

# **Real-Time Continuous Water-Quality Data: Capabilities, Limitations, Applications, Costs, and Benefits**

*Presented by*

*Andy Ziegler, Trudy Bennett, and Teresa Rasmussen  
USGS Kansas Water Science Center*

*with contributions from Casey Lee, Pat Rasmussen, Xiaodong Jian,  
Chauncey Anderson, Rick Wagner, John Hem, and many others*



**National Water-Quality Monitoring Council Conference  
San Jose, California, May 9, 2006**

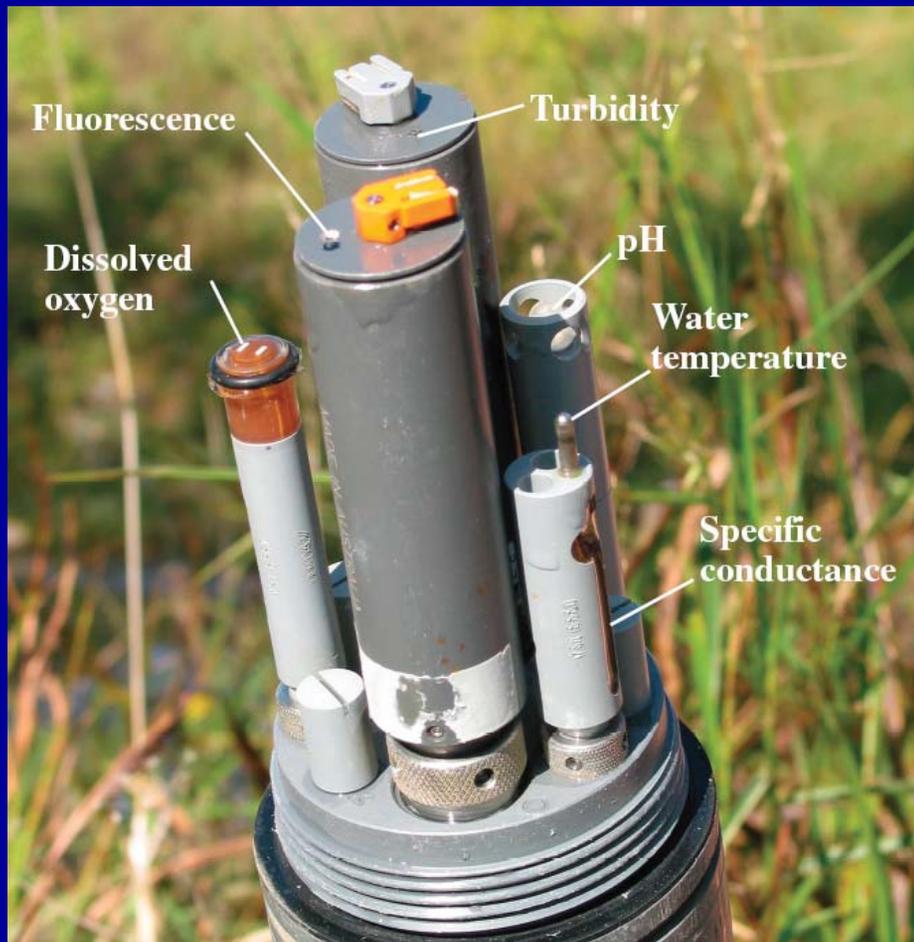
# Short-course Outline:

- **Why, how, and where continuous WQ?**
- **Examples of continuous WQ data**
  - **Dissolved oxygen**
  - **Turbidity**
- **USGS protocols: O&M and QA**
- **Regression model development to estimate environmentally-relevant compounds**
- **Examples of applications**
- **Benefits and future**

# Why monitor water quality continuously?

- Improves our understanding of hydrology and water quality and can lead to more effective resource management
- Captures seasonal, diurnal, and event-driven fluctuations
- Provides warning for water supply and recreation
- Improves concentration and load estimates with defined uncertainty (8,760 hourly values per year)
- Optimizes the collection of samples

# Improved tools now are available-- In-stream continuous monitors...



- pH
- Water Temperature
- **Dissolved Oxygen**
- Specific Conductance
- **Turbidity**
- ORP
- Fluorescence
- PAR
- Nitrate, ammonia, etc.
- New gizmos every year

# Types of continuous water-quality sensors

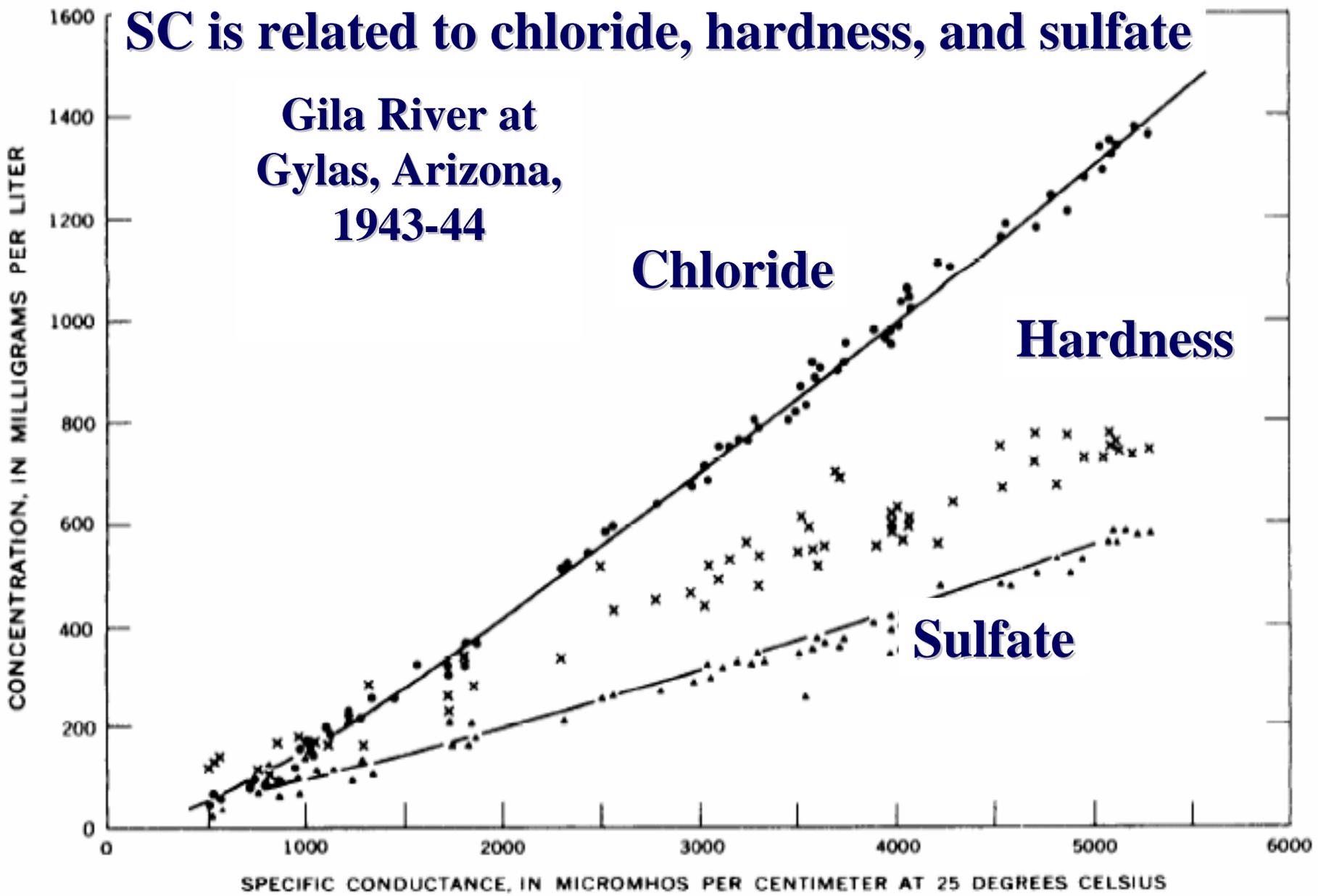
- **Electrometric**
  - Gage height, temperature, pH, DO, SC
- **Electromagnetic spectrum**
  - Streamflow, turbidity, chlorophyll, nitrate
- **In-stream analyzers (bench chemistries)**
  - Nitrate, silicate, phosphorus, chloride, ....
- **Labs in field at gage house**
  - Aqualab (TCEQ), GC/MS- ORSANCO, etc...

# Brief history of continuous water-quality monitoring

- Streamflow- more than 100 years
- Continuous estimated SC (Ohm)– Stabler (1911)—  
Daily samples—time-weighted composites with  
streamflow
- Continuous SC in Kansas- 1958, Albert
- YSI- Clark cell dissolved oxygen- 1963
- Hydrolab, 1968
- USGS monitors in 1970's at NASQAN sites
- Continuous real-time water quality in Kansas since  
1998
- Large increase in the number of “gizmos” in last 10  
years

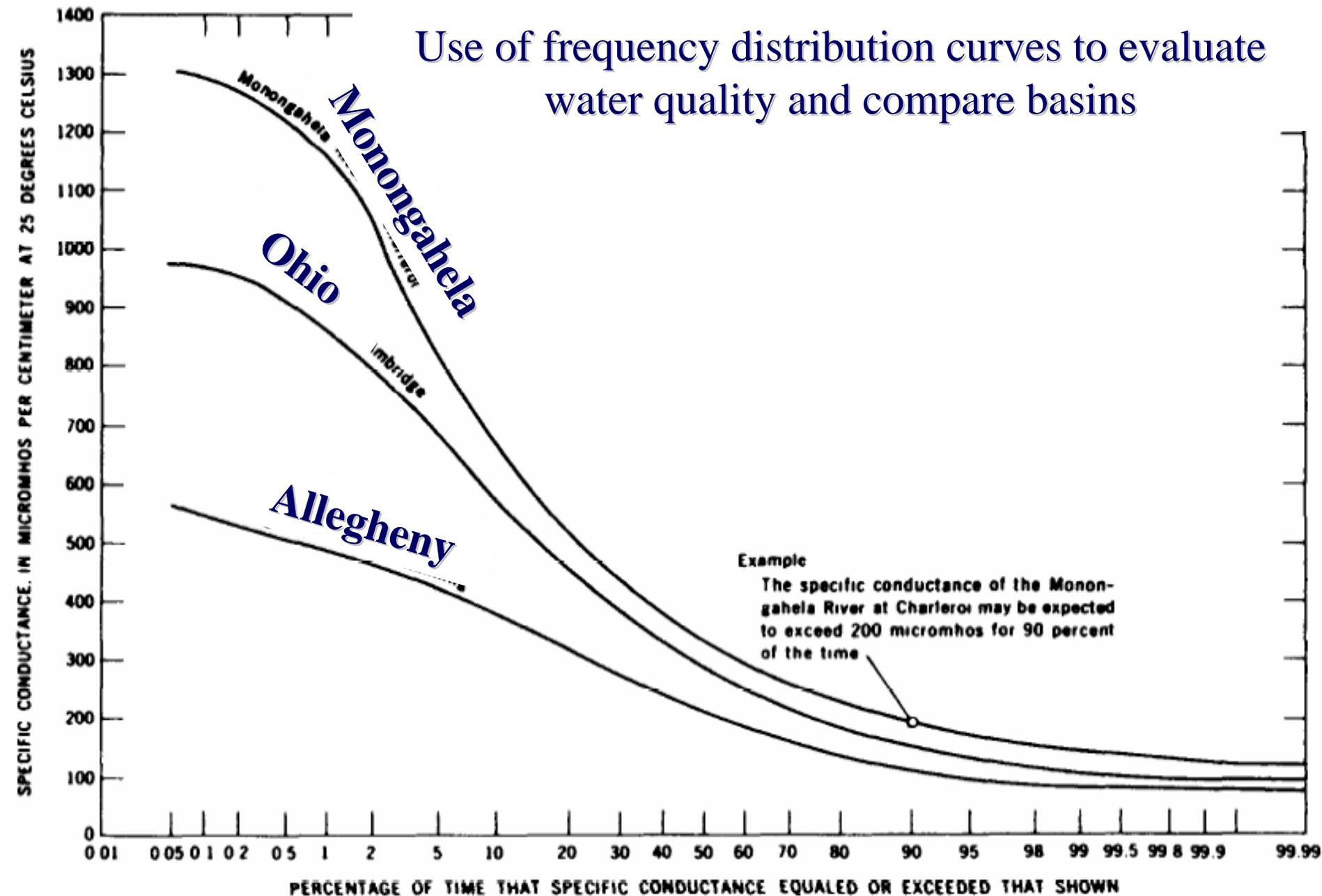
# SC is related to chloride, hardness, and sulfate

Gila River at  
Gilas, Arizona,  
1943-44



From Hem, 1985, Study and interpretation of the chemical characteristics of natural water

# Use of frequency distribution curves to evaluate water quality and compare basins



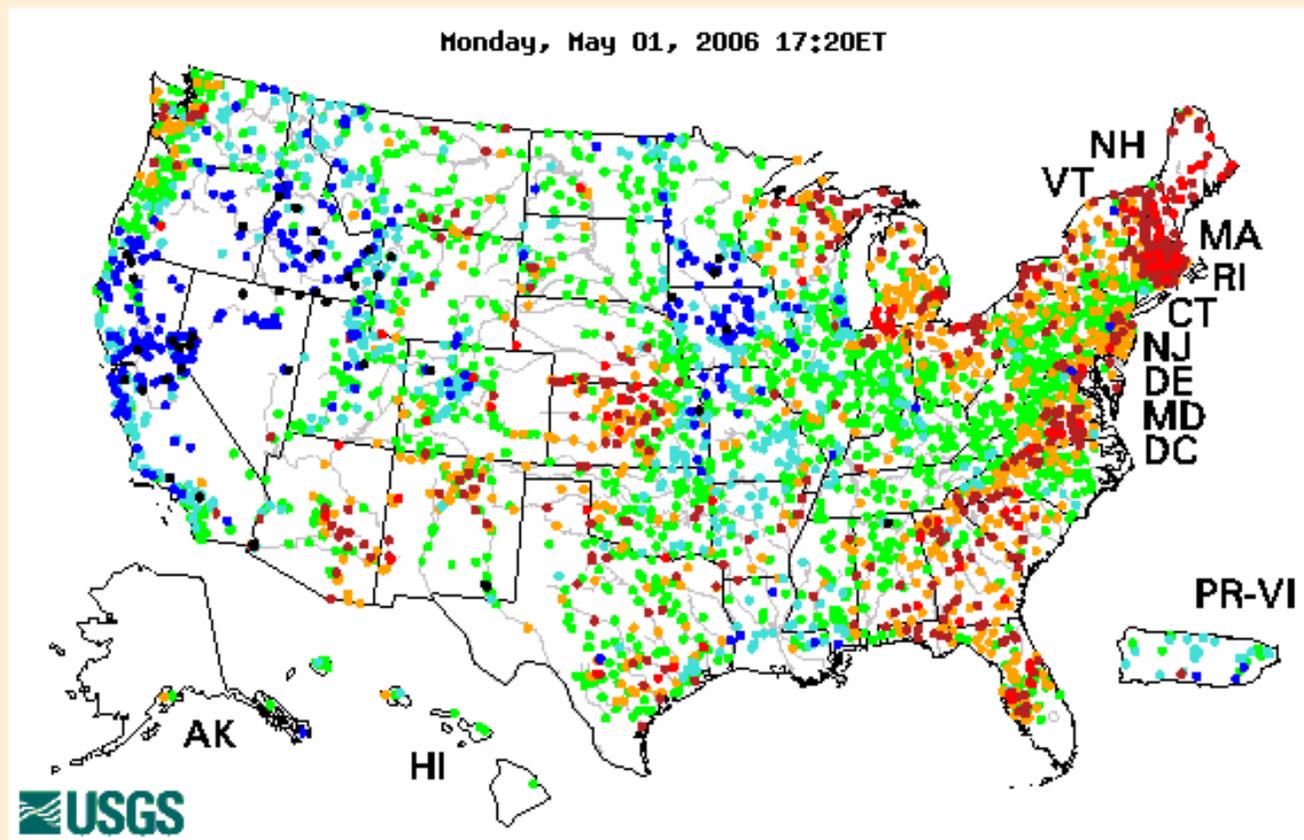
Example  
The specific conductance of the Monongahela River at Charleroi may be expected to exceed 200 micromhos for 90 percent of the time

Figure 24. Cumulative frequency of conductance, Allegheny, Monongahela, and Ohio River waters, Pittsburgh area, Pennsylvania, 1944-50. (From Hem, 1985, Study and interpretation of the chemical characteristics of natural water)

# USGS streamflow network of 7,000+

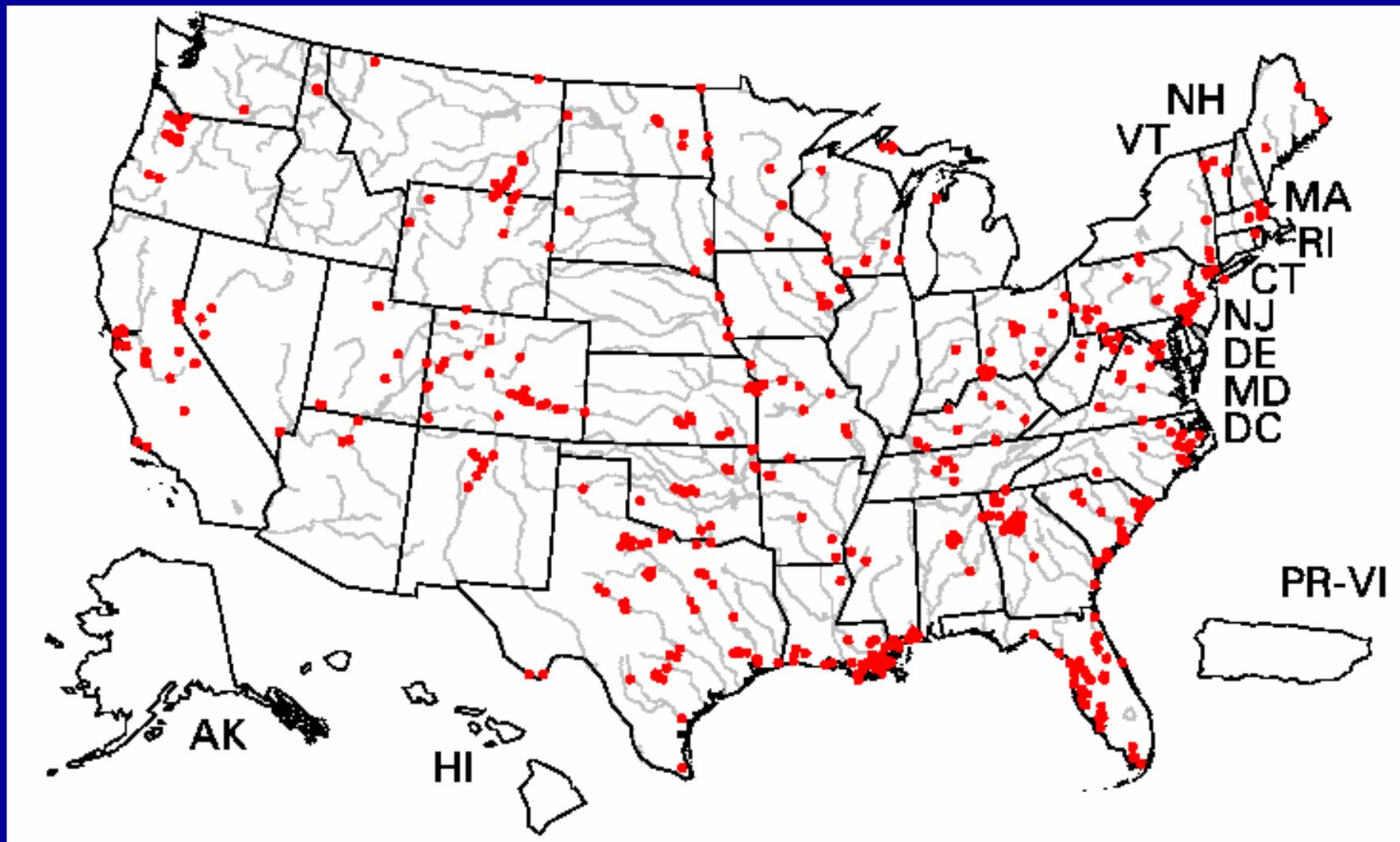
WaterWatch -- *Current water resources conditions*

Animation of daily streamflow maps for May 2006



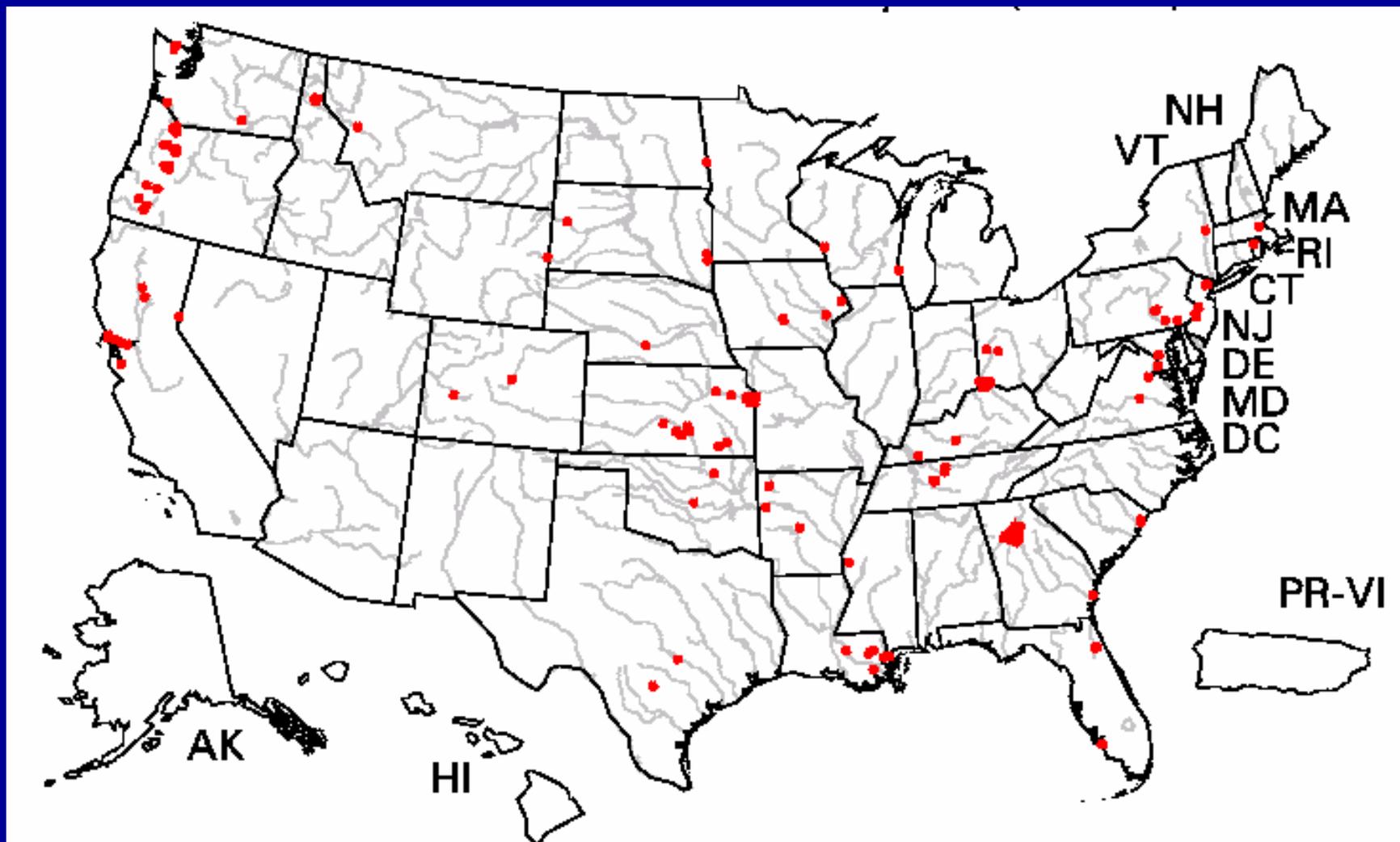
Explanation - Percentile classes						
Low	< 10	10 - 24	25 - 75	76 - 90	> 90	High

# Where is USGS operating continuous WQ sites?



Specific conductance at 612 sites

# Where is USGS operating continuous “turbidity”?



**211 sites. Most sites are in Oregon (34), Georgia (34), Kansas (17), and 10 each in California, Kentucky, and Virginia**

# Many links to continuous water-quality data are now available compared to 5 years ago

- [ks.water.usgs.gov/Kansas/rtqw/](http://ks.water.usgs.gov/Kansas/rtqw/)
- [tonguerivermonitoring.cr.usgs.gov/](http://tonguerivermonitoring.cr.usgs.gov/)
- [www.glo.state.tx.us/coastal/beachwatch](http://www.glo.state.tx.us/coastal/beachwatch)
- [www.dmww.com/empact\\_p2.asp](http://www.dmww.com/empact_p2.asp)
- [www.tceq.state.tx.us/compliance/monitoring/water/quality/data/wqm/swqm\\_realtime\\_swf.html#data](http://www.tceq.state.tx.us/compliance/monitoring/water/quality/data/wqm/swqm_realtime_swf.html#data)
- <http://www.mysticriveronline.org>

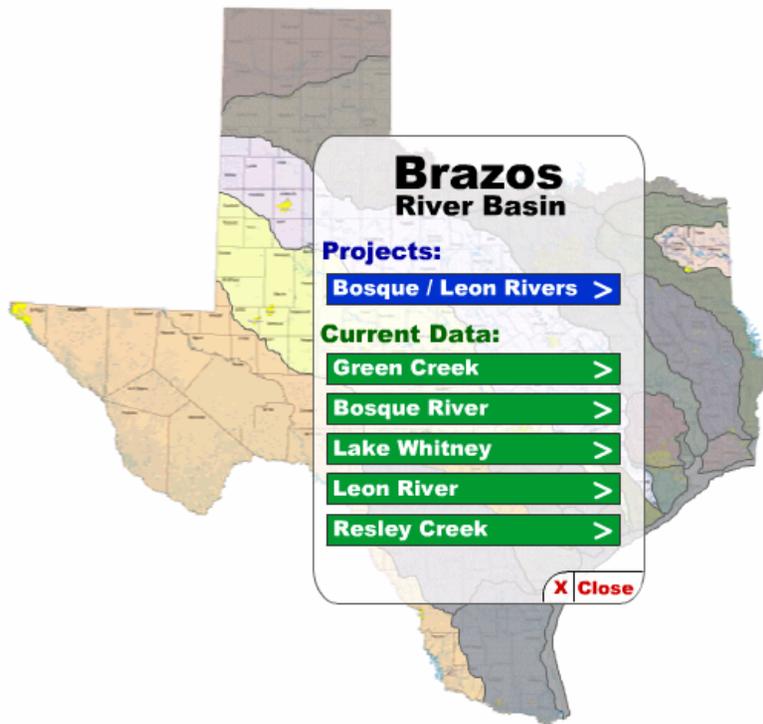
# Texas Commission on Environmental Quality

[http://www.tceq.state.tx.us/compliance/monitoring/water/quality/data/wqm/swqm\\_realtime\\_swf.html#data](http://www.tceq.state.tx.us/compliance/monitoring/water/quality/data/wqm/swqm_realtime_swf.html#data)

## Continuous Water Quality Station Information and Data by River Basin

The map below uses Macromedia Flash . If you do not have the free Macromedia Flash player, download it [Exit... here](#), or visit our alternate [Continuous Water Quality Monitoring Stations](#) page, which doesn't use Flash.

