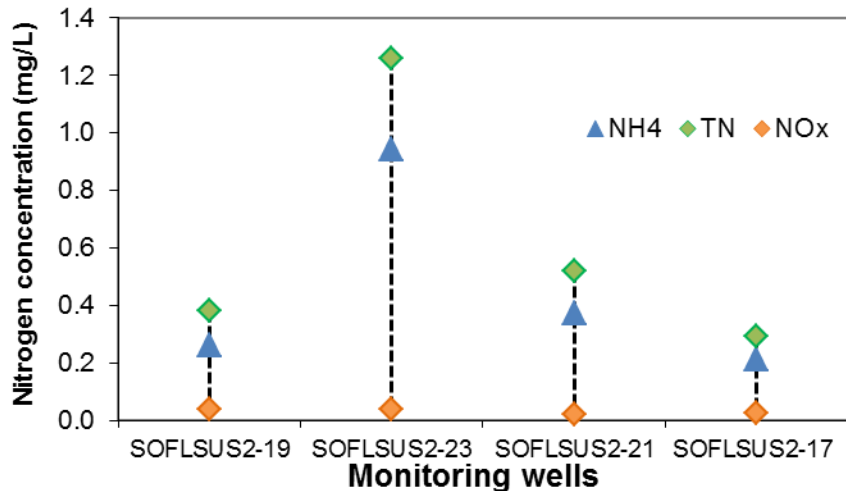
## Load Estimate

- The **estimated loads** corresponding to the calibration data is relatively large.
- The overall **positive correlation** indicates that larger nitrogen concentration corresponds to larger load.
- However, **larger load estimate may be still possible for low concentration**, because uncertainty in the load estimate increases when the simulated concentration decreases.
- The **uncertainty can be reduced** by collecting more field observations (e.g., continuous monitoring at the well), as more monitoring data can remove the realizations that cannot simulate the monitoring data.





# Use of Monitoring Data

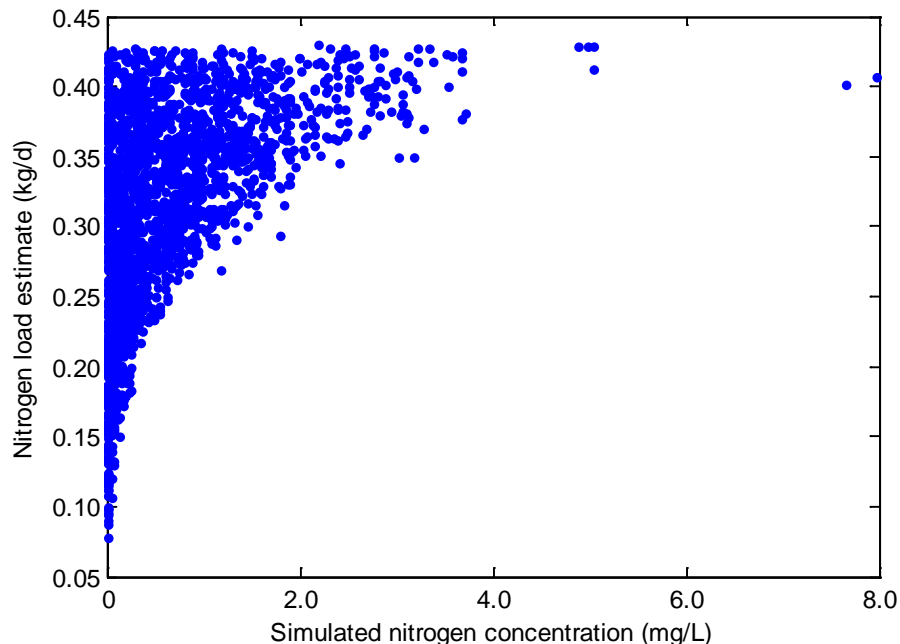


## For Calibration:

- Are the **one-time measurements** of nitrogen concentration **representative** of nitrogen concentration in time?
- Are **the measurements at the several locations** representative in space?
- The model calibration can be updated by assimilating the new data.

## For Uncertainty Reduction:

- If observed nitrogen concentrations are continuously higher than the simulated value, the bottom figure indicates that the load estimate will be higher with smaller uncertainty.
- If the opposite, we can update the modeling results by removing the realizations that give higher concentration, which will also reduce the uncertainty and give more certain load estimate.