- Mouse over the map to highlight different river basins.
- Click on a basin to see available data collected from that particular basin.
- Gray areas on the map are basins for which no data are available.



- Maintained by: Stephenville Special Project Office of the TCEQ DFW Regional Office

[Area Map](#)

[Wide Aerial Photo](#)

[Overall site view](#)

[Closeup Aerial Photo](#)

[Street level Map](#)

[Upstream](#)

[Left Bank](#)



[Right Bank](#)

[Downstream](#)

[Current Measurements at Green Creek Water Site C701](#)

[Monthly Summary Report for Parameters at Green Creek Water Site C701](#)

Select a different site

Month: Day: Year: Time Format:

April 28 2006 12 Hour (AM/PM)

Highlight validated data

The table below contains hourly averages for all the pollutants and meteorological conditions measured at Green Creek Site C701 for **Friday, April 28, 2006**. All times shown are in Central Standard Time.

Parameter Measured	Morning												Afternoon			
	Mid	1:00	2:00	3:00	4:00	5:00	6:00	7:00	8:00	9:00	10:00	11:00	Noon	1:00	2:00	3:00
Precipitation	<b>0.00</b>	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	FEW	NA	NA
Water Flow Rate	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	NA	NA
Water Velocity	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	NA	NA
Water Level	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	PMA	NA	NA
Water Ammonia	<b>0.13</b>	0.13	0.13	0.13	<b>0.14</b>	0.14	0.14	0.14	0.14	0.14	0.13	0.13	0.13	FEW	NA	NA
Water Nitrate	0.79	0.79	0.76	<b>0.68</b>	0.68	0.68	0.68	0.68	0.77	<b>0.85</b>	0.85	0.85	0.85	FEW	NA	NA
Turbidity	<b>12.01</b>	13.51	17.50	20.00	21.00	<b>21.50</b>	20.00	19.00	19.50	20.00	19.00	19.00	19.50	FEW	NA	NA
Water Total Reactive Phosphate	<b>0.076</b>	0.077	0.078	0.078	0.078	0.078	0.078	0.079	<b>0.080</b>	0.080	0.080	0.080	0.080	FEW	NA	NA
Parameter Measured	Mid	1:00	2:00	3:00	4:00	5:00	6:00	7:00	8:00	9:00	10:00	11:00	Noon	1:00	2:00	3:00
	Morning												Afternoon			

Maximum values for each parameter are **bold** within the table. Minimum values are **bold italic**.



# Examples of comparisons of different dissolved oxygen (DO) and turbidity instruments

## YSI ROX

...most versatile and complete sensor payload that can tolerate the... coincides with the launch of its [ROX Reliable Oxygen Sensor](#) and... (marine).



YSI 6820 V2 multiparameter sonde has an upgraded bulkhead to accommodate optical sensors such as dissolved oxygen and blue-green algae.

## YSI Extended Deployment System (EDS)



Multi-Parameter TROLL 9500  
Versions | Specifications | **Optical D.O. (RDO)**

### RDO™ Optical Dissolved Oxygen Sensor



#### Product Details

- Brochure
- Specifications
- 3rd-Party testing

## Hach LDO™

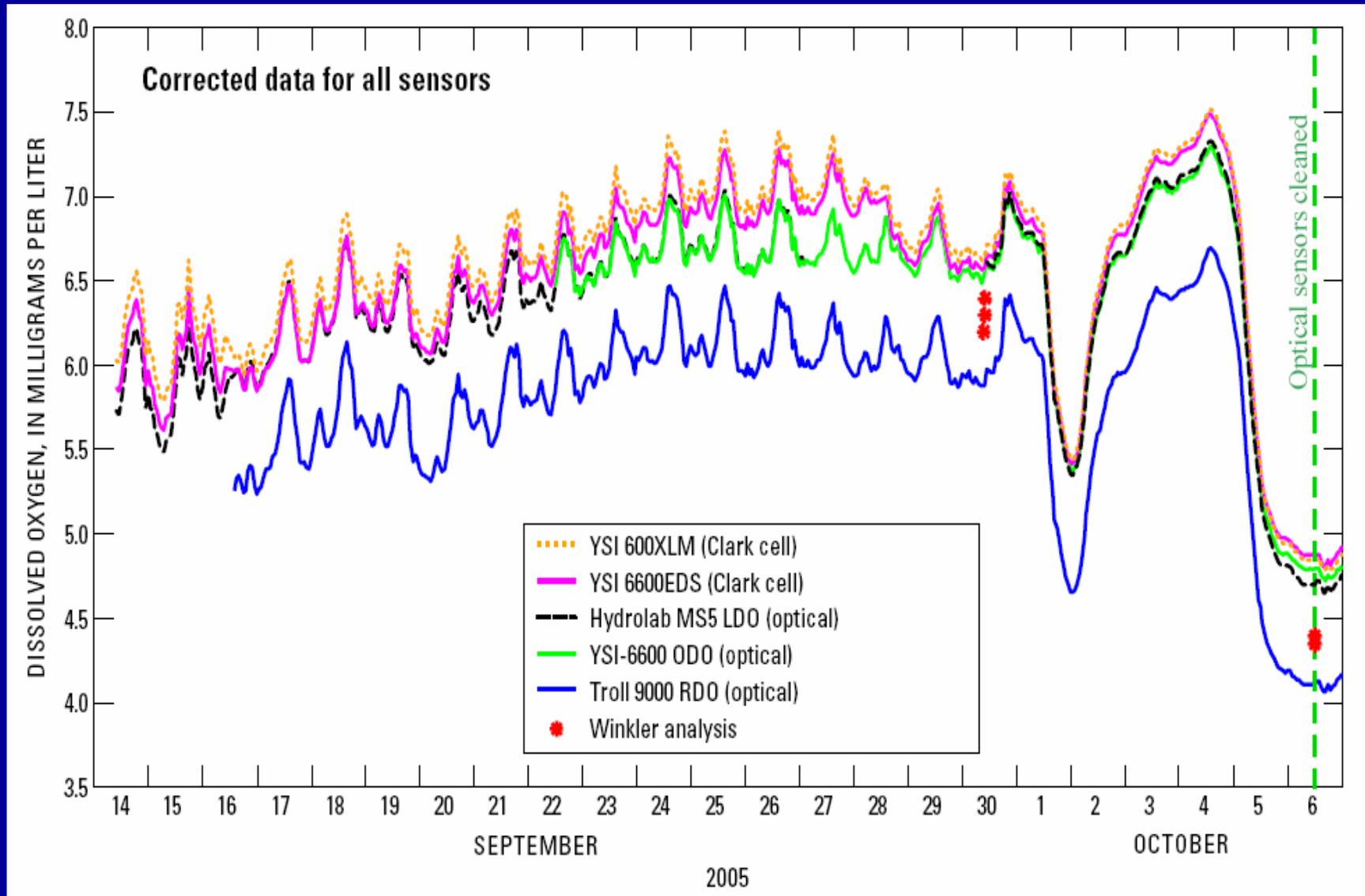
...d itself as the premier... and Oxygen technology,... es feature Hach LDO... tured, and supported by



- [Product Data](#)
- [FAQs](#)
- [User's Manual](#)
- [White Paper](#)
- [Literature](#)
- [Case Study](#)

...ate integration into any

# Clark cell/optical DO methods are similar, but not equal



# The murkiness of turbidity measurement

- **Operationally defined by method used and instrument configuration using nephelometry**
- **“an expression of the optical properties of a sample that causes light rays to be scattered and absorbed rather than transmitted in straight lines through a sample. (Turbidity of water is caused by the presence of suspended and dissolved matter such as clay, silt, finely divided organic matter, plankton, other microscopic organisms, organic acids, and dyes)”**

<http://water.usgs.gov/pubs/circ/2003/circ1250/>

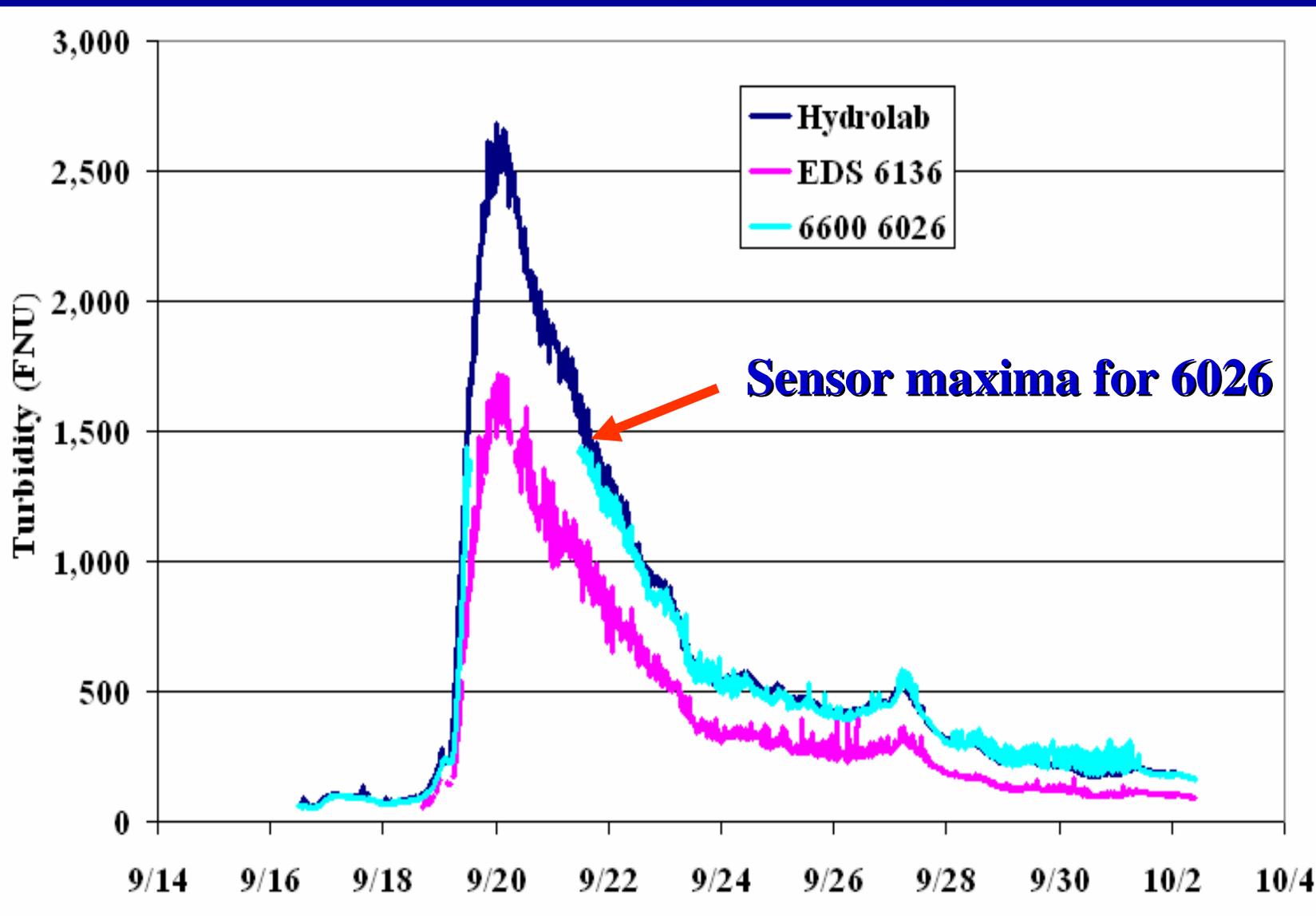
<http://water.usgs.gov/owq/FieldManual/Chapter6.7>

# Factors affecting turbidity

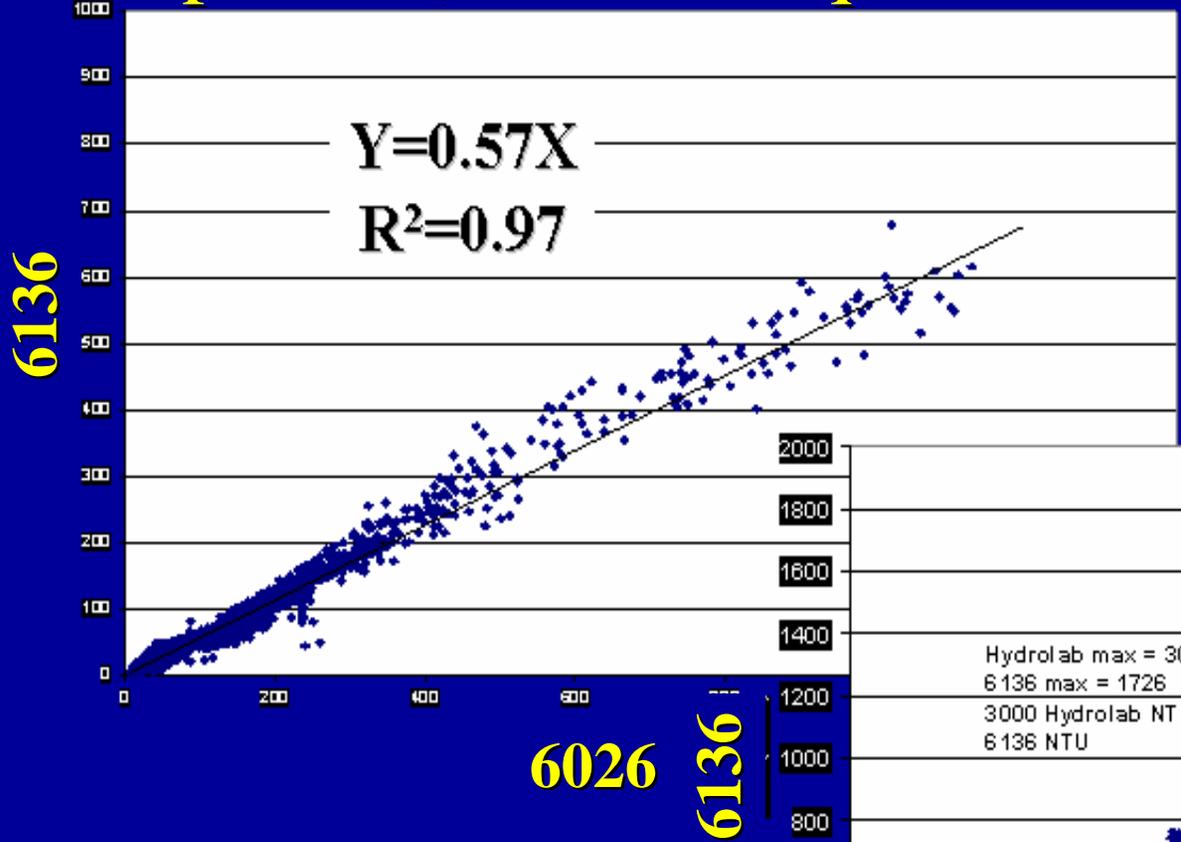
Properties of water matrix	Effect on Measurement	Direction of effect	Instrument designs to compensate
<u>Color</u>	Absorption of light beam	Negative (-)	<ul style="list-style-type: none"><li>•Near-IR</li><li>•Multiple detectors</li></ul>
<u>Particle Size:</u>			
<ul style="list-style-type: none"><li>•Large</li><li>•Small</li></ul>	$\lambda$ – Dependent	+ (Near IR) - (White)	<ul style="list-style-type: none"><li>•White Light</li><li>•Near IR</li></ul>
<u>Particle Density</u>	Increases forward & back scattering	Negative (-)	<ul style="list-style-type: none"><li>•Multiple Detectors</li><li>•Backscatter</li></ul>

# Are these 3 turbidities comparable/equivalent?

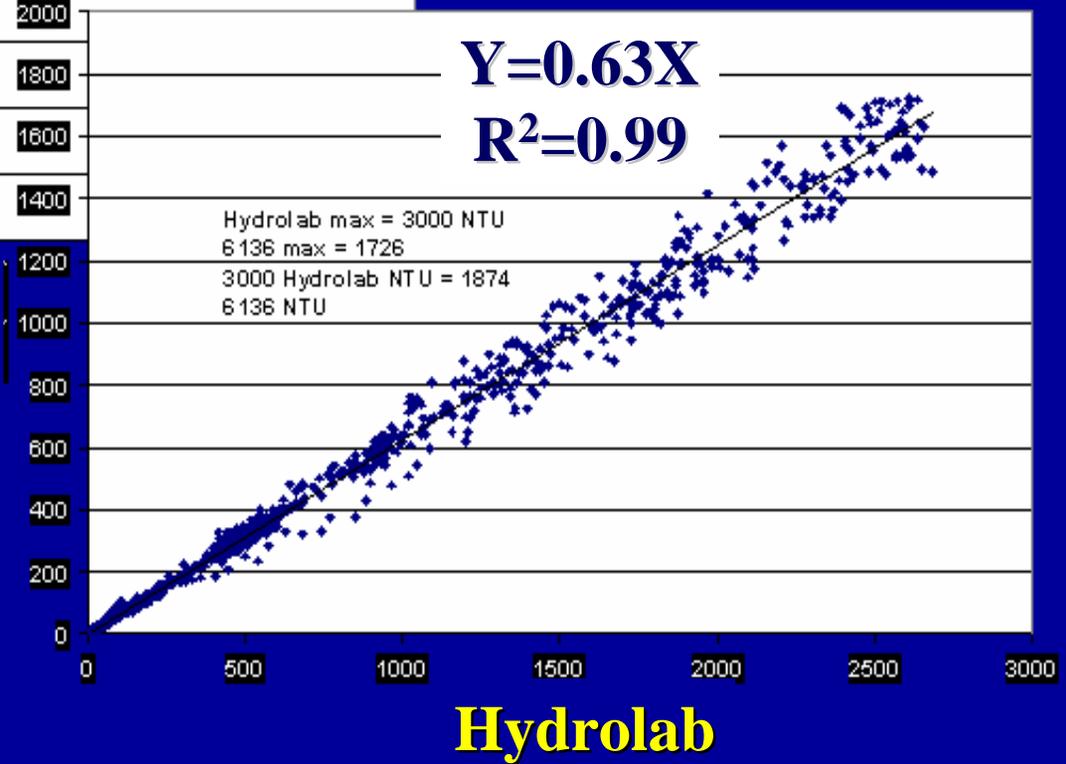
‘NTU’



# YSI 6026, 6136, and Hydrolab “3,000” turbidity are comparable, but not “equal”



Measurement method needs to be stored with data



# Data must be quality-assured

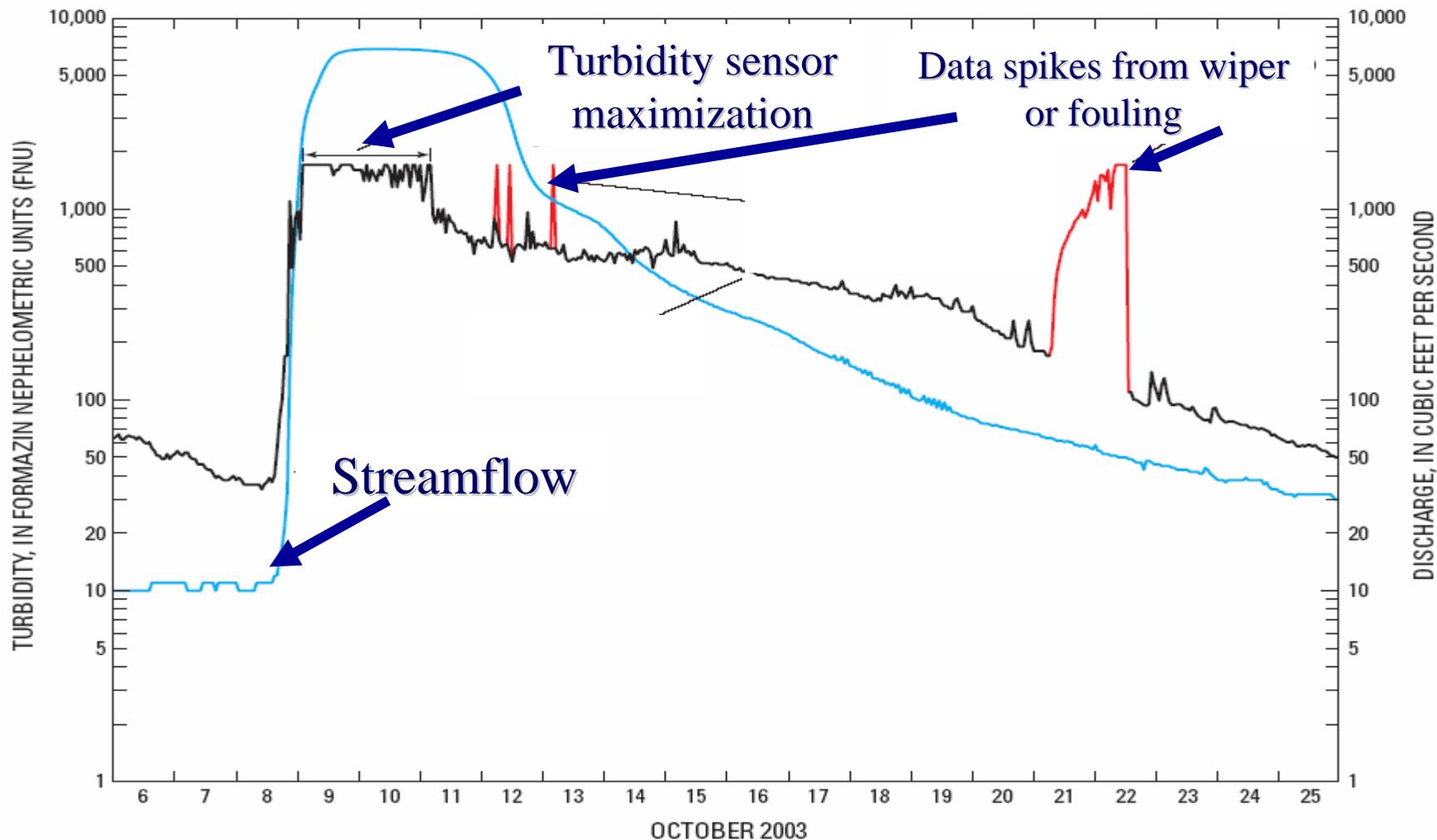
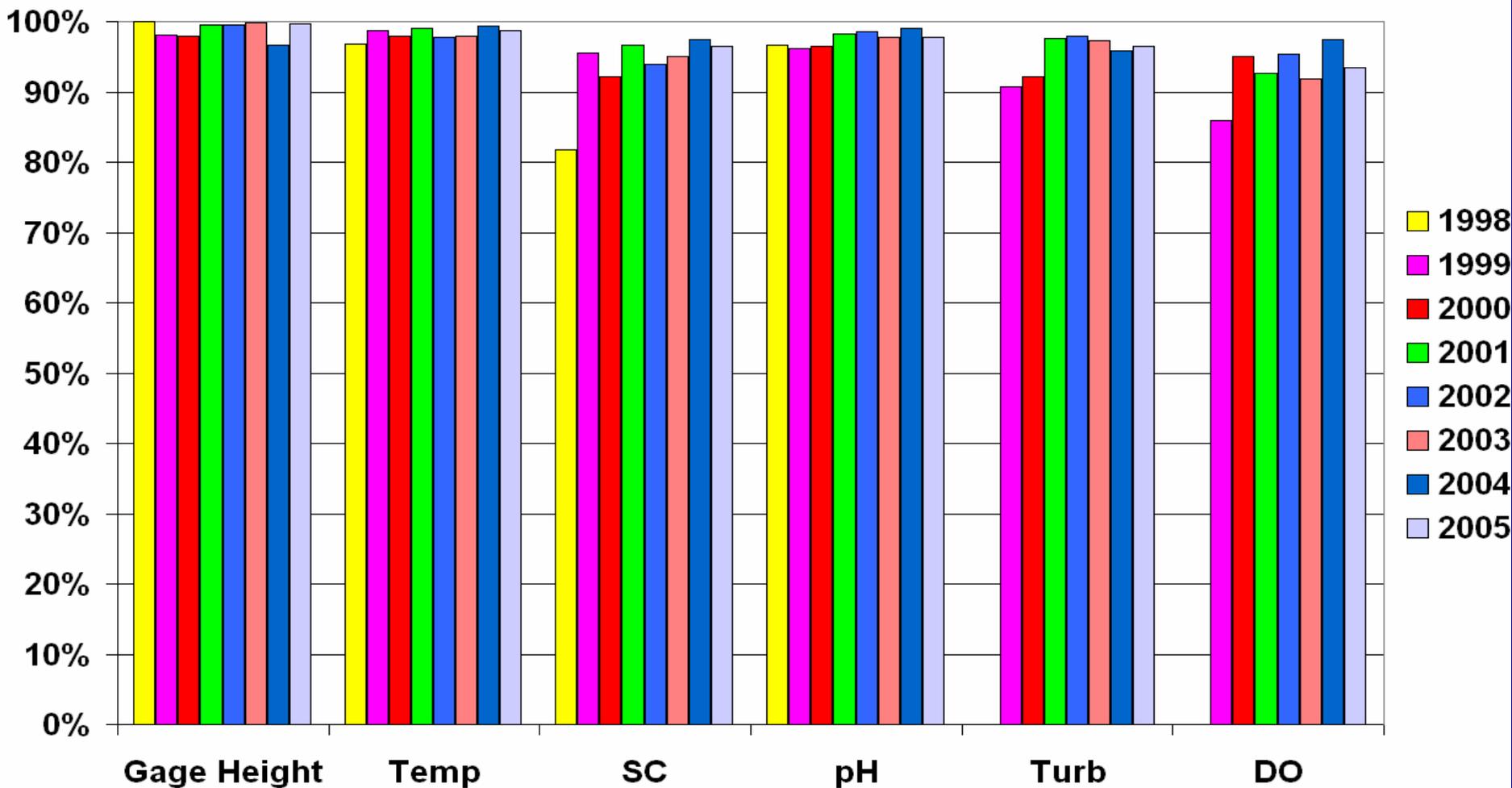


Figure 6. Turbidity values at the Little Arkansas River at Highway 50 near Halstead, Kansas, October 2003.

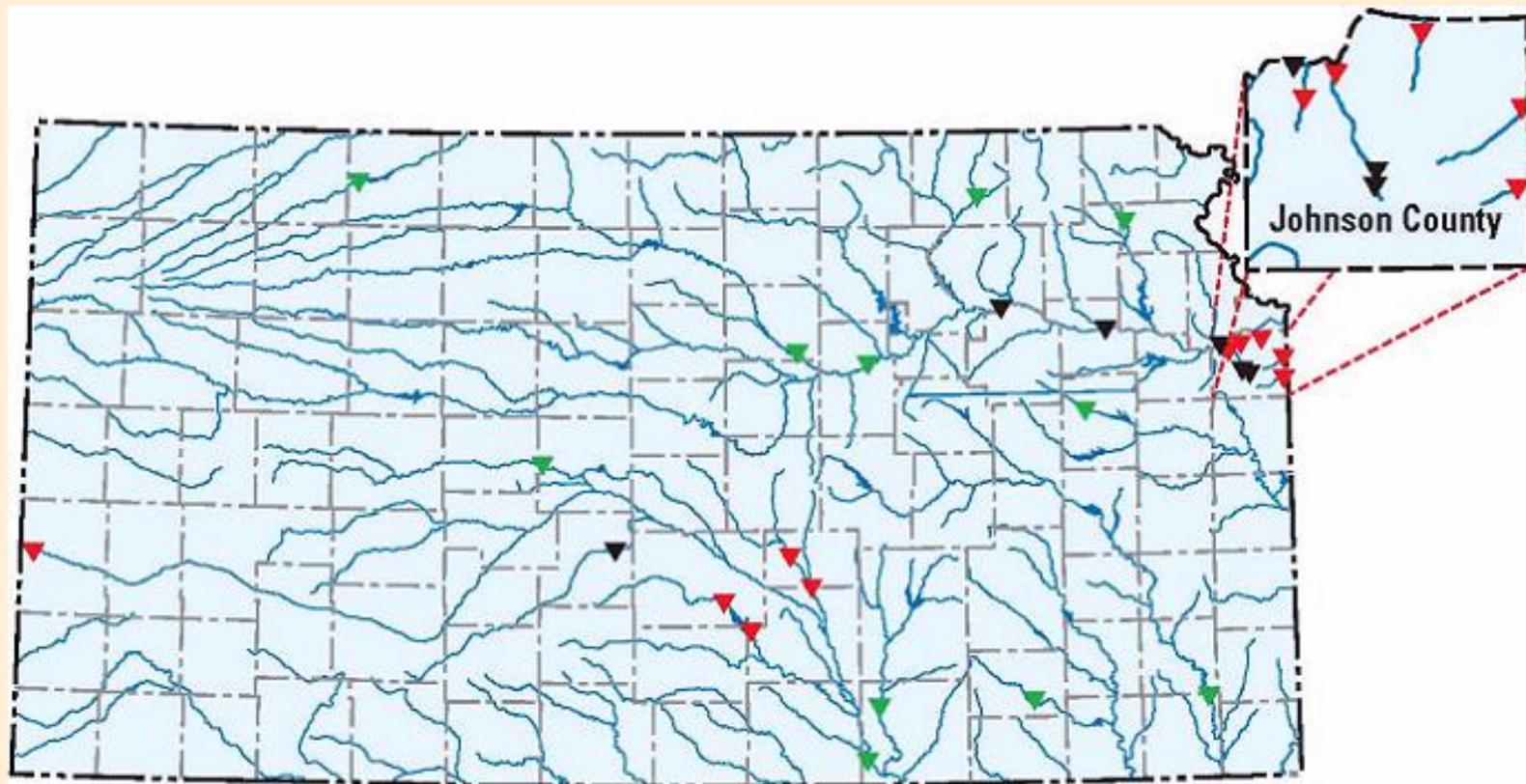
# Records 90+ percent complete

Little Arkansas River near Sedgwick, Kansas



[http:// ks.water.usgs.gov/Kansas/rtqw/](http://ks.water.usgs.gov/Kansas/rtqw/)

## Kansas Real-Time Water Quality

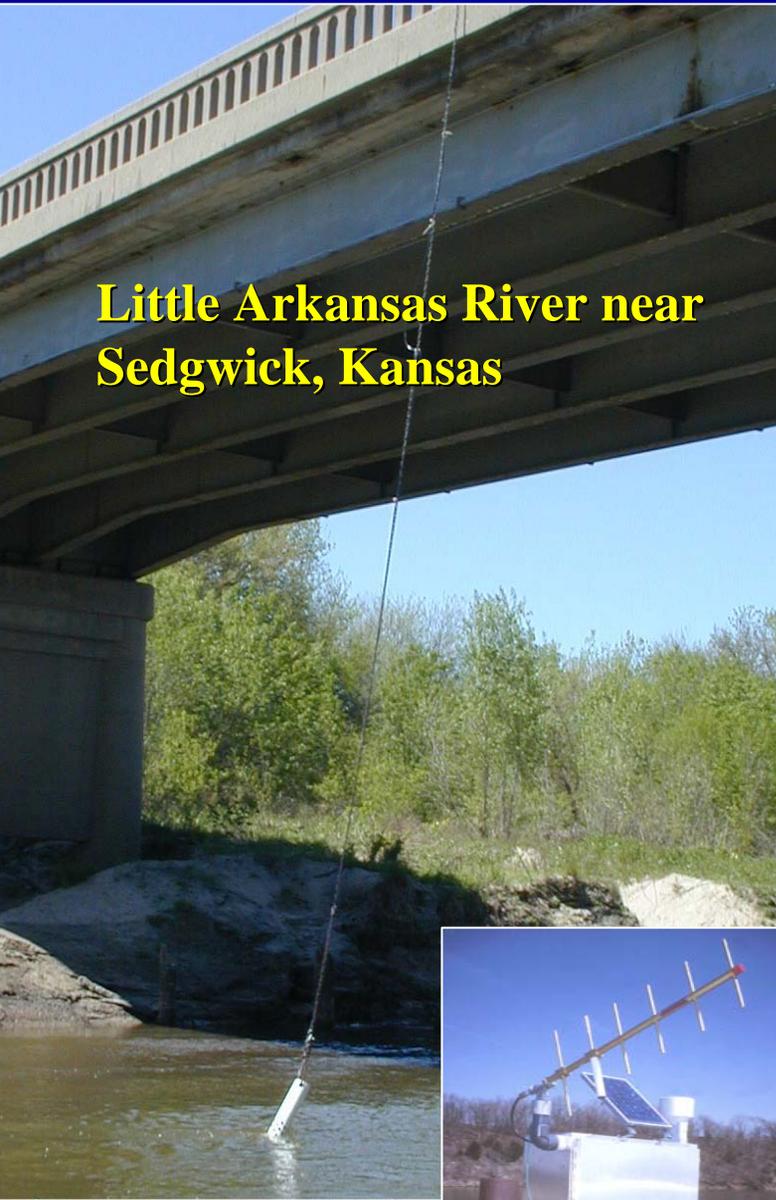


- ▼ Continuous water-quality gage
- ▼ Estimated sediment concentration and load only
- ▼ Discontinued continuous water-quality gage

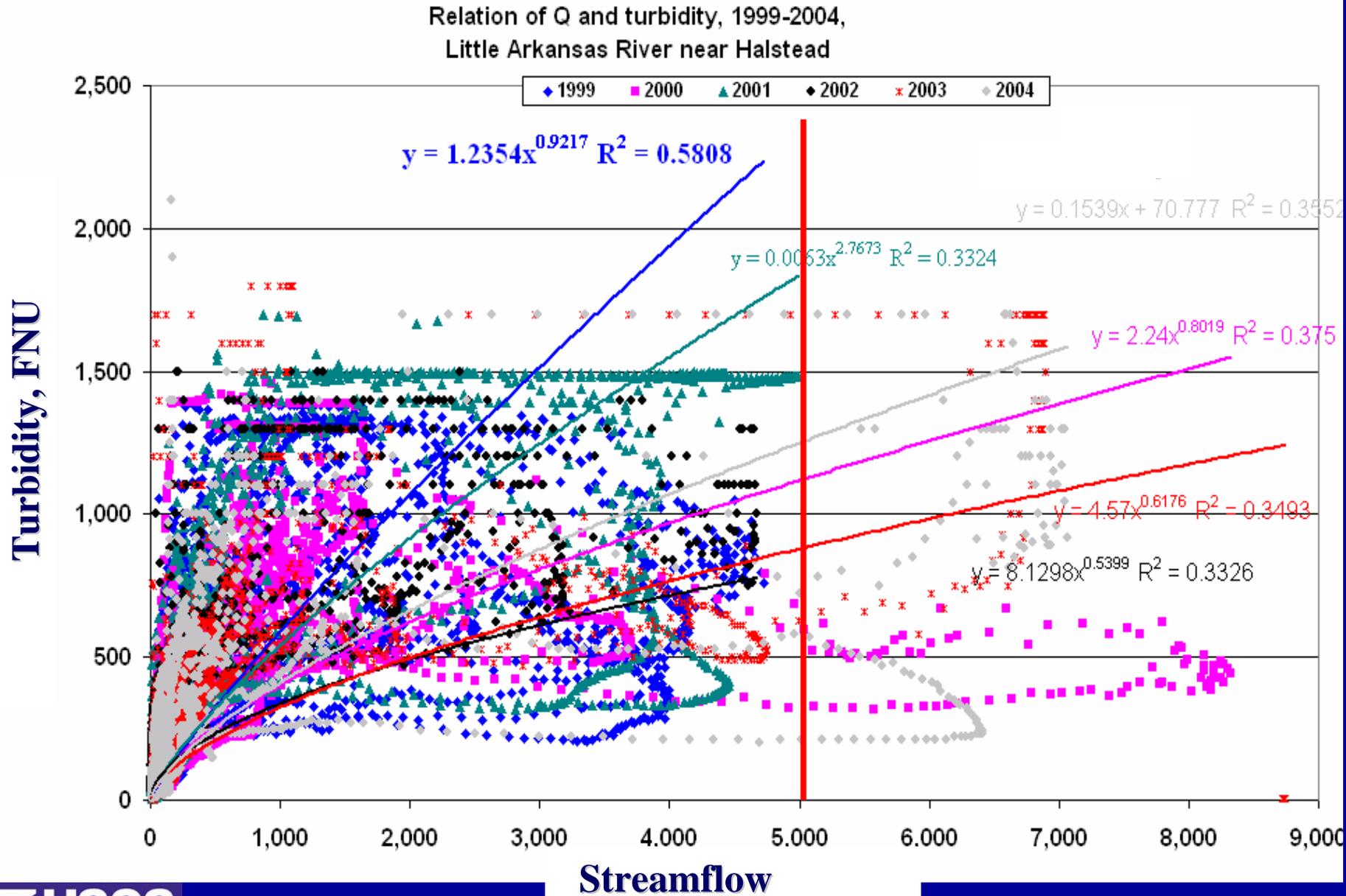
# Approach:

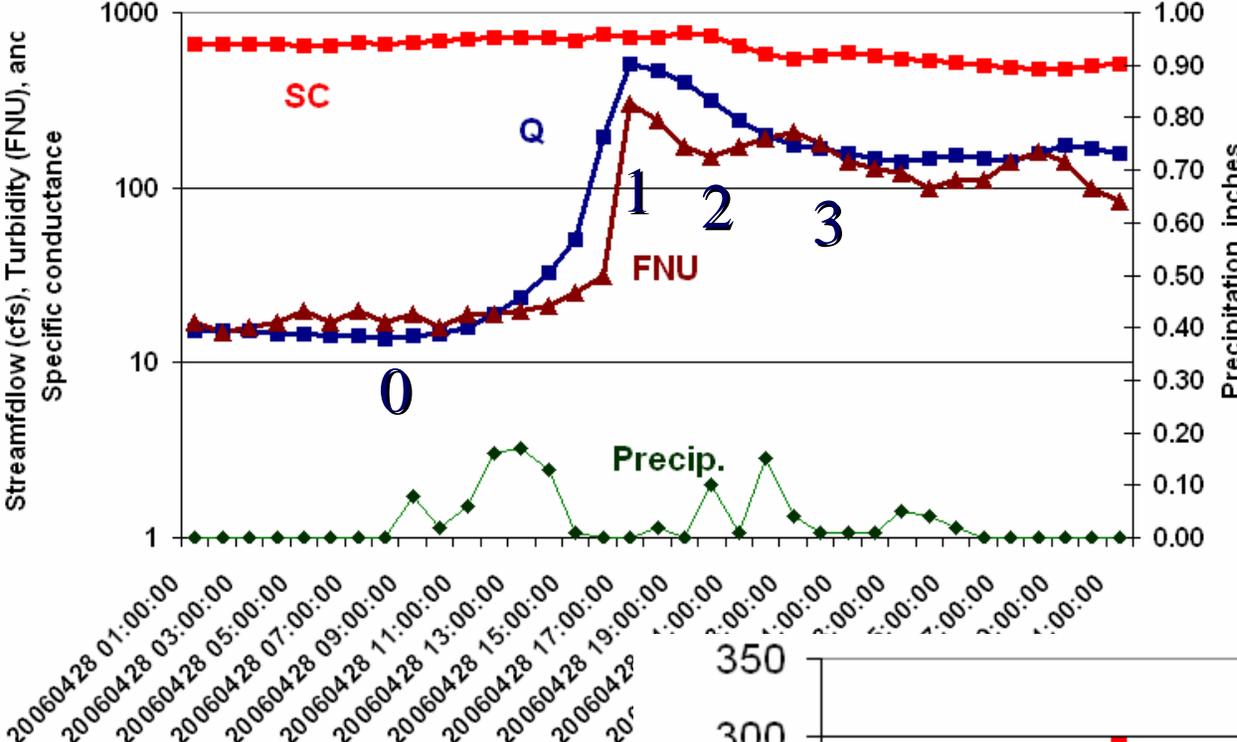
- Add water-quality monitors at streamgages and transmit data “real” time
- Collect water samples over the range of hydrologic and chemical conditions
- Develop site-specific regression models using samples and sensor values
- Estimate concentrations and loads
- Publish regression models
- Display estimates, uncertainty, and probability on the Web
- Continued sampling to verify

**Little Arkansas River near  
Sedgwick, Kansas**



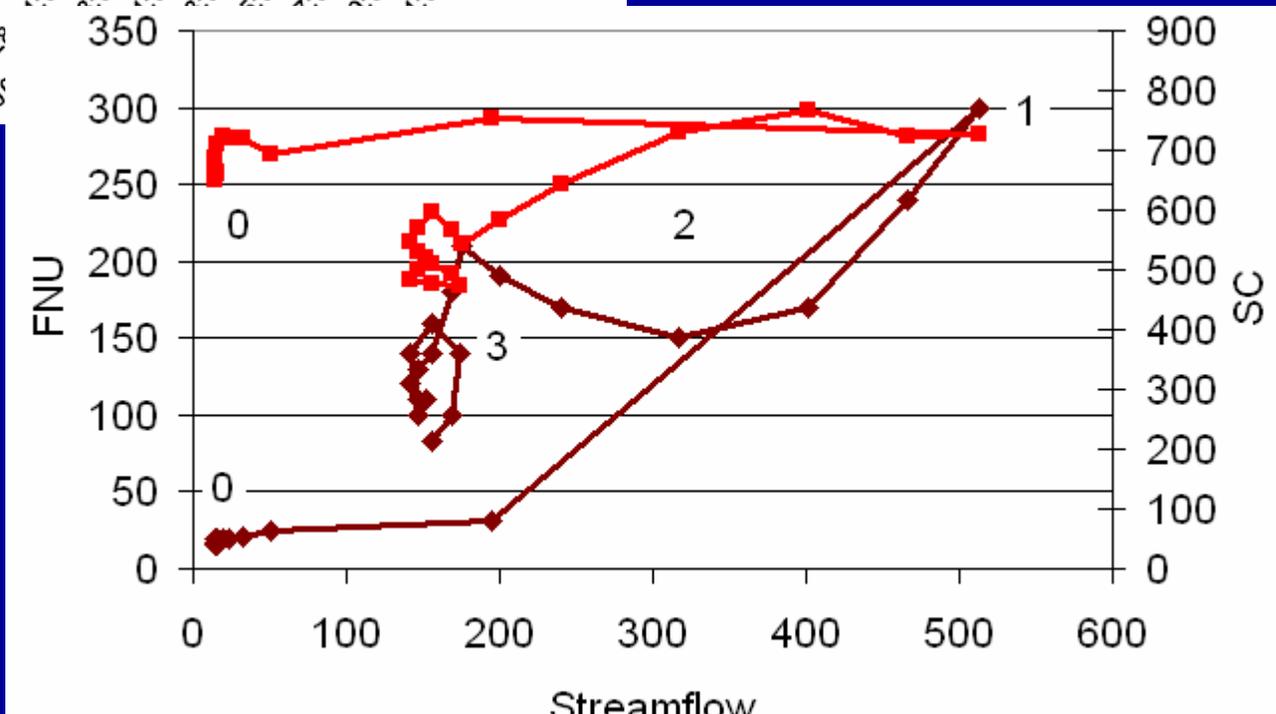
# Streamflow relation to water quality is complex and variable





**Continuous data is necessary to understand the water-quality response to streamflow**

- 0. Q inc. within 15 min.**
- 1. source limit reached**
- 2. new trib or bank collapse source**
- 3. response to precip and new trib**



Mill Creek April 28-29, 2006 hysteresis

# Continuous water-quality technology and estimates

- Real-time water quality is technology driven and must stay current
- Need to understand the measurement technology and limits
- Data storage can and must be differentiated
- New challenge is how to interpret the wealth of the time-dense data that challenges our assumptions

Next Up Data and QA, followed by statistical estimation approach

Any questions/comments/discussion/concerns?

# **Real-Time and Quality Assurance Aspects of Continuous Water-Quality Monitor Data**

**Trudy Bennett  
USGS Kansas Water Science Center**

**Water-Quality Monitoring Conference  
San Jose, CA  
May 9, 2006**

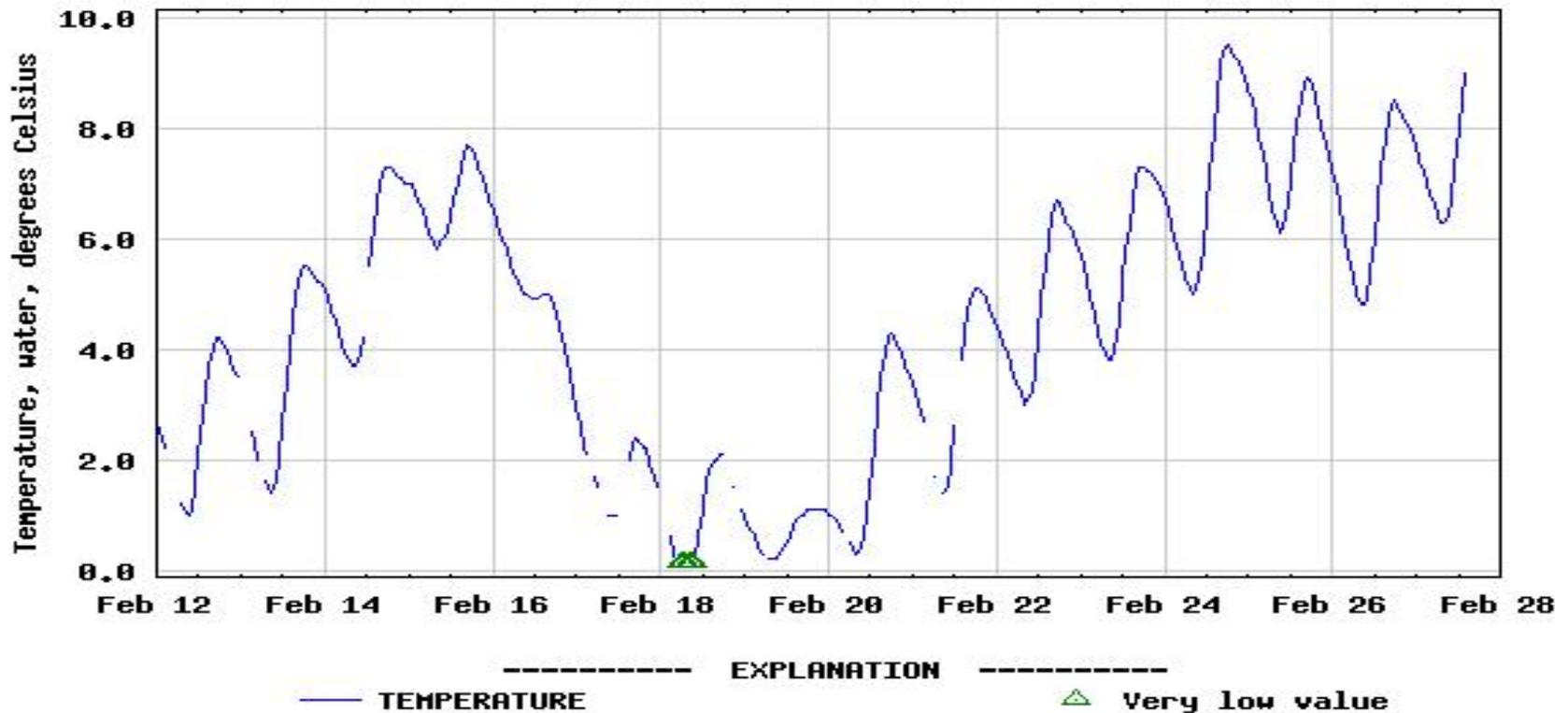
# Quality-assurance of real-time water-quality monitor data

- **GOAL is to optimize retained data of known quality**
  - **Identify transmission problems**
  - **Recognize erroneous data due to fouling or calibration drift**
  - **Recognize erroneous data due to sensor or monitor malfunction**