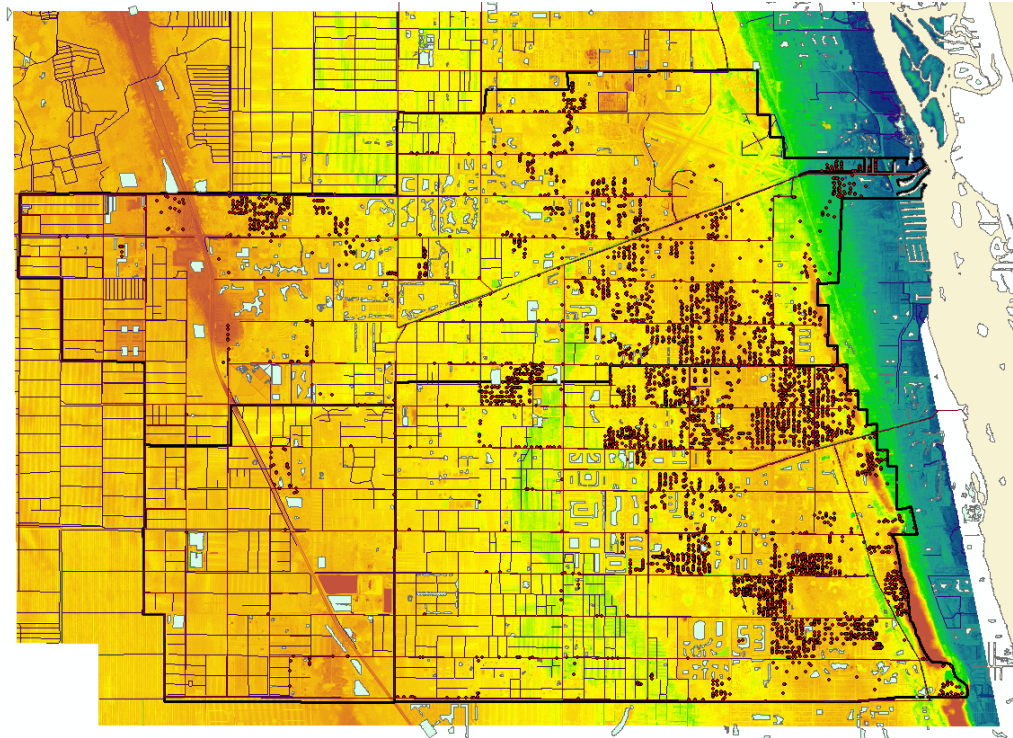


# On-Going ArcNLET Modeling for IRL

Data collected and compiled:

- LiDAR DEM (15ft and 5ft)
- Septic tank locations (parcels with no sewer service)
- Water bodies (canals, waterbodies, shorelines, ...)
- Hydraulic conductivity and porosity (SSURGO)

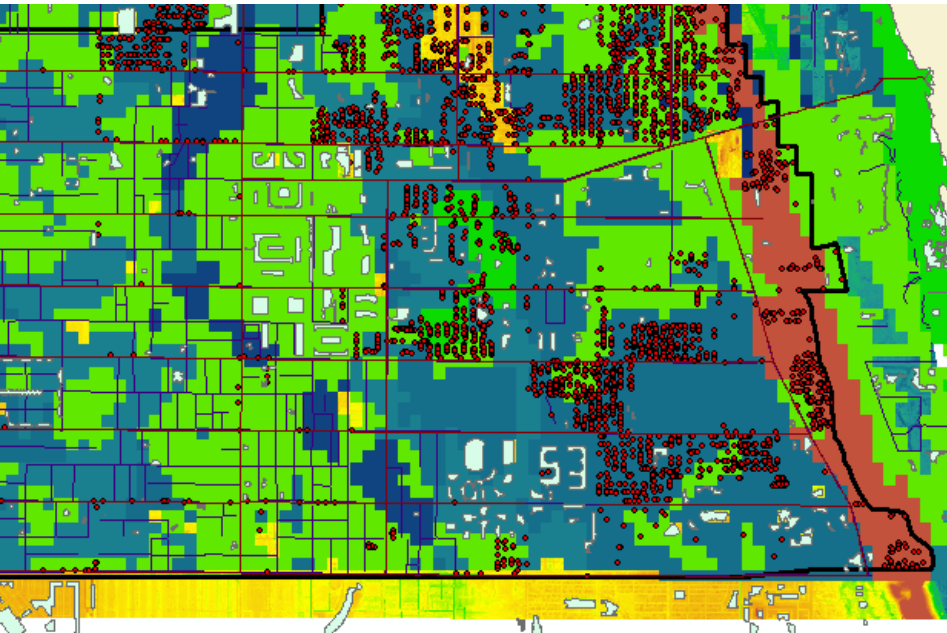
Help from Vincent Burke, Arjuna Weragoda, and Will Rice for data collection is greatly appreciated.