# Transmission Problems



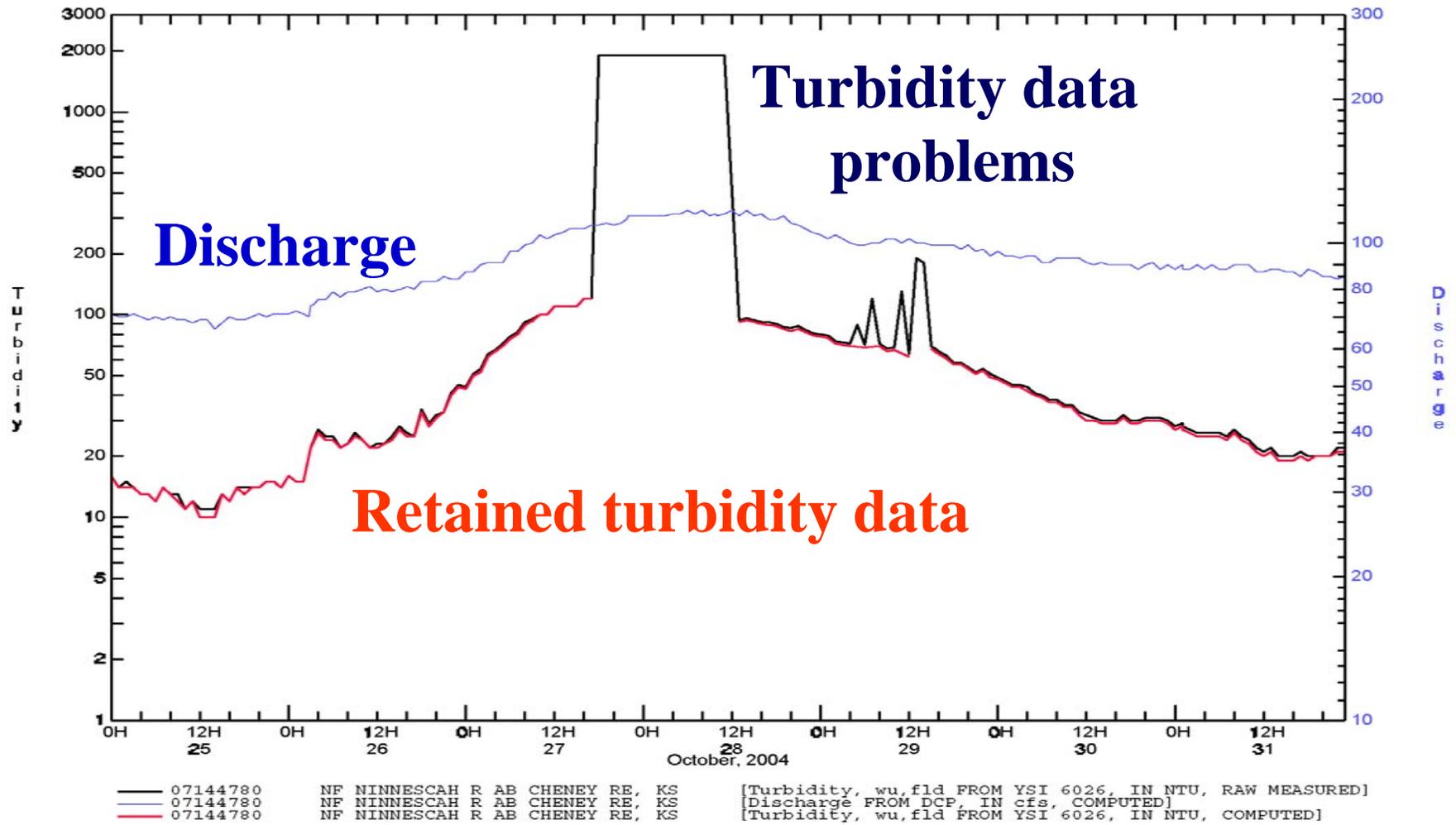
USGS 07144100 L ARKANSAS R NR SEDGWICK, KS



**Provisional Data Subject to Revision**



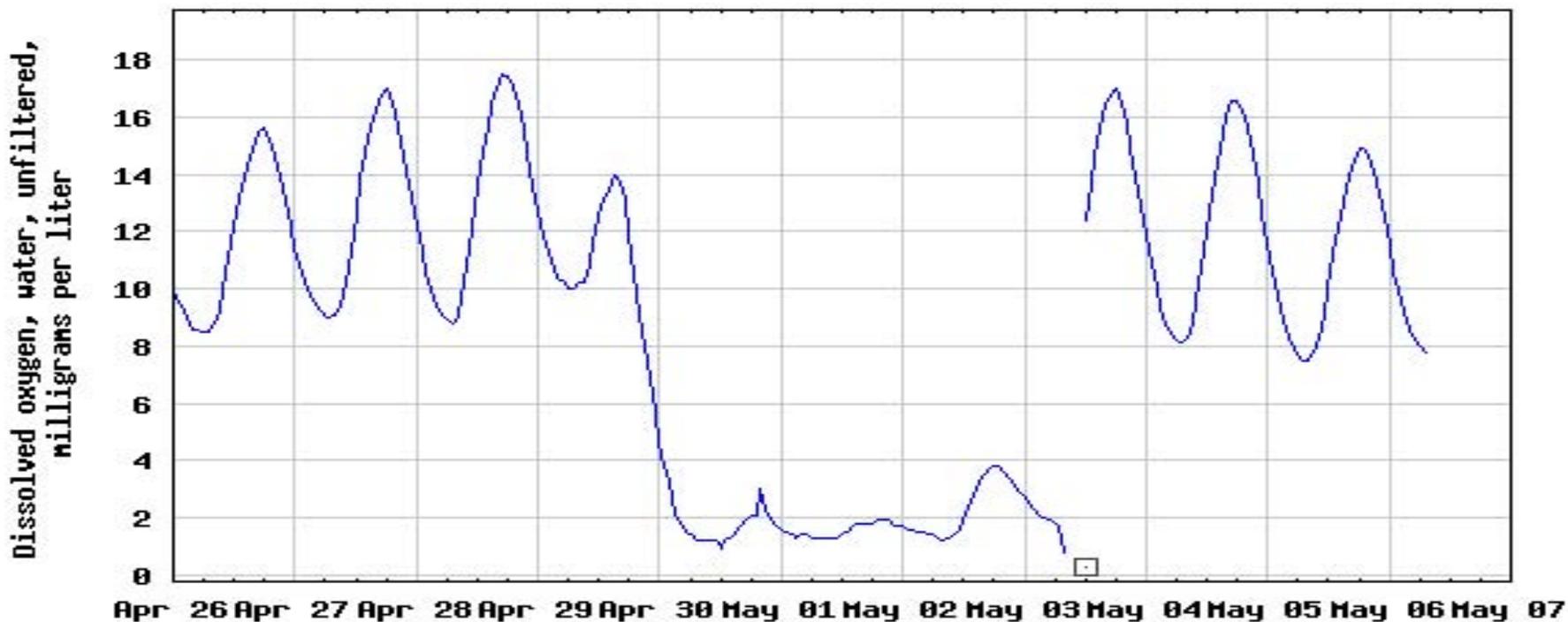
# Turbidity Sensor Buried in Sand



# DO Sensor Calibration Failure



USGS 07144100 L ARKANSAS R NR SEDGWICK, KS



----- EXPLANATION -----  
— DISSOLVED OXYGEN □ Exceeds test difference

**Provisional Data Subject to Revision**





# QA/QC of Web Data

- **GOAL is to Optimize Accuracy of Data Viewed on Web**
  - **Delete erroneous data**
  - **Resolve data problems**
  - **Apply corrections to update data for fouling and/or calibration drift**
  - **Update Web**

# **QA/QC Critical Steps of Transmitted Data**

- 1. Daily Office Review of Transmitted Data**
- 2. Field Work Protocols**
- 3. Record Working Process**

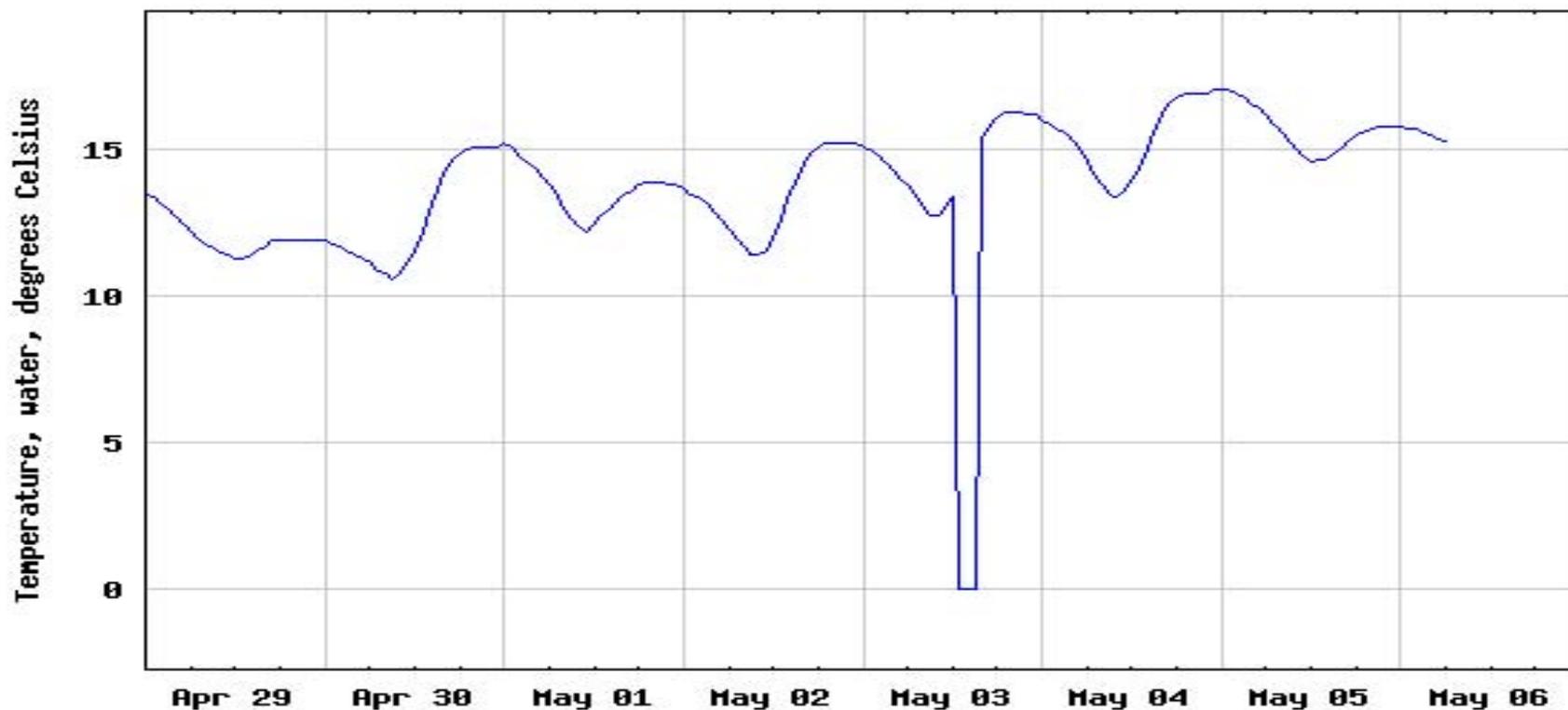
# Step 1. Daily Office Review

- 1. Daily Review of Transmitted Data**
- 2. Delete Erroneous Data**
- 3. Set Thresholds (recommended)**
- 4. Remove Site or Parameter from Web  
(last option)**

# Zero Values Caused when Monitor was Serviced



USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



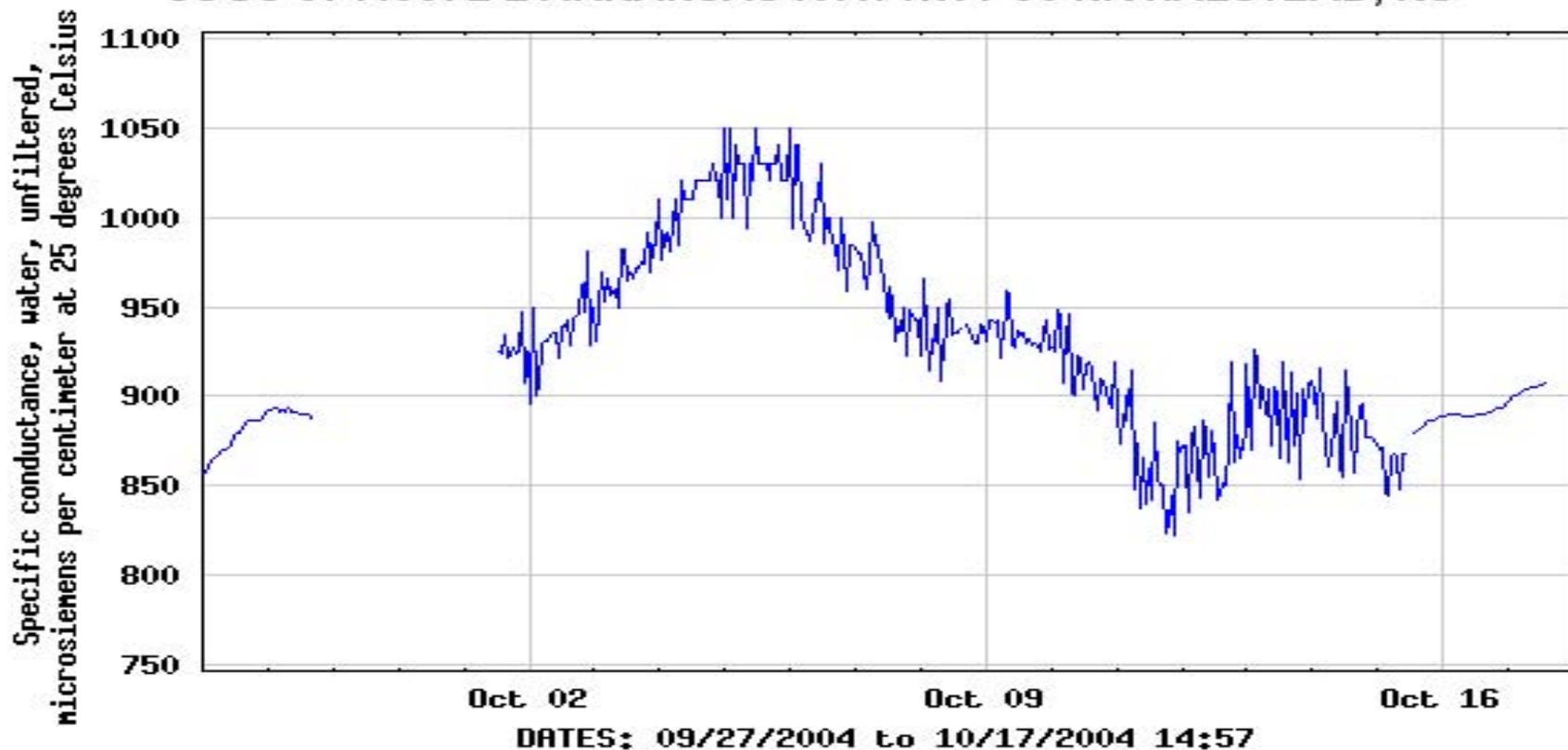
Provisional Data Subject to Revision



# Sensor Noise in Conductivity Sensor



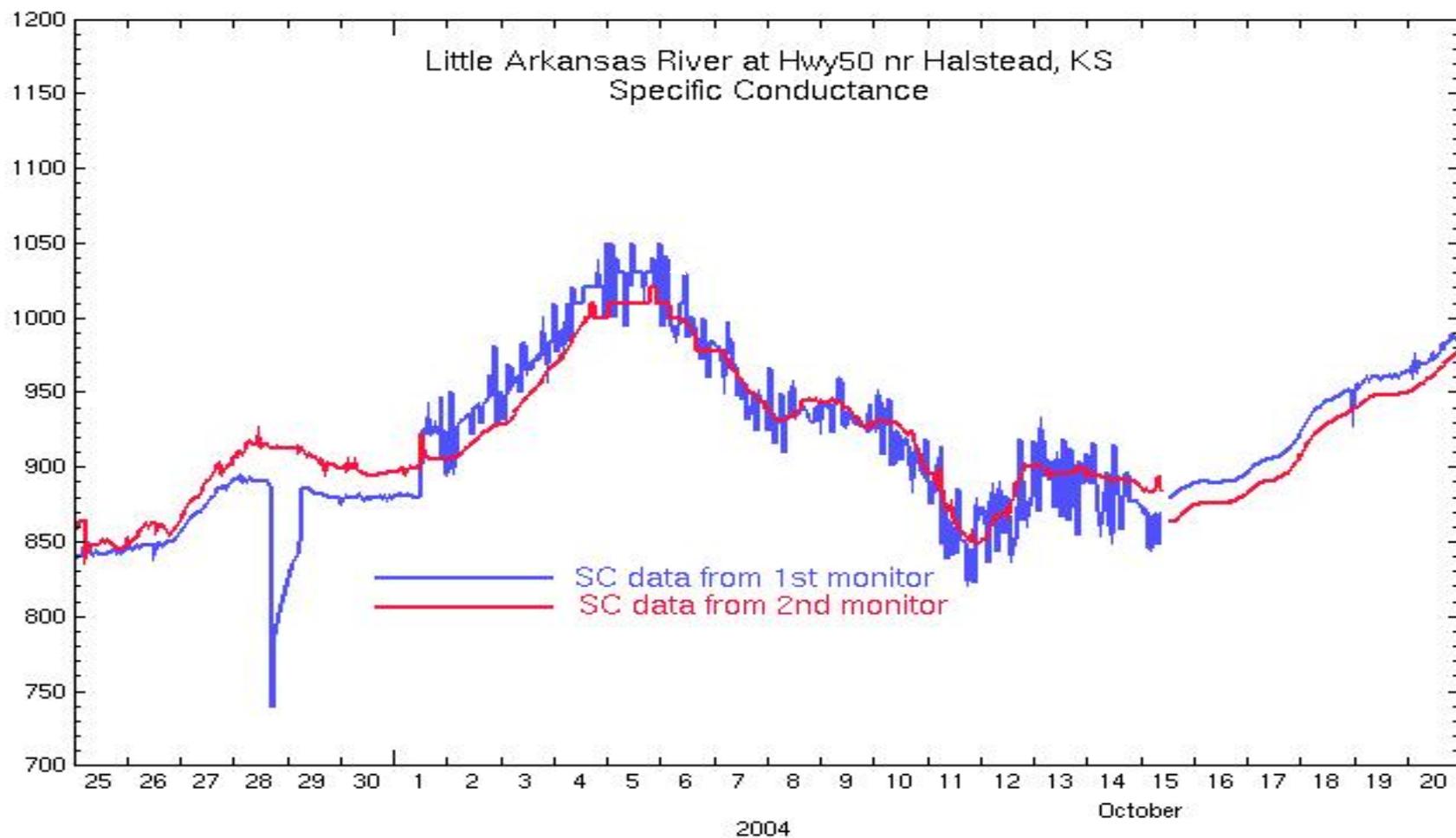
USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



**Provisional Data Subject to Revision**



# Sensor Noise (cont.)



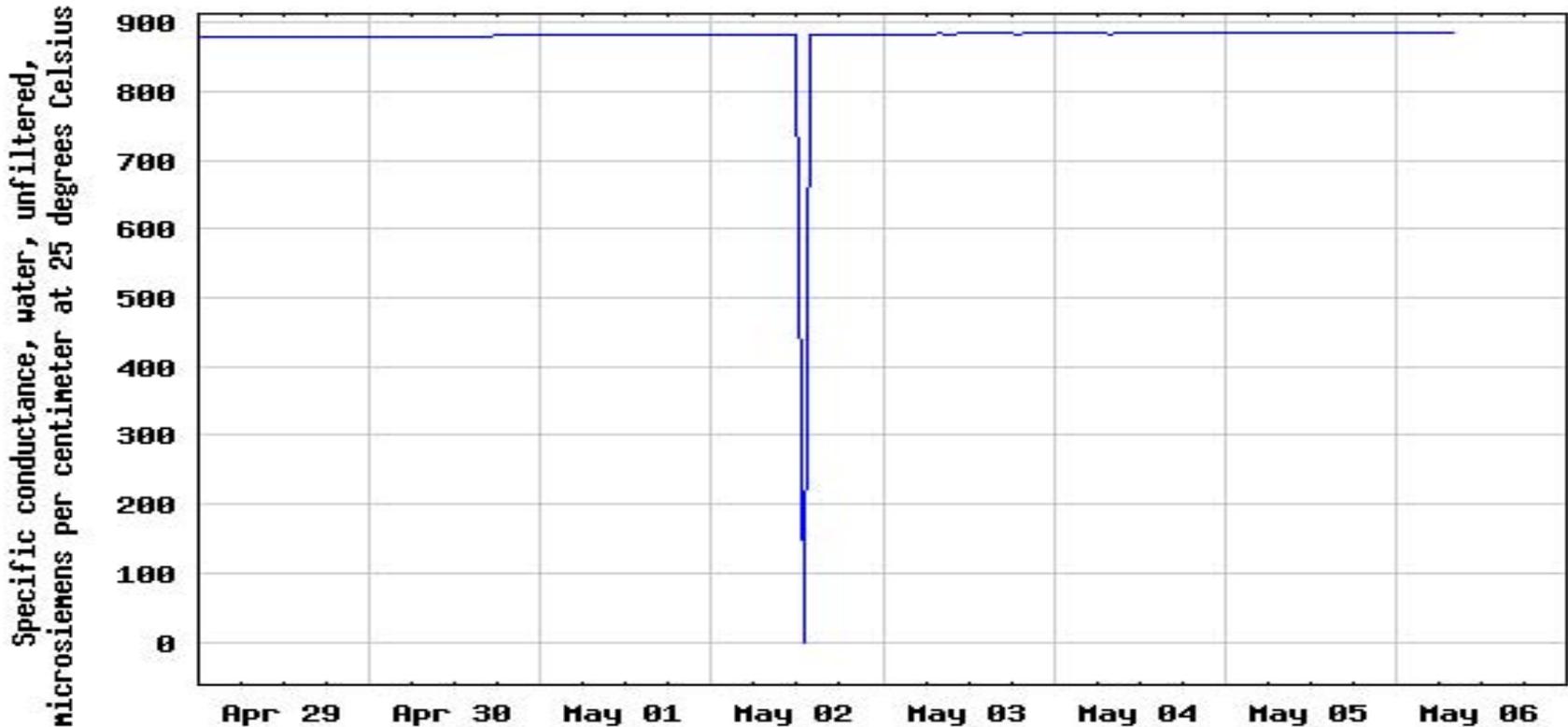
## **Step 1. Office Work (cont.)**

- 1. Daily Review of Transmitted Data**
- 2. Delete Erroneous Data**
- 3. Set Thresholds (recommended)**
- 4. Remove Site or Parameter from Web  
(last option)**

# Spike in Transmitted Data



USGS 07144790 CHENEY RE NR CHENEY, KS



Provisional Data Subject to Revision



## **Step 1. Office Work (cont.)**

- 1. Daily Review of Transmitted Data**
- 2. Delete Erroneous Data**
- 3. Set Thresholds (recommended)**
- 4. Remove Site or Parameter from Web  
(last option)**

# USGS Program for Setting Thresholds Limits

```
Terminal
Window Edit Options Help

PRIMARY PROCESSING DATA SCREENING AND VERIFICATION INFORMATION
Specific cond at 25C FROM DCP, in uS/cm @ 25C

VHI - Very High Condition (units) *          3000 LVH - Label: very high condition
HI  - High Condition (units)                 --- LHI - Label: high condition thre
LO  - Low Condition (units)                  --- LLO - Label: low condition thres
VLO - Very Low Condition (units) *          1   LVL - Label: very low condition
SD  - Value To Value Test Difference         300 LSD - Label: standard difference
* identifies thresholds that are used to screen data from the public for the WEB disy

BK  - Define zone breakpoints (units)
VI  - VERY RAPID INCREASE (UNITS/MINUTE) *   ---
RI  - RAPID INCREASE (UNITS/MINUTES)        ---
RD  - RAPID DECREASE (UNITS/MINUTES)        ---
VD  - VERY RAPID DECREASE (UNITS/MINUTE) *   ---

Enter code of field to change, or [CR] to continue:
```

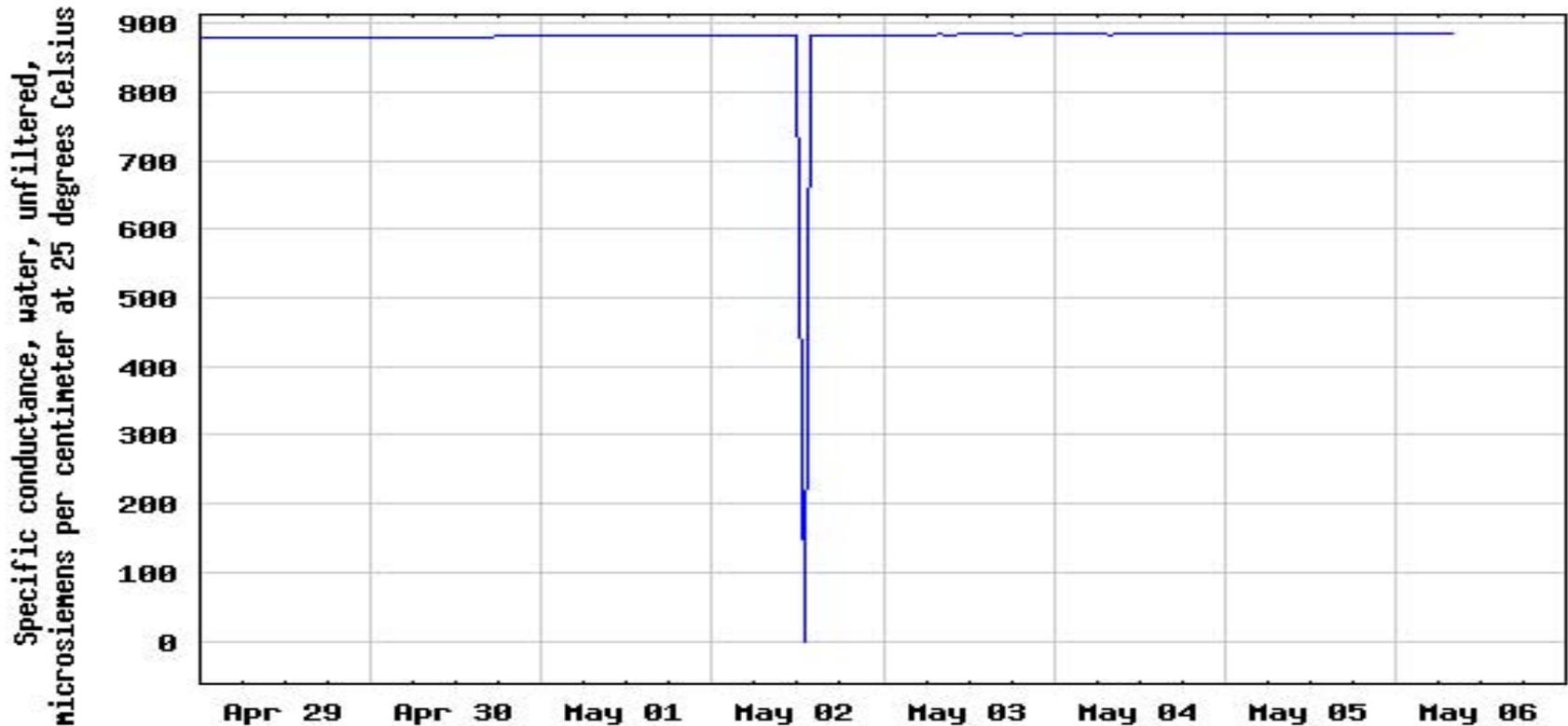
# Thresholds are Site Specific (example)

	<b>Max.</b>	<b>Min.</b>	<b>ROC</b>
• <b>Temperature</b>	<b>40.0</b>	<b>0.1</b>	<b>0.1</b>
• <b>SC</b>	<b>3000</b>	<b>0.1</b>	<b>15</b>
• <b>pH</b>	<b>10</b>	<b>0.1</b>	<b>0.1</b>
• <b>DO</b>	<b>30</b>	<b>0.1</b>	<b>0.1</b>
• <b>Turbidity</b>	<b>2500</b>	<b>0.1</b>	<b>15</b>

# Spike in Transmitted Data



USGS 07144790 CHENEY RE NR CHENEY, KS



Provisional Data Subject to Revision

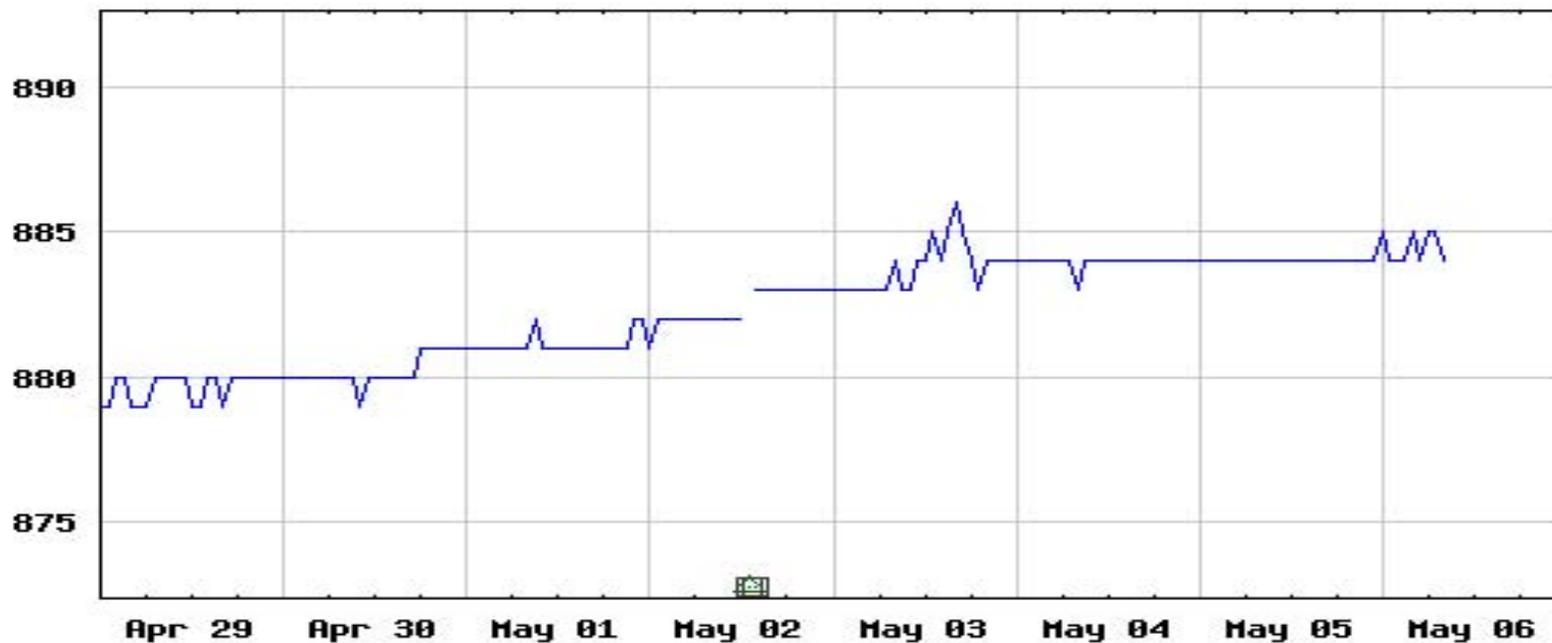


# Thresholds Effect on NWIS Web



USGS 07144790 CHENEY RE NR CHENEY, KS

Specific conductance, water, unfiltered,  
microsiemens per centimeter at 25 degrees Celsius



----- EXPLANATION -----  
— SPECIFIC CONDUCTANCE      □ Exceeds test difference  
△ Very low value

**Provisional Data Subject to Revision**



# Caution in Setting Thresholds Limits



USGS 07144790 CHENEY RE NR CHENEY, KS



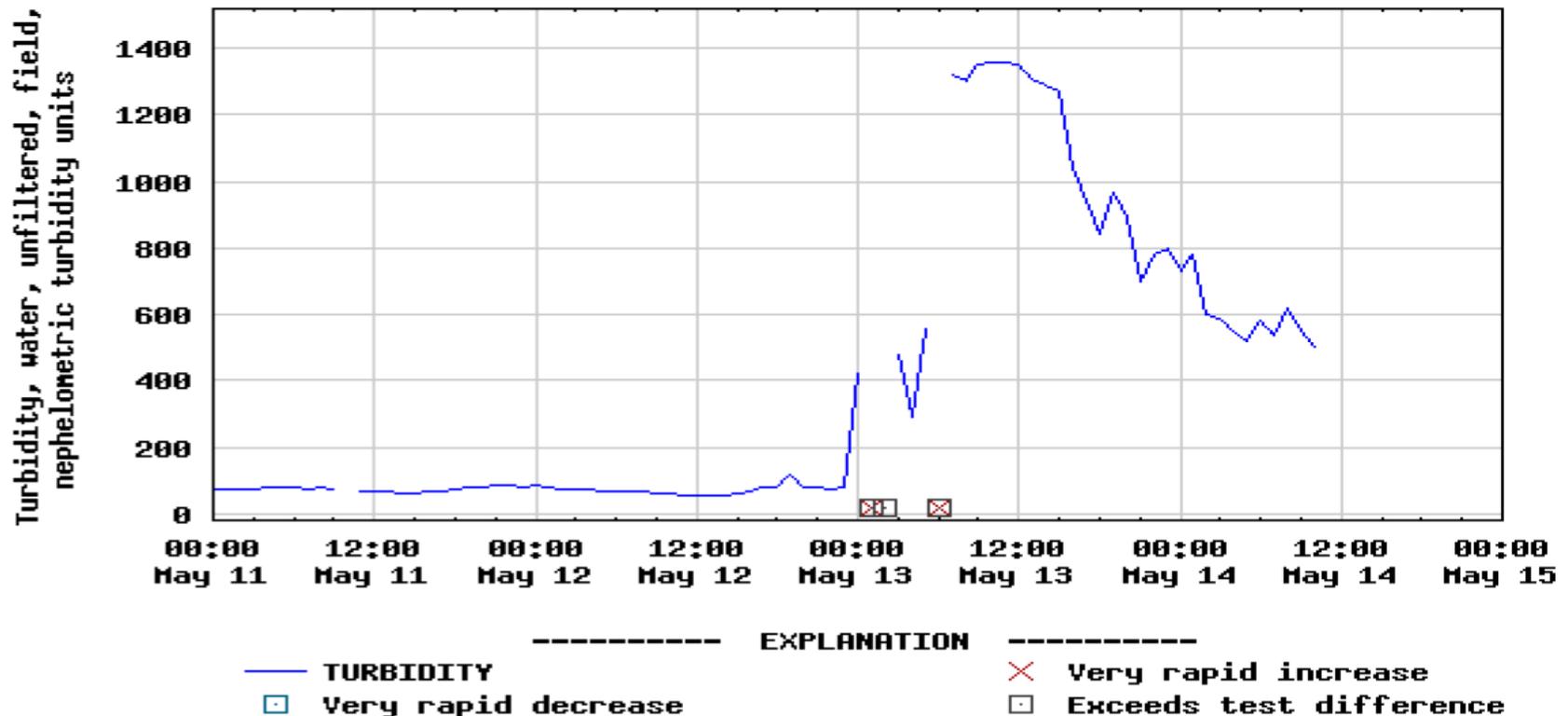
Provisional Data Subject to Revision



# Thresholds Settings May Need to be Adjusted



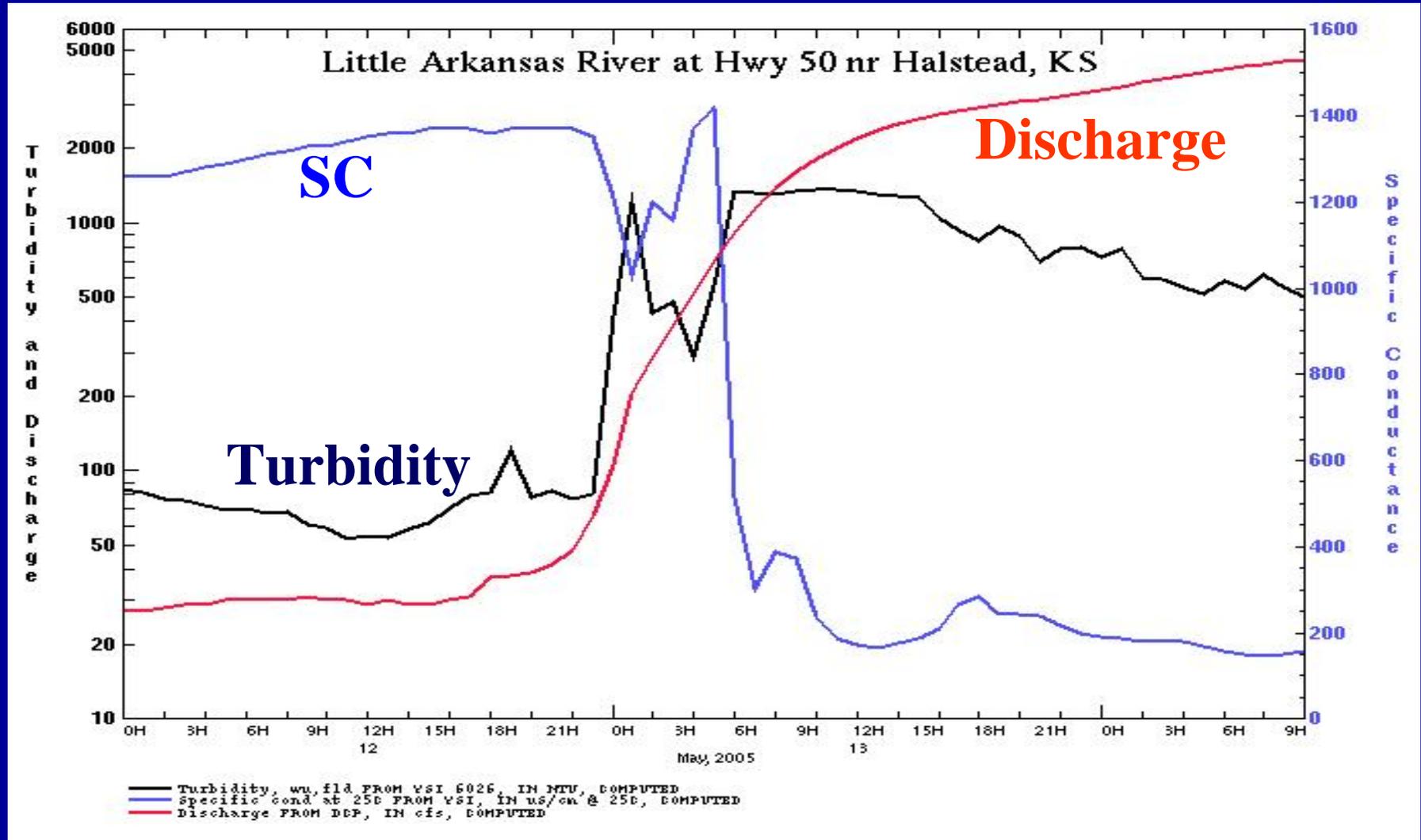
USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



Provisional Data Subject to Revision



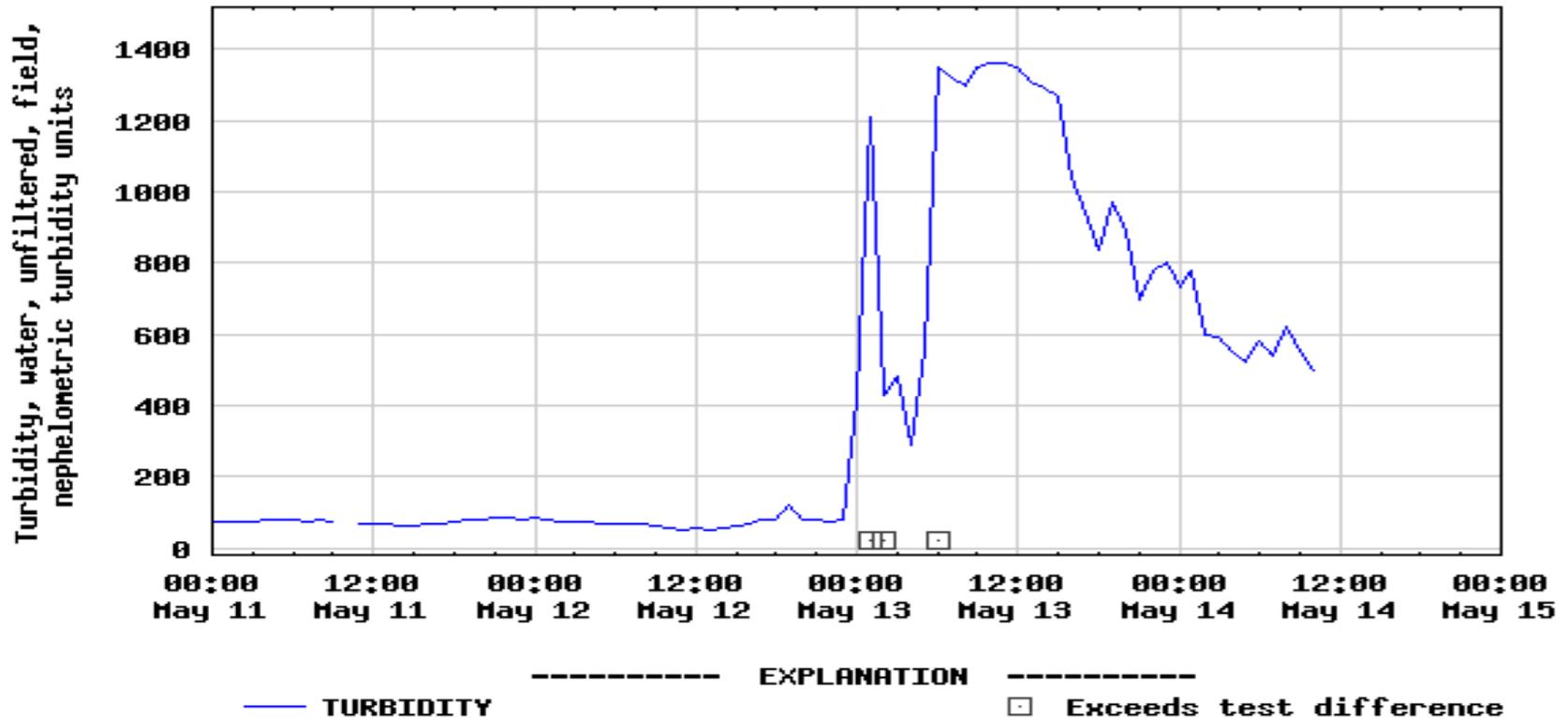
# Plot Data with Other Parameters



# NWIS Web after Resetting Thresholds



USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



Provisional Data Subject to Revision



# Step 1. Office Work (cont.)

1. Daily Review
2. Delete Invalid Data
3. Set Thresholds (recommended)
4. Temporarily Remove Site or Parameter from Web until problem is fixed (last option)

## **Step 2. Field Work Protocols**

### **Standard Protocols for Servicing a Monitor**

- 1. Before cleaning readings \*\*\***
- 2. After cleaning readings \*\*\***
- 3. Calibration checks**
- 4. Re-calibration if necessary**
- 5. Final readings \*\*\***
- 6. \*\*\* Obtain side-by-side readings from field monitor \*\*\***

## **Step 2. Field Work Protocols**

**Protocols were developed to**

**DEFINE**

**and**

**QUANTIFY**

**why data changed after servicing the  
water-quality monitor and to  
understand why changes occurred**

# Reasons for data to change

- 1. Cleaned the sensors**
- 2. Recalibration of sensors**
- 3. Normal environmental changes**

# Fouling on PVC Pipe



# Fouling on Monitor



# Fouling on Sensors



# Calibration Checks



# USGS Calibration Criteria for Recalibrating Sensors

Sensor	Variability of Sensors
Water Temperature	+/- 0.2 °C
Specific Conductance	greater of +/- 5 $\mu$ S/cm or +/- 3%
pH	+/- 0.2 pH unit
Dissolved Oxygen	+/- 0.3 mg/L
Turbidity	greater of +/- 0.5 turbidity units or +/- 5%

# Step 3. Record Working Process

1. **Delete Erroneous Data**
2. **Evaluate and Apply Correction for Fouling**
3. **Evaluate and Apply Correction for Calibration Drift**
4. **Update Web**

# NWIS Web Before Applying any Correction



USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



Provisional Data Subject to Revision



# Fouling Corrections

1. Determined by steps 1 and 2 of field work protocols.
2. After cleaning (AC) – Before cleaning (BC).
3. Subtract for environmental changes.
4.  $(AC-BC)_{\text{continuous monitor}} - (AC-BC)_{\text{field monitor}}$
5. % value:  $[(AC-BC)_{\text{continuous monitor}} - (AC-BC)_{\text{field monitor}}] / BC_{\text{continuous monitor}}$

# Computed SC Fouling Correction using developed spreadsheets

Date	Time arrived	Time left	Fouling Correction				Computed Fouling Correction (%)	Applied Fouling Correction	
			Site Monitor Dirty	Site Monitor Clean	Field Probe Before	Field Probe After		Input	Corr.
5/3/05	1300	1515	1326	1376	1368	1368	3.77	100	4
								2000	75

$$[(1376 - 1326) - (1368 - 1368)] / 1326 = 3.77\%$$

# Fouling Correction Applied in ADAPS

```
Terminal
Window Edit Options Help

1
USGS 07143672      L ARKANSAS R AT HWY 50 NR HALSTEAD, KSR YEAR:
Specific cond at 25C FROM DCP, IN uS/cm @ 25C      2005
      DATES VALID FROM: 10/01/2004 00:00 TO 09/30/2005 23:59
Enter one of the commands from the menu
START DATE TIME DATUM  INPUT      CORR      INPUT      CORR      INPUT      CORR
END   DATE TIME DATUM  COMMENT
PRV:2004/08/06 1100 CDT          100      0.0      2000      0.0
-----
4:2005/03/29 1040 CST          100      0.0      1000      0.0  _____
  /___/___
5:2005/04/27 0900 CDT          100      0.0      2000      0.0  _____
  /___/___
6:2005/05/03 1200 CDT          100      4        2000      76   _____
  /___/___
-----
NXT: None
"Q"= enter menu      "E"= exit program  "A"= add to end of list
"F"= forward 1 page  "M"= down 1 line   "D"= delete line   "C"= change line
"B"= backward 1 page "U"= up 1 line     "I"= insert line   "S"= save and quit
```