Main Canal and South Canal

# Devils in Details

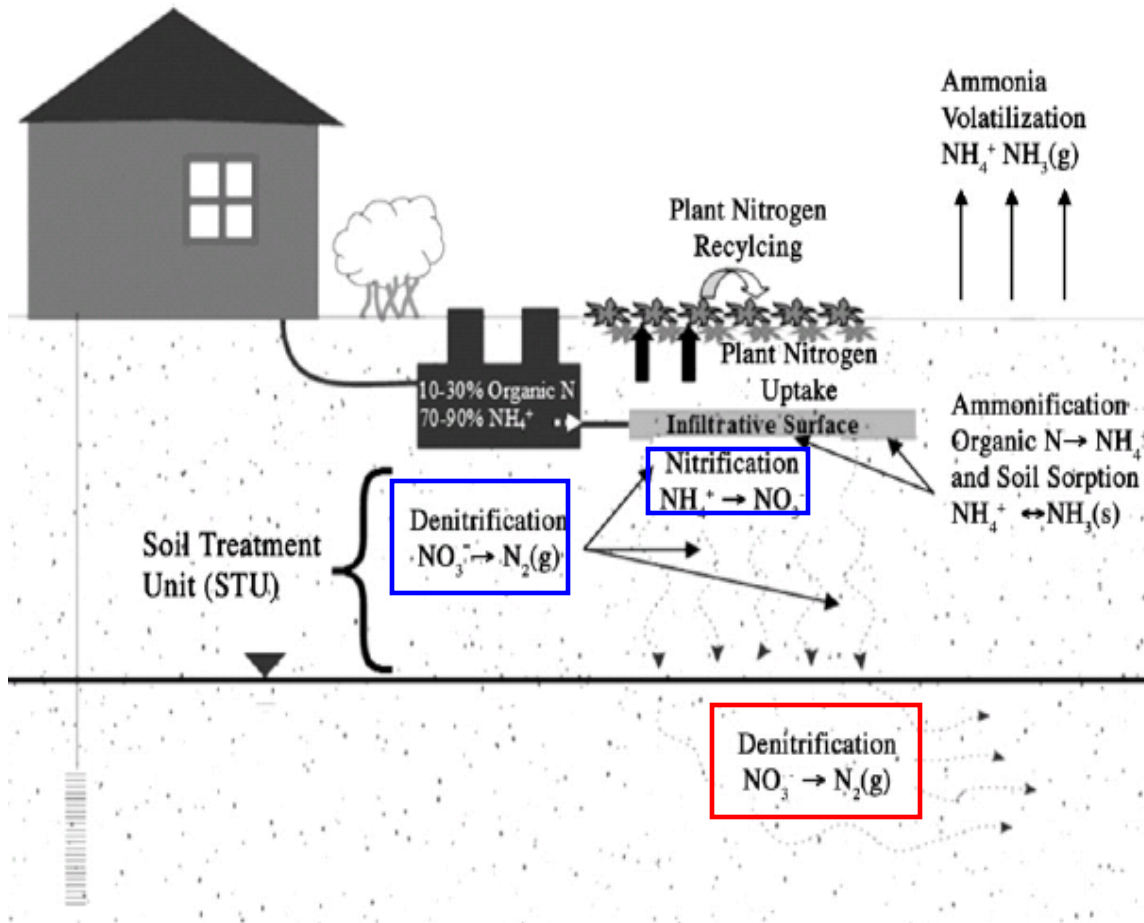
- ~1% error in septic tank locations
- Inconsistent between the datasets (e.g., DEM and SSURGO)
- Site-specific handling (e.g., landfill with elevation of 111 ft)



# Future Work

- Clean the data needed for setting up ArcNLET flow and transport modeling.
- Collect monitoring data of hydraulic head and nitrogen concentration.
- Conduct model calibration and estimate nitrogen load in an iterative manner when new data (e.g., seepage measurements) arrive.
- Evaluate the load estimates and make management suggestions.

# Model Integration



**Soil Processes:** Simulated using **VZMOD**

- Unsaturated flow
- Solute transport
- Nitrification and denitrification

**Groundwater Process:** Simulated using **ArcNLET**

- Groundwater flow
- Solute transport
- Denitrification

**ArcNLET-MC:** Quantify uncertainty of ArcNLET simulations

# Conclusions

- ArcNLET has been developed as a numerical model and software for nitrogen load estimation.
- The software has been used for several different sites in Florida.
- Preliminary modeling for IRL has started, and modeling results should be available in next couple of months.
- Modeling results (including uncertainty quantification) may be useful to management of nutrient pollution in IRL.
- Model results can be used to provide insights and guidelines of data collection.

# Questions, Suggestions, and Comments?