# NWIS Web After Applying a +3.8% Fouling Correction



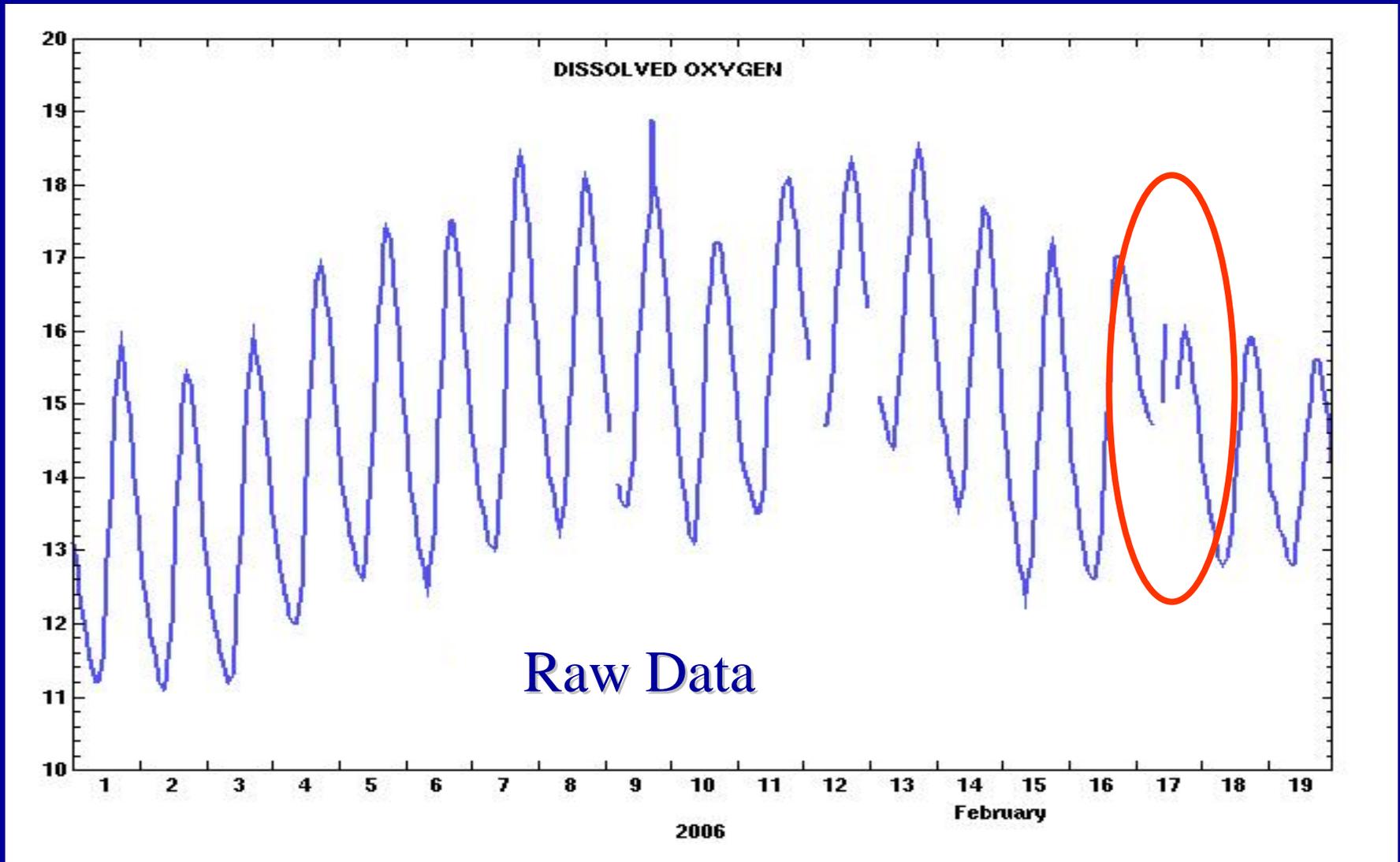
USGS 07143672 L ARKANSAS R AT HWY 50 NR HALSTEAD, KS



Provisional Data Subject to Revision



# DO Data Before Applying any Correction



# Calibration Drift Corrections

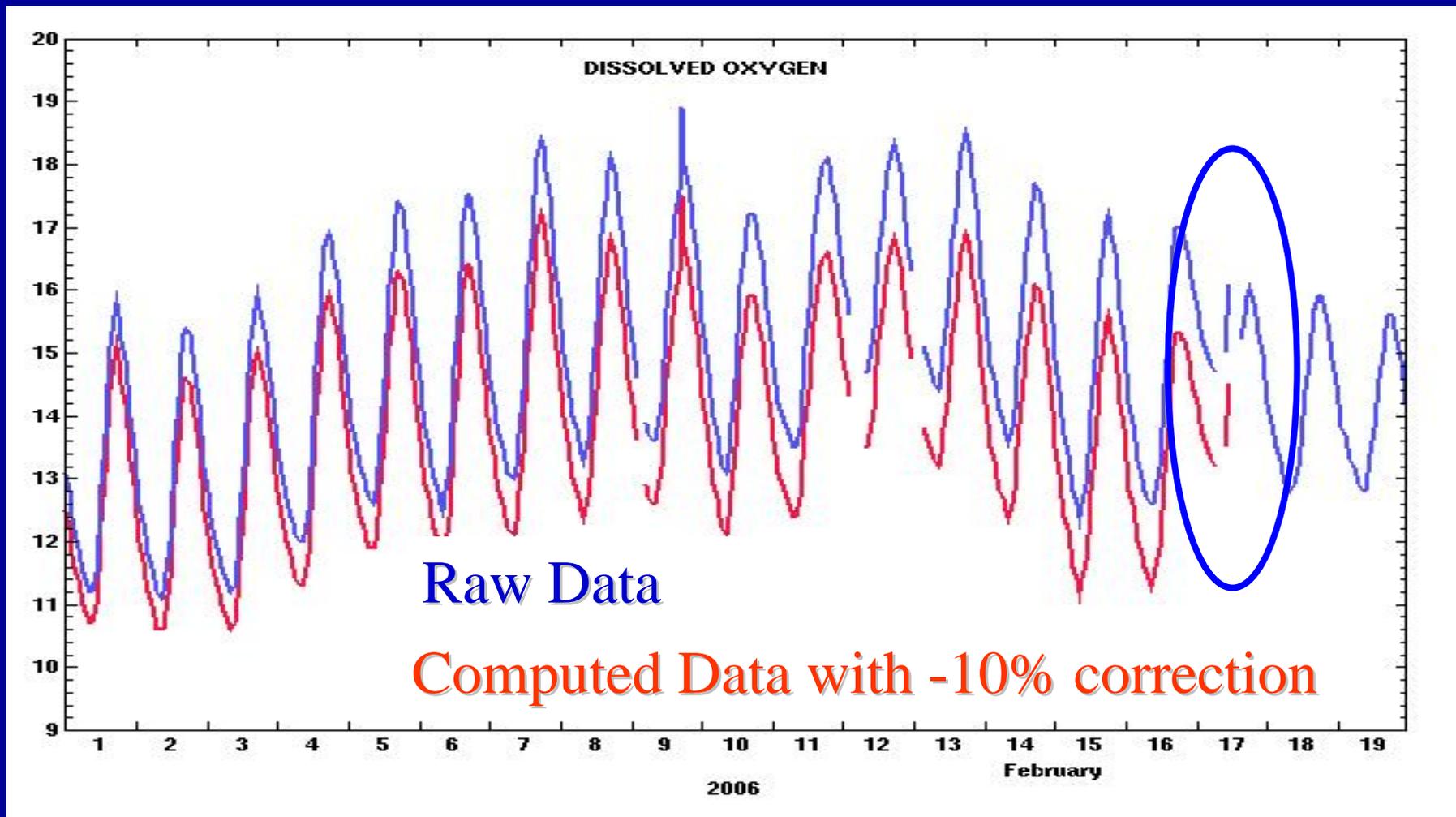
1. **Determined by step 3 of field work protocols.**
2. **Standard value – Sensor reading in std.**
3. **% value:  $[(\text{Std} - \text{Reading}) / \text{Reading}]$ .**

# Computed DO Drift Correction using developed spreadsheets

Date	Time arrived	Time left	Calibration Check			Computed Drift Correction			Applied Drift Correction	
			100% Air Saturation			Reading	Corr.	% Drift	Input	Corr.
			Reading	Chart DO	Adjusted					
2/17/06	1100	1410	10.00	9.00		100%	-1.00	-10.00	2.00	-0.20
			Sensor recalibration						20.00	-2.00
				10.35	10.40					

$$[(9.00 - 10.00) / 10.00] = -10\%$$

# DO Data After Applying a -10% Drift Correction



# USGS Maximum Allowable Limits for Reporting Data

Parameter	Maximum Limit
Water Temperature	+/- 2.0 °C
Specific Conductance	+/- 30% $\mu\text{S}/\text{cm}$
pH	+/- 2.0 pH unit
Dissolved Oxygen	Greater of +/- 2.0 mg/L or +/- 20%
Turbidity	Greater of 3.0 turbidity units or +/- 30%

# Summary of QA/QC of Real-Time Water-Quality Monitor Records

1. **Daily Review of Transmitted Data**
2. **Delete Erroneous Data**
3. **Follow Standard Protocols for Servicing the Monitor**
4. **Apply Corrections to Update Data**
5. **Update Data on Web (if transmitting)**

# For Additional Information

## Contact:

**Trudy Bennett, [trudyben@usgs.gov](mailto:trudyben@usgs.gov)**

**Phone 316-773-3225**

## Publications:

**<http://pubs.usgs.gov/tm1D3/>**

**<http://ks.water.usgs.gov>**

**<http://waterdata.usgs/ks/nwis/current>**

**<http://ks.water.usgs.gov/Kansas/rtqw>**

# **Statistical Approaches and Data Applications for Continuous Water-Quality Information**

**Teresa Rasmussen,**

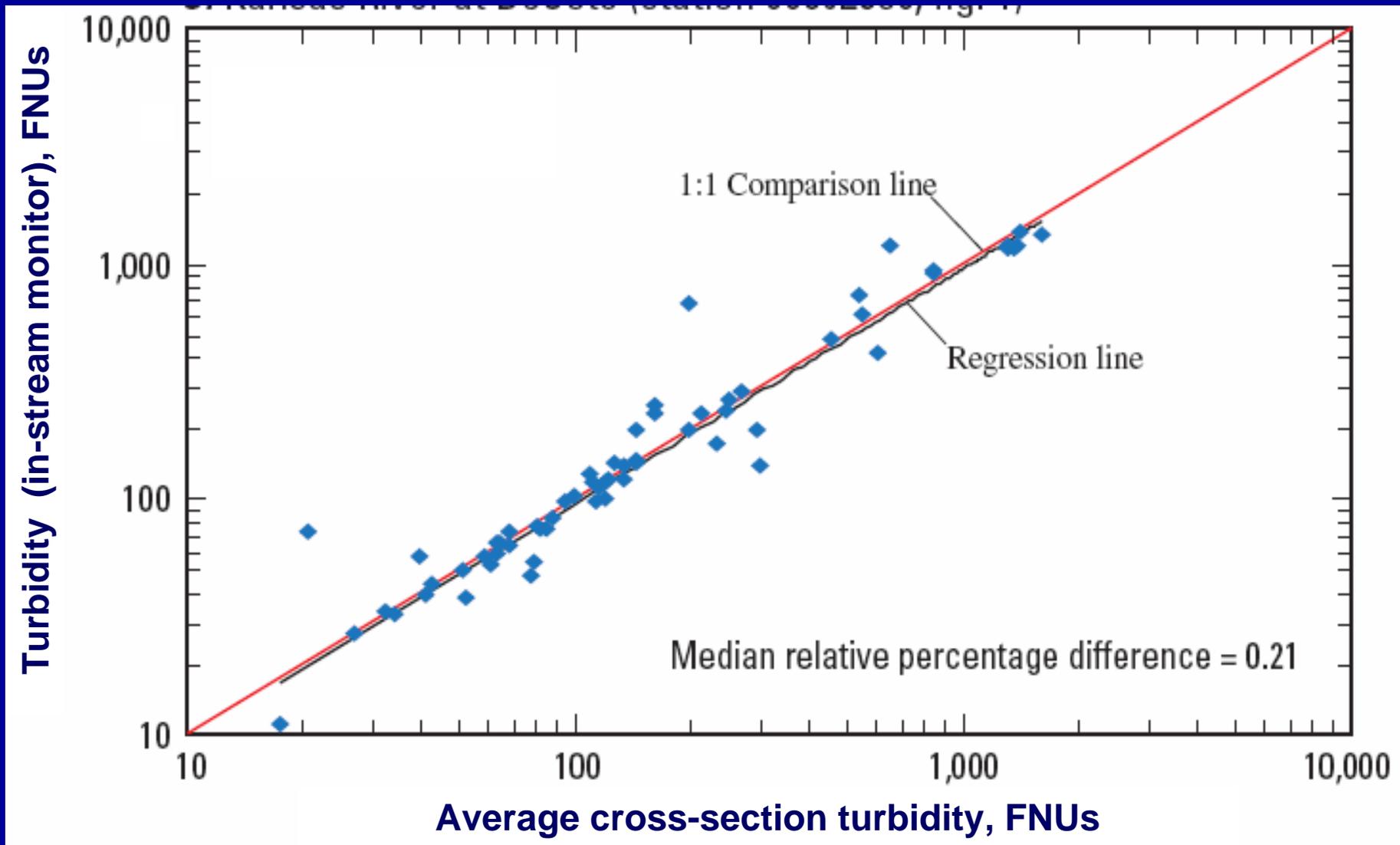
**USGS Kansas Water Science  
Center**

# Approach



- **Install stream gages and water-quality monitors**
- Collect discrete samples over range of conditions
- Develop regression models using samples and sensor values
- Estimate concentrations and loads based on regression models and display data on the Web
- Continue sampling to verify relations

# Is monitor location representative of stream cross-section?



# Approach

- Install stream gages and water-quality monitors
- **Collect discrete samples over range of conditions**
- Develop regression models using samples and sensor values
- Estimate concentrations and loads based on regression models and display data on the Web
- Continue sampling to verify relations



# Sampling methods

## 1. Equal Discharge Increment (EDI)

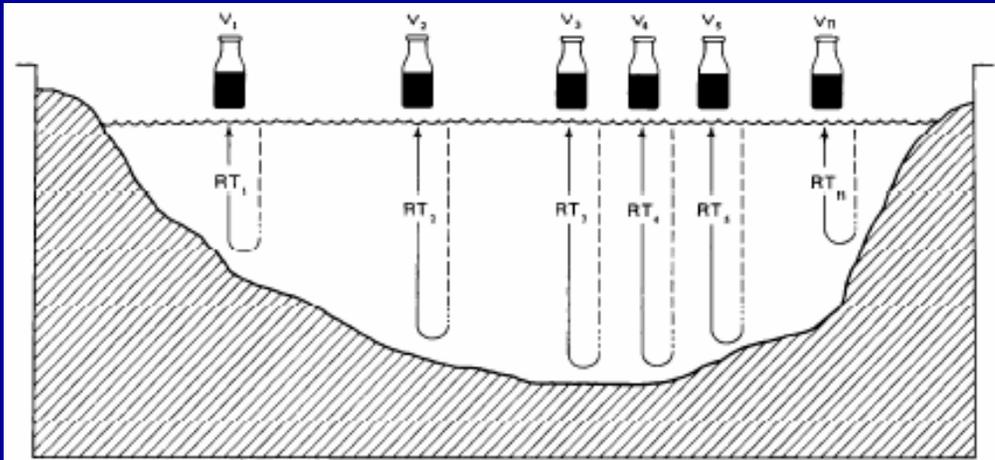


Figure 35. Vertical transit rate relative to sample volume collected at each equal-discharge-increment centroid.



## 2. Equal Width Increment (EWI)

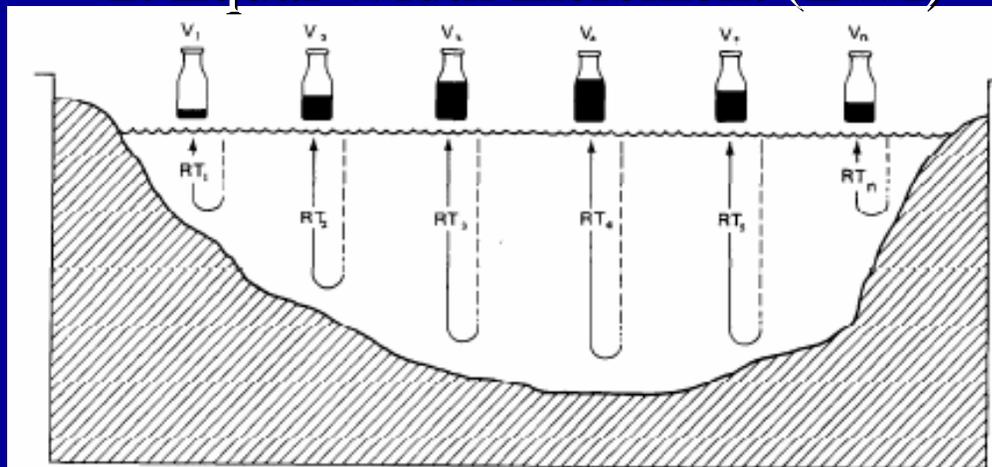
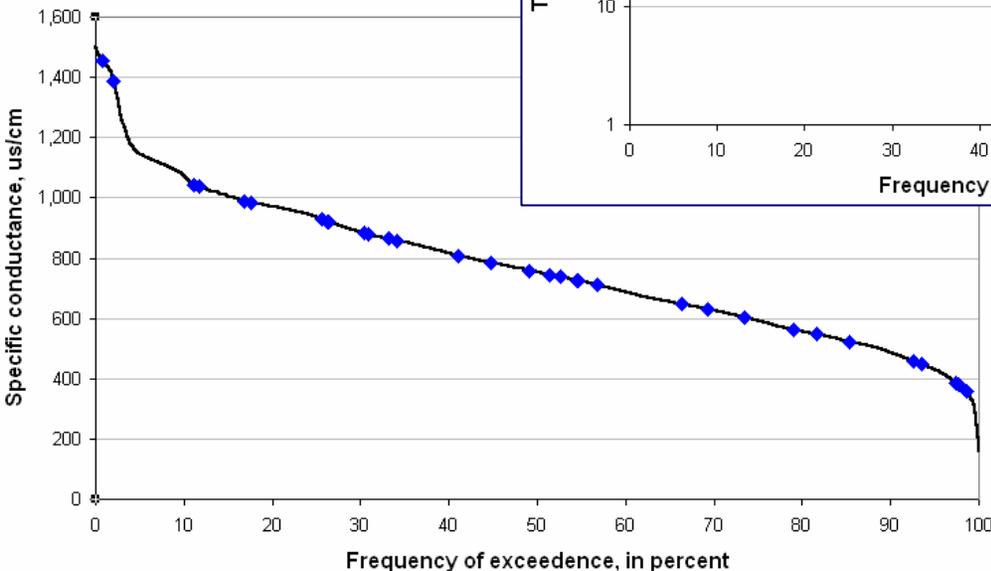
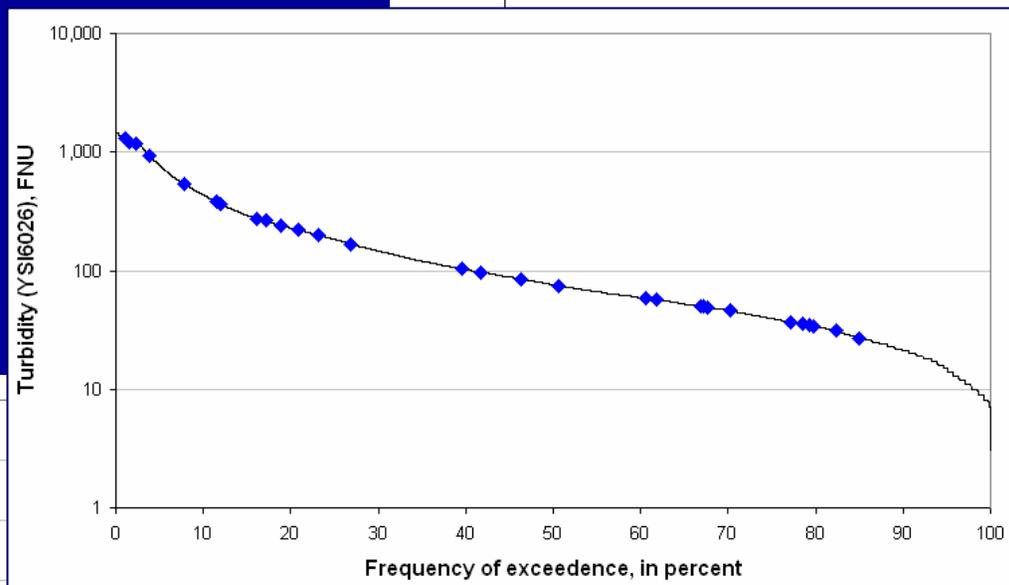
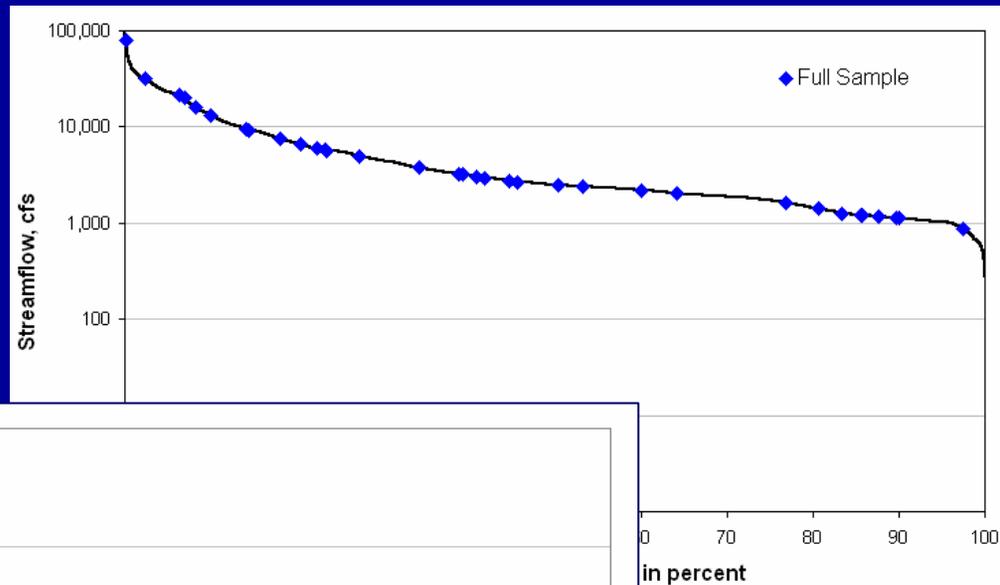


Figure 37. Equal-width-increment vertical transit rate relative to sample volume, which is proportional to water discharge at each vertical.

## 3. Autosampler



**Collect samples over  
the range of conditions**

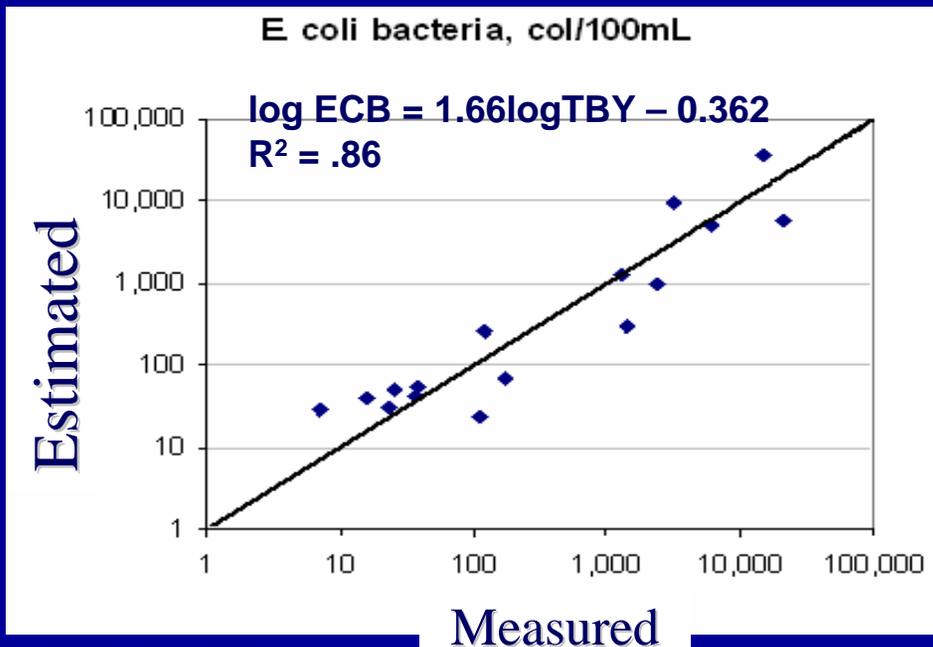
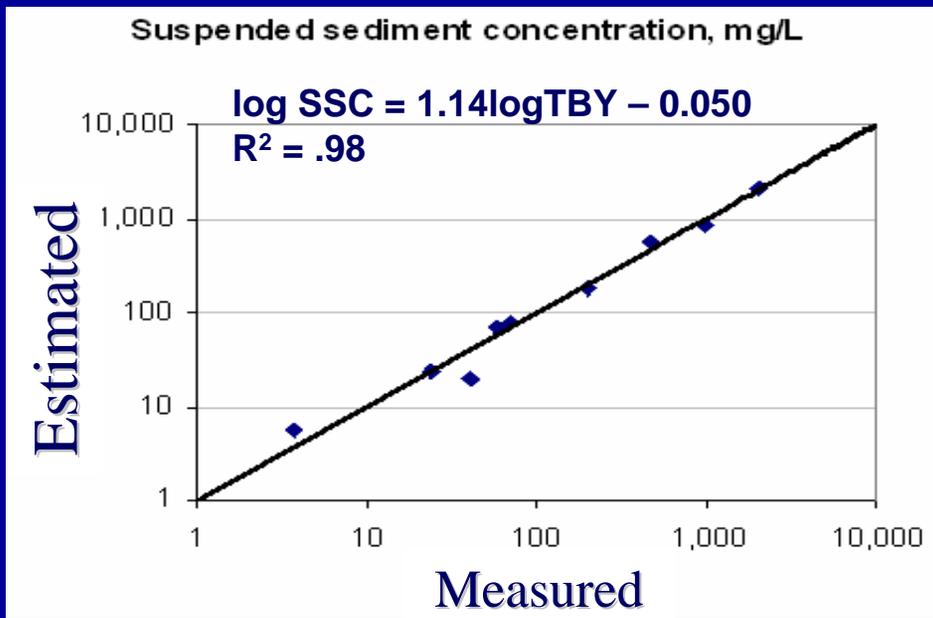


**Duration curves for  
streamflow, turbidity, and  
specific conductance**

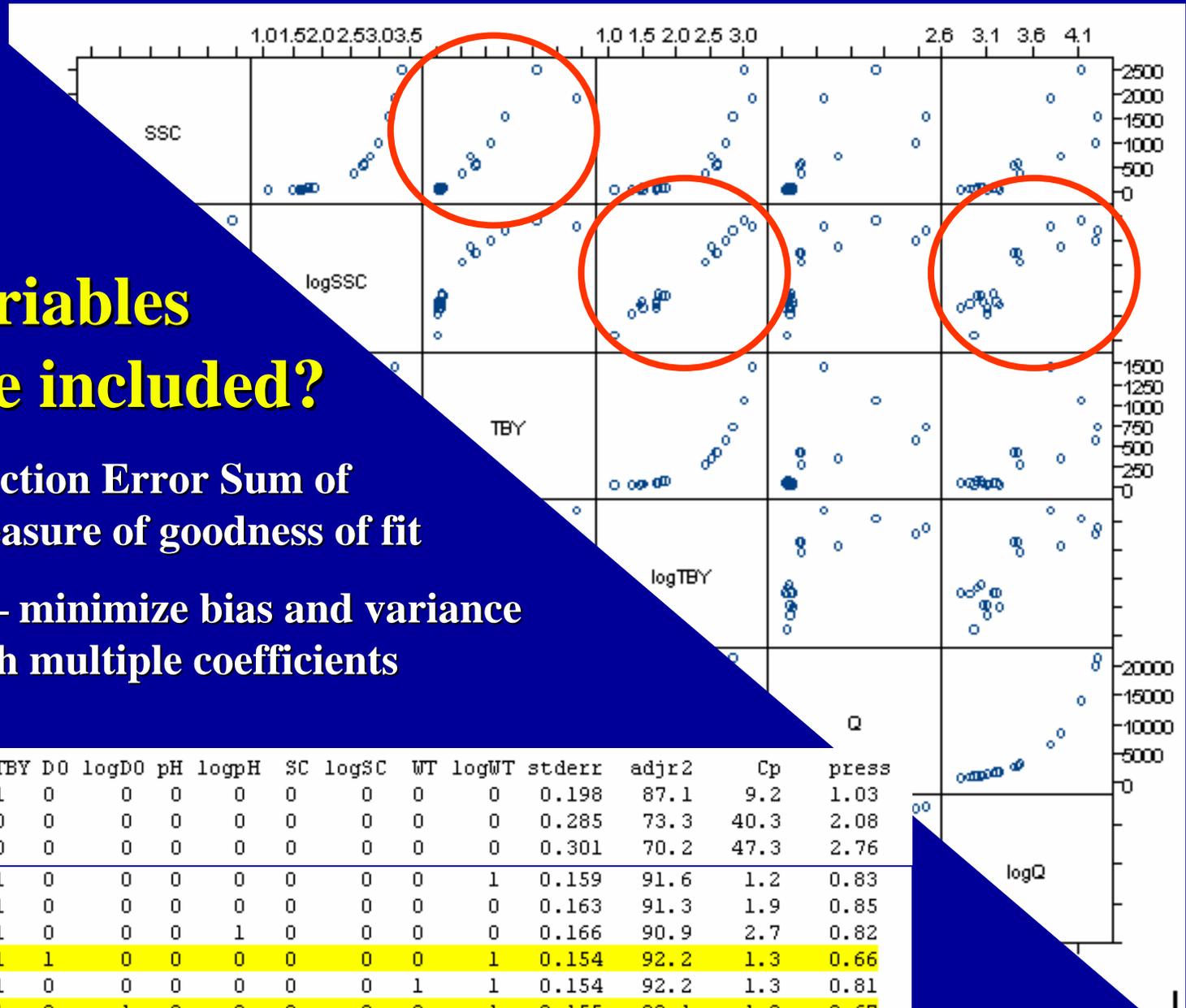
**Kansas River at DeSoto, 1999-2003**

# Approach

- Install stream gages and water-quality monitors
- Collect discrete samples over range of conditions
- **Develop regression models using samples and sensor values**
- Estimate concentrations and loads based on regression models and display data on the Web
- Continue sampling to verify relations



# Plot the data



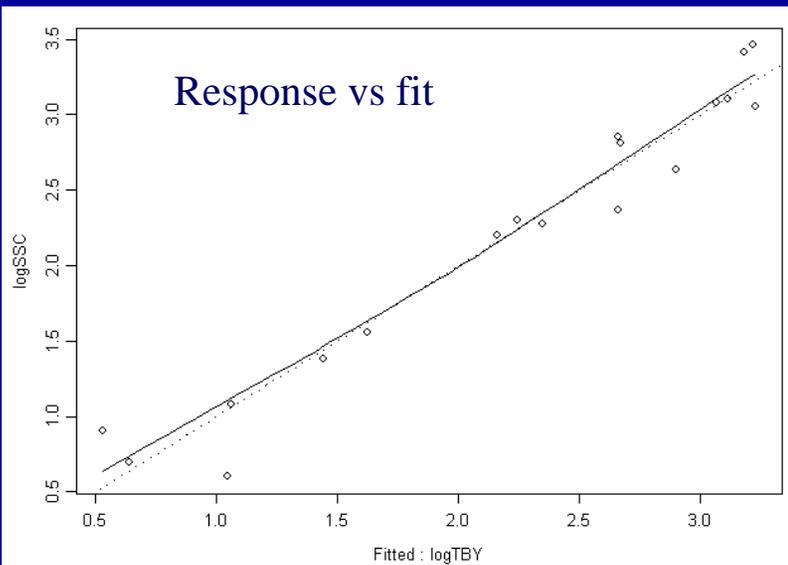
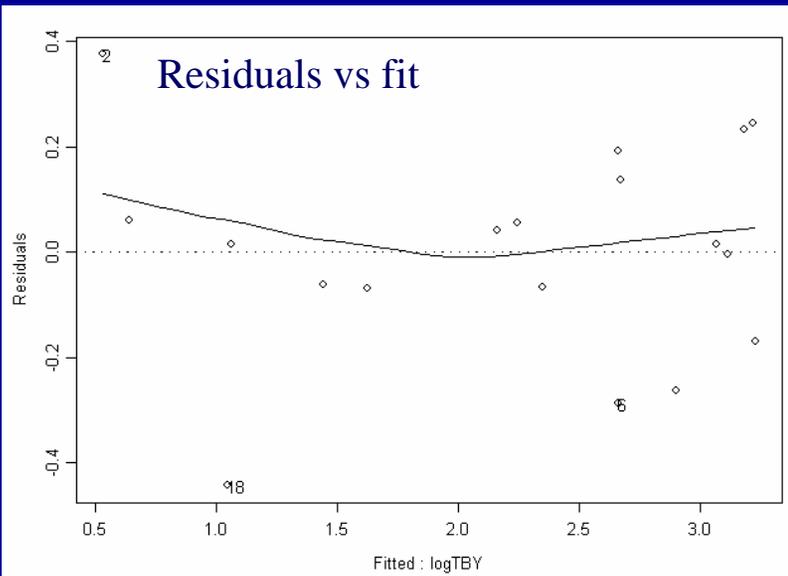
## What variables should be included?

PRESS (Prediction Error Sum of Squares) – measure of goodness of fit

Mallow's Cp – minimize bias and variance associated with multiple coefficients

	Q	logQ	TBY	logTBY	D0	logD0	pH	logpH	SC	logSC	WT	logWT	stderr	adjr2	Cp	press
1(#1)	0	0	0	1	0	0	0	0	0	0	0	0	0.198	87.1	9.2	1.03
1(#2)	0	1	0	0	0	0	0	0	0	0	0	0	0.285	73.3	40.3	2.08
1(#3)	0	0	1	0	0	0	0	0	0	0	0	0	0.301	70.2	47.3	2.76
3(#2)	1	0	0	1	0	0	0	0	0	0	1	1	0.159	91.6	1.2	0.83
3(#3)	0	1	1	1	0	0	0	0	0	0	0	0	0.163	91.3	1.9	0.85
3(#4)	0	1	0	1	0	0	0	1	0	0	0	0	0.166	90.9	2.7	0.82
4(#1)	0	1	0	1	1	0	0	0	0	0	0	1	0.154	92.2	1.3	0.66
4(#2)	0	1	0	1	0	0	0	0	0	0	1	1	0.154	92.2	1.3	0.81
4(#3)	0	1	0	1	0	1	0	0	0	0	0	1	0.155	92.1	1.3	0.67
4(#4)	0	1	1	1	0	0	0	0	0	0	0	1	0.156	92.0	1.7	0.79

# Evaluate models



## \*\*\* Linear Model \*\*\*

Call: `lm(formula = logSSC ~ logTBY, data = sampledata, na.action = na.exclude)`

### Residuals:

Min	1Q	Median	3Q	Max
-0.4429	-0.06827	0.01556	0.1178	0.3754

### Coefficients:

	Value	Std. Error	t value	Pr(> t )
(Intercept)	0.2311	0.1200	1.9258	0.0721
logTBY	0.9852	0.0544	18.1083	0.0000

Residual standard error: 0.2105 on 16 degrees of freedom

Multiple R-Squared: 0.9535

F-statistic: 327.9 on 1 and 16 degrees of freedom, the p-value is 4.402e-012

### Correlation of Coefficients:

(Intercept)

logTBY -0.9105

### Analysis of Variance Table

Response: logSSC

Terms added sequentially (first to last)

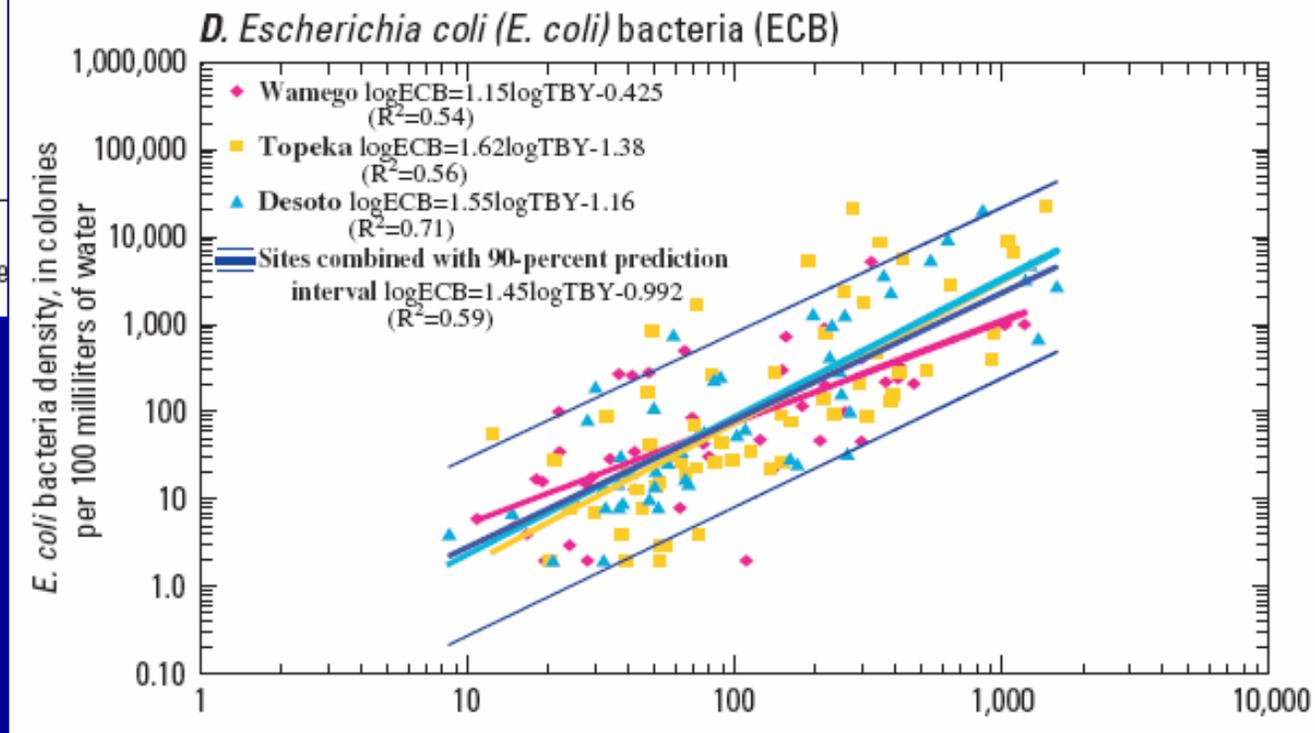
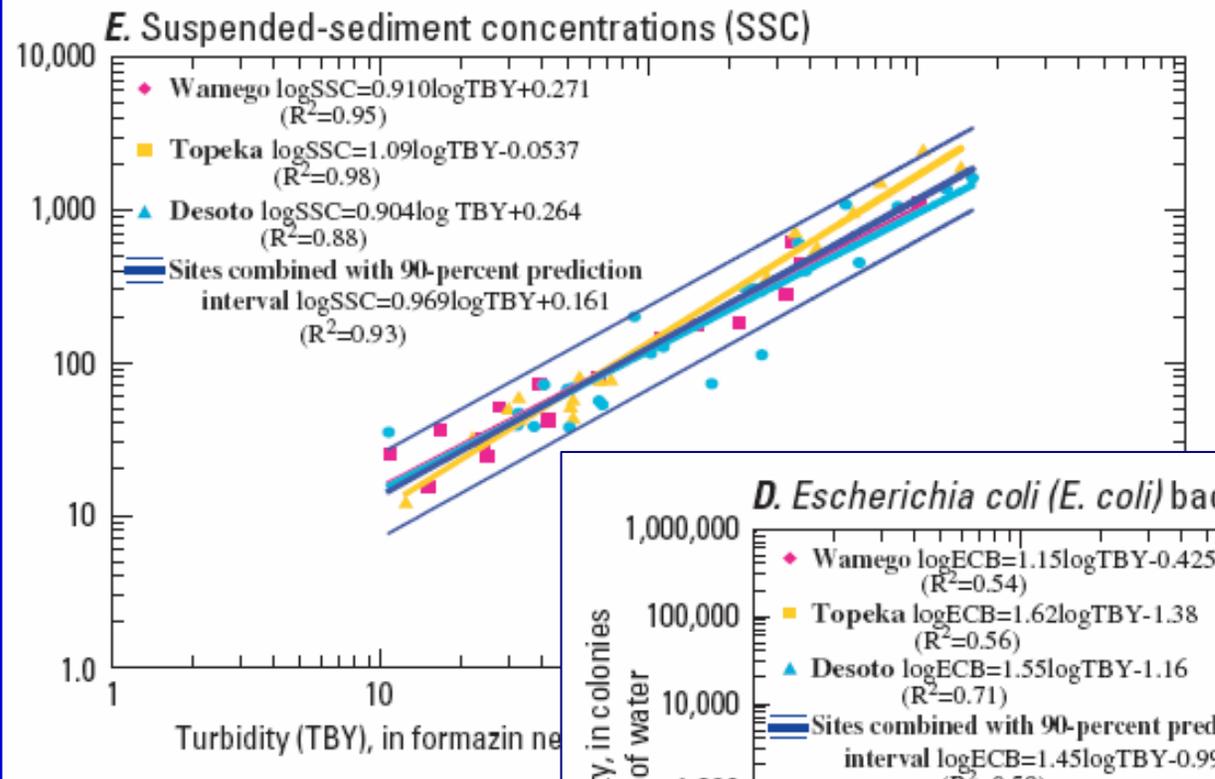
	Df	Sum of Sq	Mean Sq	F Value	Pr(F)
logTBY	1	14.53088	14.53088	327.9095	4.402256e-012
Residuals	16	0.70902	0.04431		

Select the  
'best' model

# **Other factors to consider in model development**

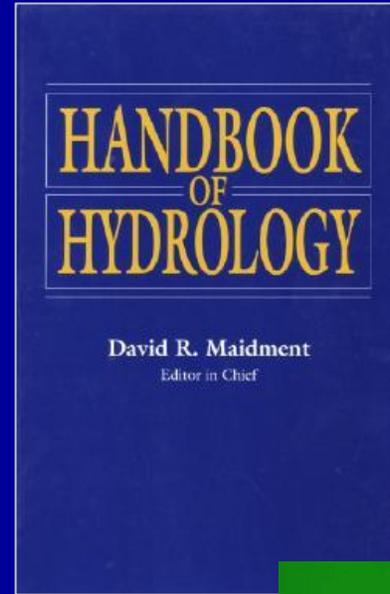
- **Should data be transformed? If so, apply a bias correction factor?**
- **Outliers – how to define and what to do with them?**
- **Estimate missing data?**
- **Site specific models or combine sites?**
- **How many samples are needed? Over what period of time are they collected?**
- **Changes in sensor technology**

# Re-evaluate the final models

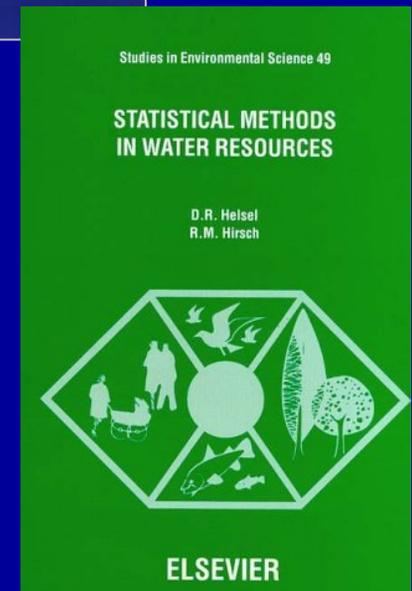


# Procedures for developing a regression model

- Plot the data
- Determine which variables to include
- Should the variables be transformed?
- Graphically evaluate homoscedasticity, normality of residuals, and curvature in residuals vs. predicted.
- Select the simplest model that best maximizes  $R^2$  and minimizes PRESS
- Evaluate the model in terms of physical basis, statistics, prediction intervals, probability distributions



Hirsch,  
Helsel,  
Cohn, and  
Gilroy,  
1993,  
Chapter 17



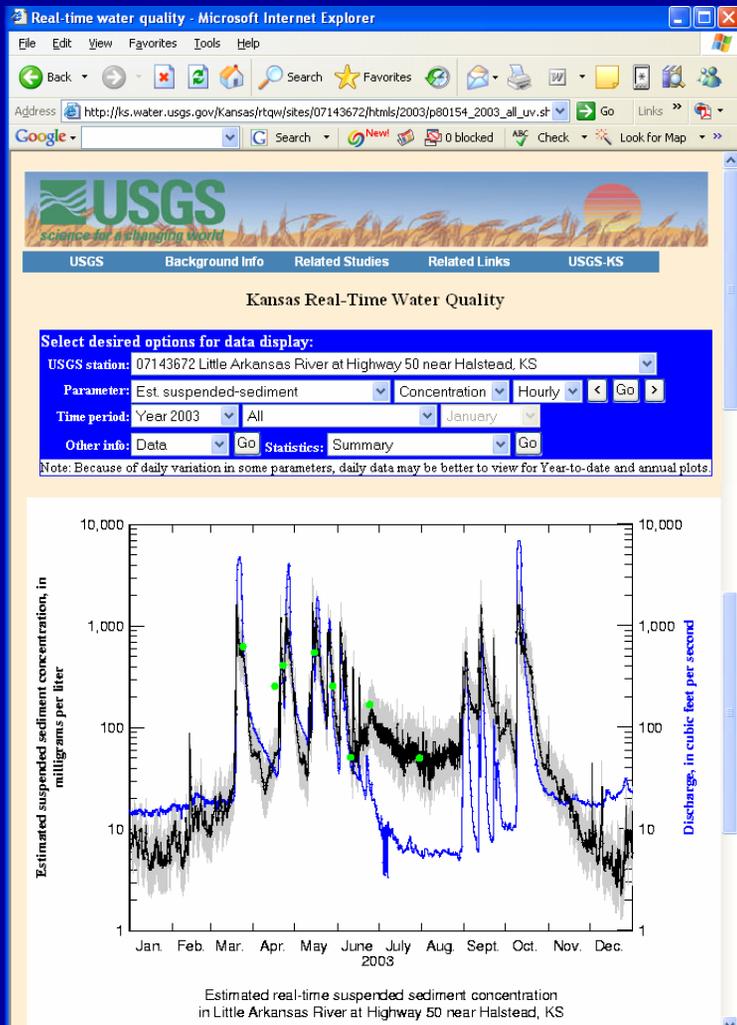
Helsel and  
Hirsch,  
1992

<b>Directly Measured</b>	<b>Estimated</b>
Gage Height/Stage	Streamflow (discharge)
Specific Conductance	Chloride, alkalinity, fluoride, dissolved solids, sodium, sulfate, nitrate, atrazine
Turbidity	Total suspended solids, suspended sediment, fecal coliform, E. coli, total nitrogen, total phosphorus, geosmin

# Nutrients and bacteria are physically (and statistically) related to sediment

Constituent	Model	R <sup>2</sup>	MSE
Total nitrogen	$\log_{10} TN = 0.469 \log_{10} SSC - 0.743$	0.796	0.0226
Total organic nitrogen	$TON = 0.00188 SSC + 1.05$	0.817	0.3300
Total phosphorus	$TP = 0.000673 SSC + 0.404$	0.928	0.0148
Fecal coliform	$\log_{10} FCB = 1.36 \log_{10} SSC - 0.228$	0.753	0.235
<i>Escherichia coli</i>	$\log_{10} EC = 1.15 \log_{10} SSC + 0.207$	0.701	0.190

# Approach



- Install stream gages and water-quality monitors
- Collect discrete samples over range of conditions
- Develop regression models using samples and sensor values
- **Estimate concentrations and loads based on regression models and display data on the Web**
- Continue sampling to verify relations

# Display data on the Web



## Kansas Real-Time Water Quality

Select desired options for data display:

USGS station: 07143672 Little Arkansas River at Highway 50 near Halstead, KS

Parameter: Est. dissolved chloride Concentration Hourly

Time period: Year 2005 All January

Other info: Data

Note: Because of daily variations...

### Summary Statistics of dissolved chloride in Little Arkansas River at Highway 50 near Halstead, KS (January 1, 2005 - December 31, 2005)

	Cl	Cl (lower)	Cl (upper)	Cl (load)	Cl (lower load)	Cl (upper load)
Statistics	mg/L	mg/L	mg/L	tons/day	tons/day	tons/day
No. of values	8642	8642	8642	8642	8642	8642
Mean	137.1	99.69	176.4	21.85	10.71	42.39
			69.13	33.39	19.9	84.54
			39.5	0	0	2.39
			43	2,339	0	3.54
			62.4	2.94	0	4.23
			79.7	3.61	0.3541	4.91
			132	4.54	2.48	5.9
			169	11.5	5.74	14.4
			219	24	13	34.8

### Summary of Regression Analysis for Dissolved chloride at Little Arkansas River at Highway 50 near Halstead, KS

$$Cl = -33.7 + 0.209 SC$$

where:

Cl -- Dissolved chloride in milligrams per liter.

SC -- Specific conductance in microsiemens per centimeter at 25 degrees Celsius.

#### Basic information:

No. of measurements: 156  
 Mean squared error (MSE): 557.90  
 Multiple R-squared: 0.9572

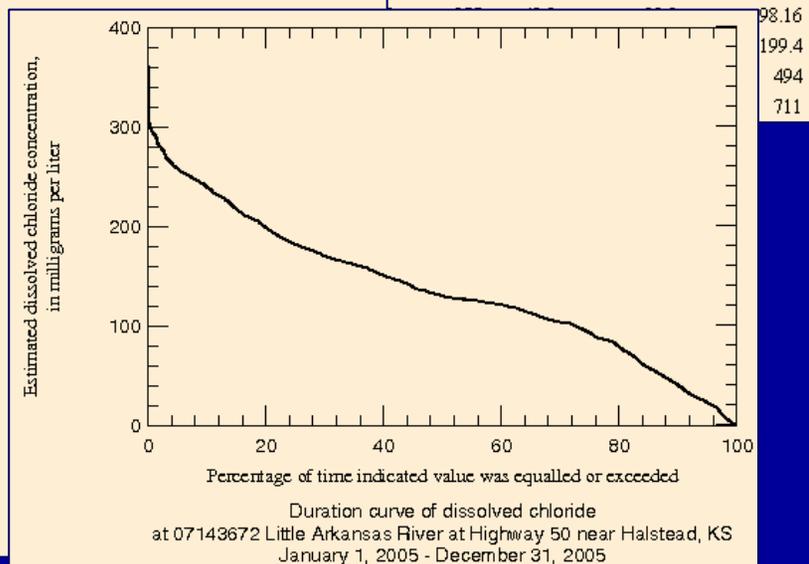
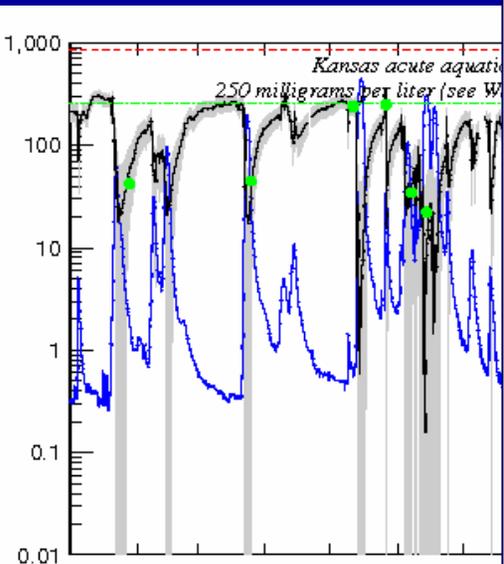
#### Coefficients:

	Value	Std. Error
(Intercept)	-33.7	3.8775
SC	0.209	0.0036

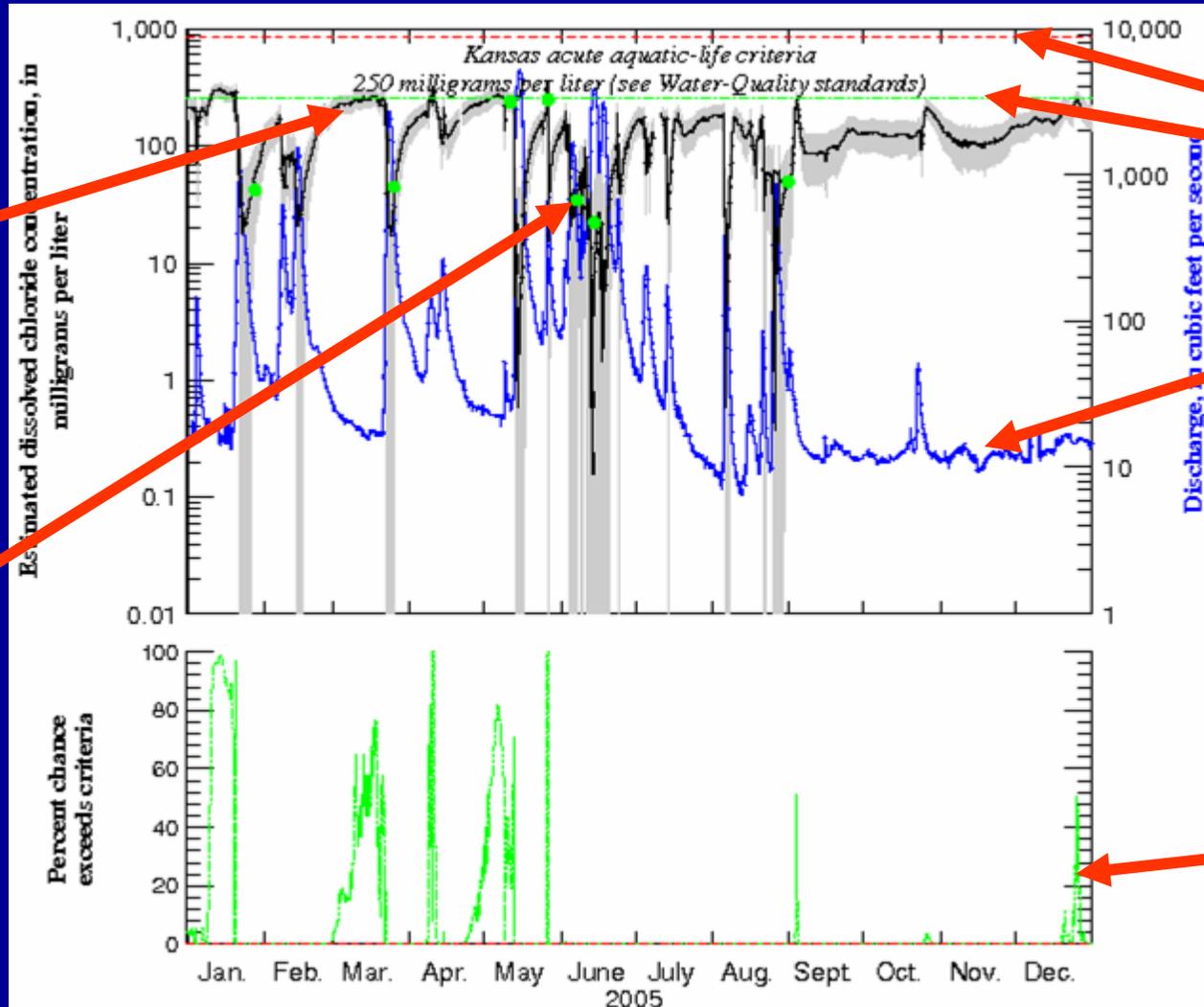
#### Correlation matrix of coefficients:

	(Intercept)	SC
(Intercept)	1	
SC	-0.873	1

Smearing factor = 1



# Estimated chloride concentration, 2004, Little Arkansas River near Halstead, Kansas



Estimated concentration with 90% prediction interval

Discrete sample

Water-quality criteria

Streamflow (log scale)

Probability of exceeding criteria



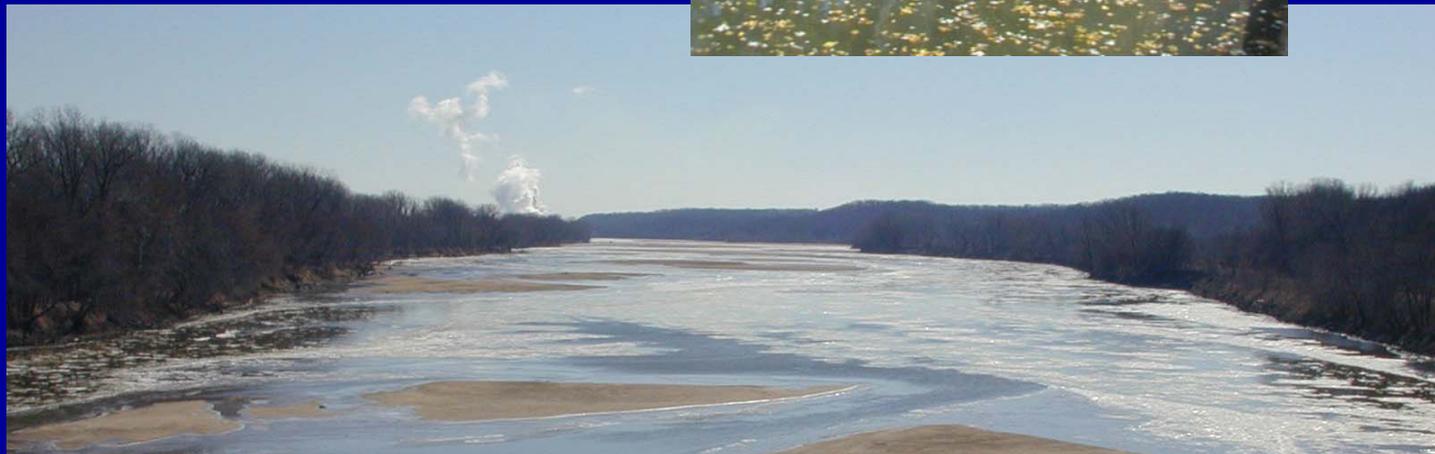
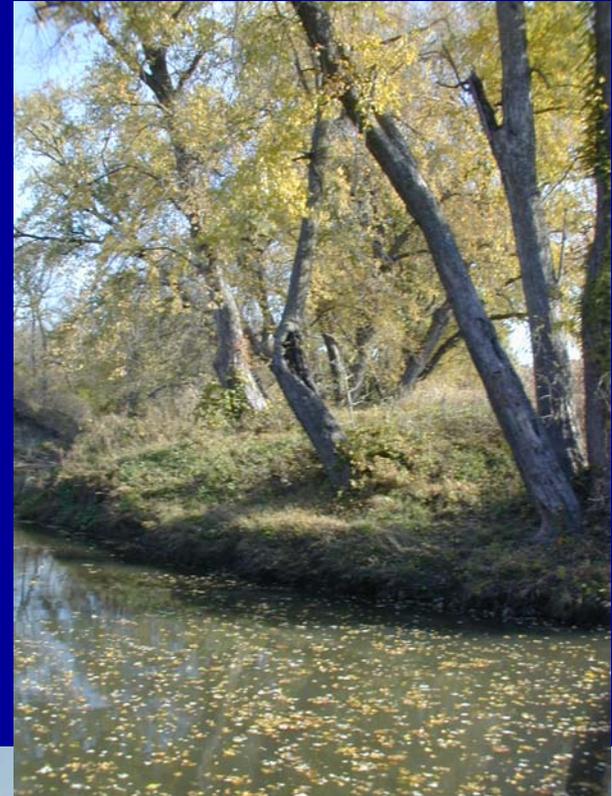
# Approach

- Install stream gages and water-quality monitors
- Collect discrete samples over range of conditions
- Develop regression models using samples and sensor values
- Estimate concentrations and loads based on regression models and display data on the Web
- **Continue sampling to verify relations**

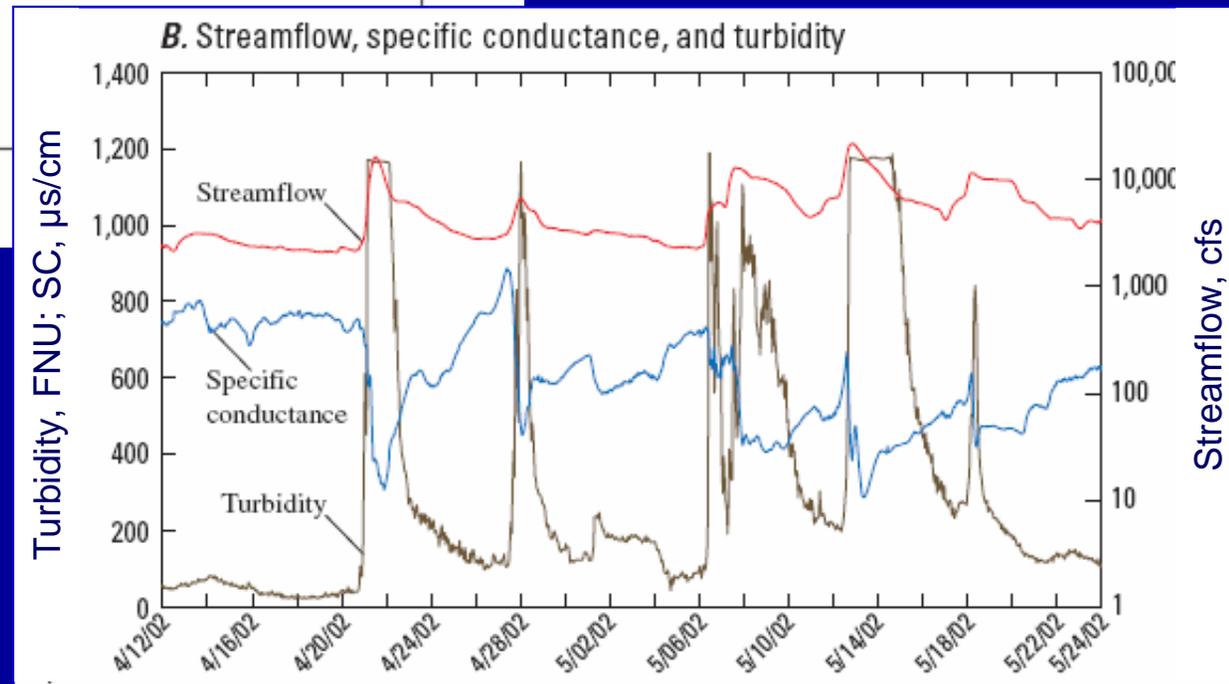
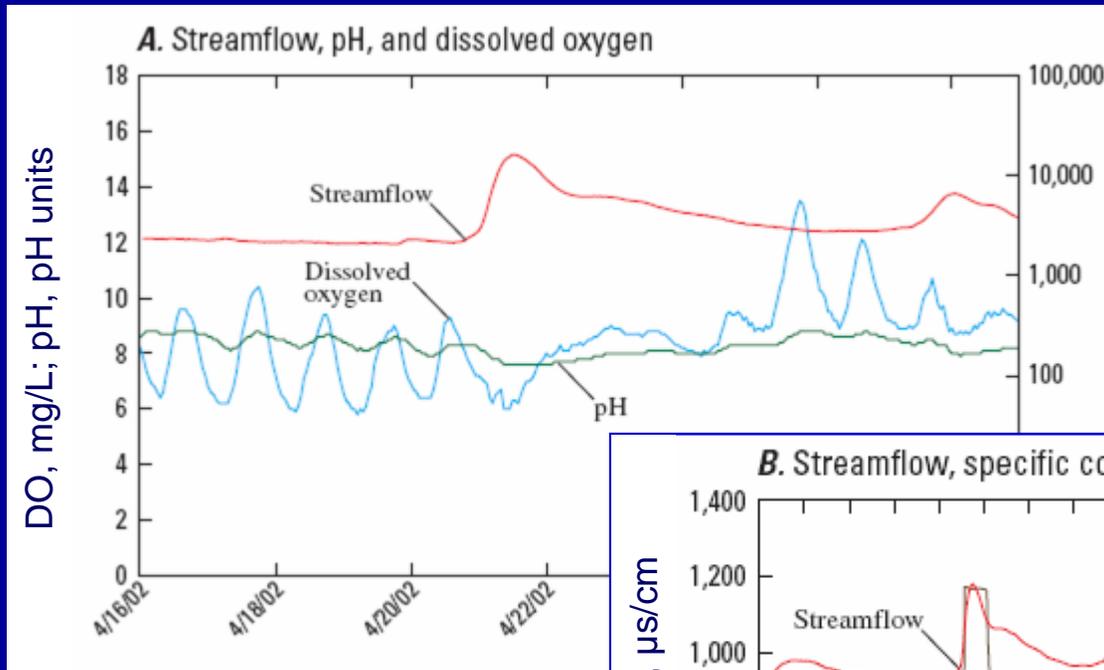


# Applications and examples

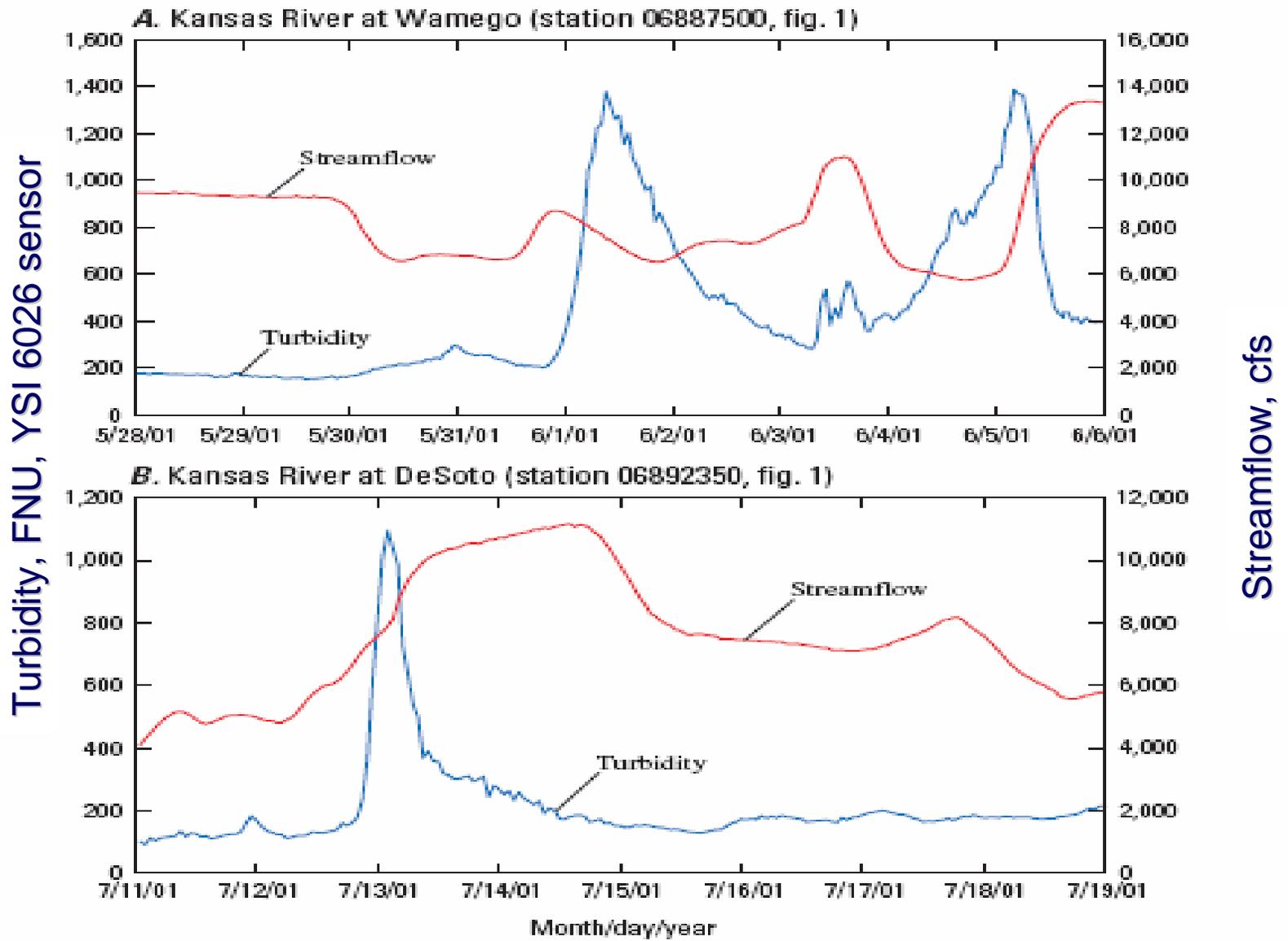
- Time series data
- Scatter plots
- Duration curves
- Comparisons
- WQ criteria
- TMDLs



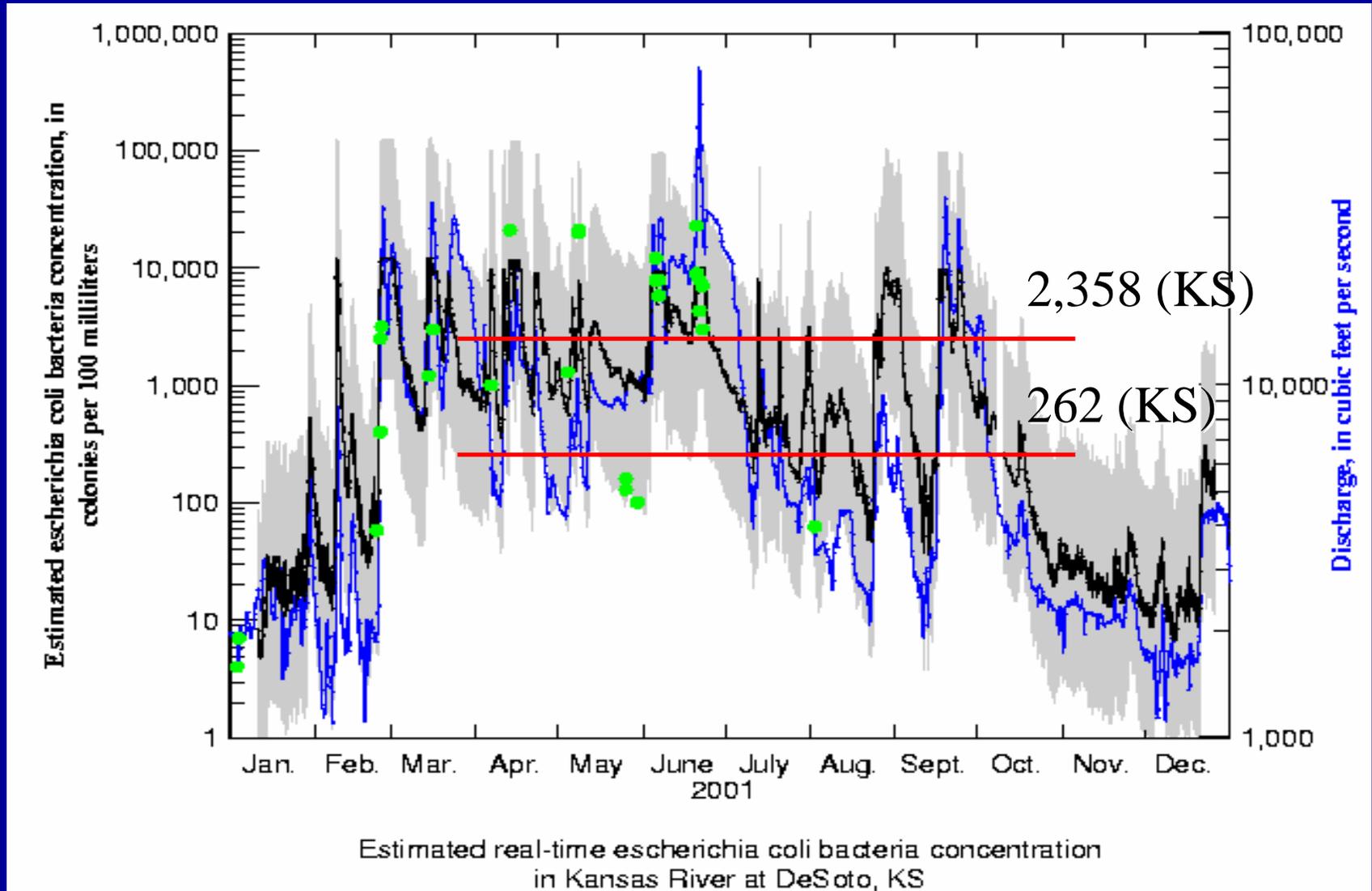
# Water-quality varies hourly, daily, monthly, seasonally, and annually



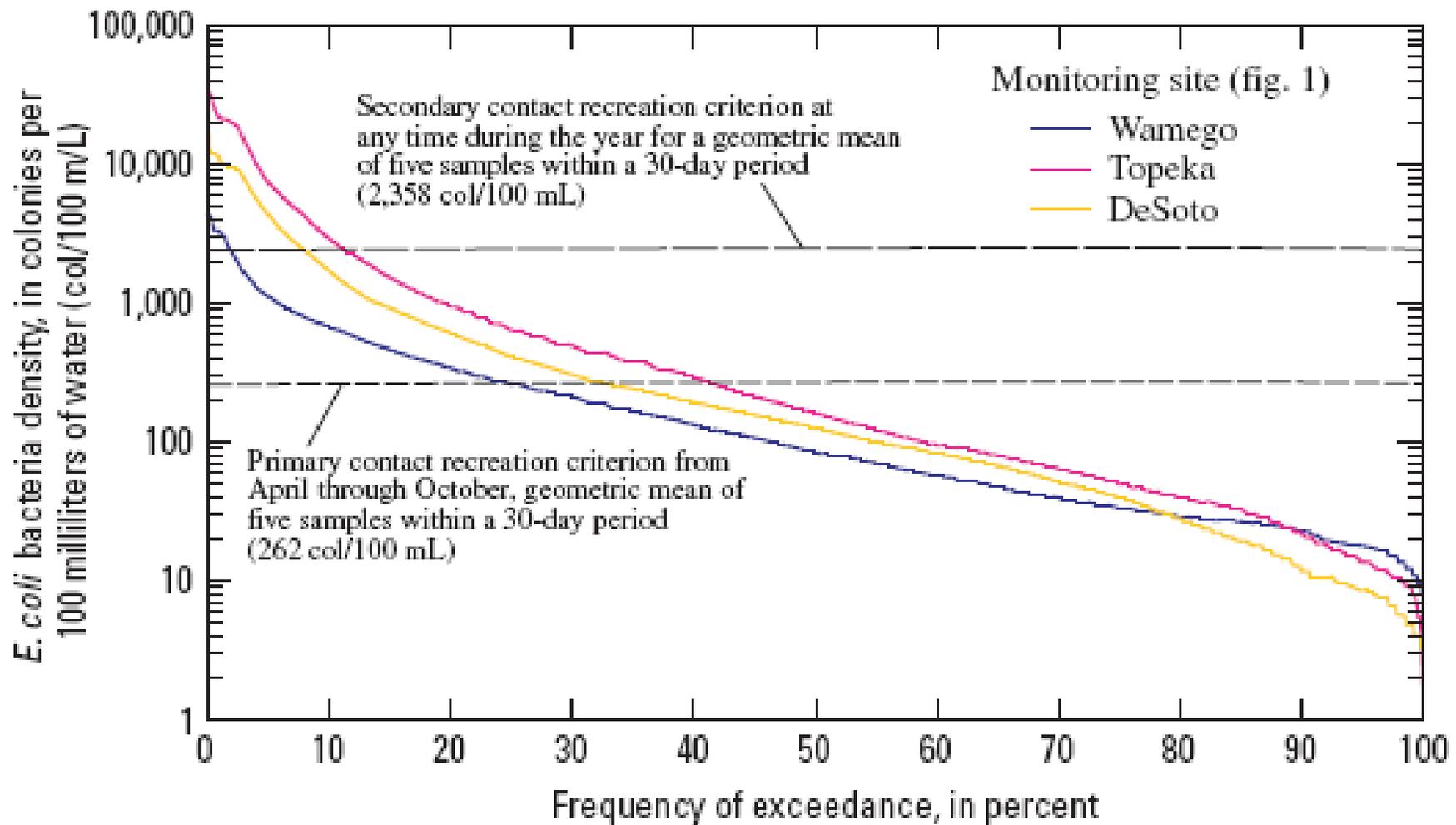
# Turbidity and streamflow not directly related



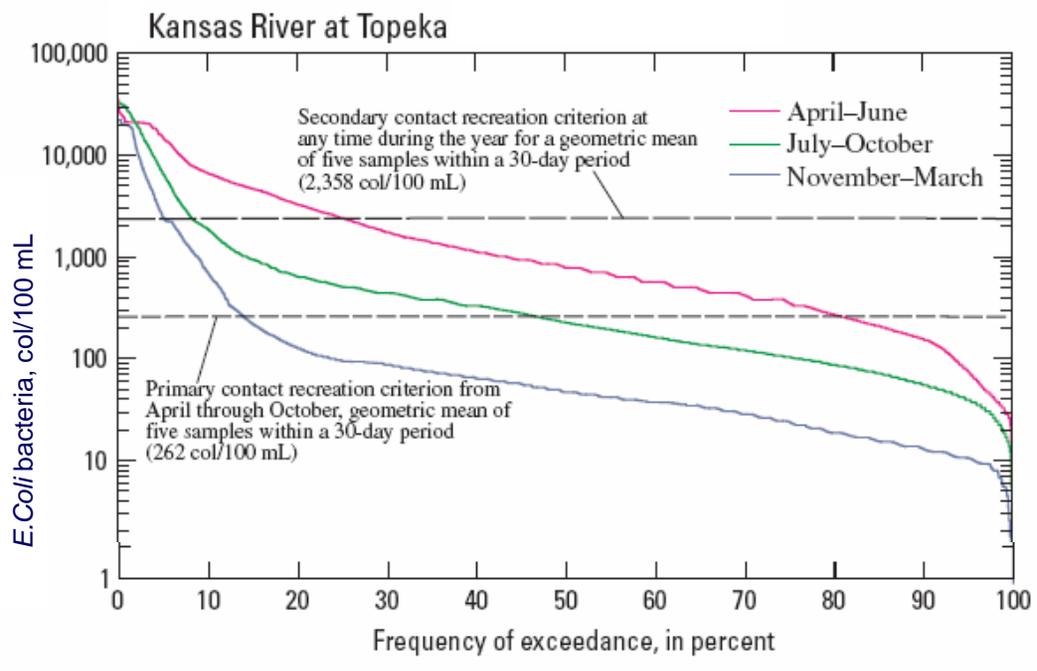
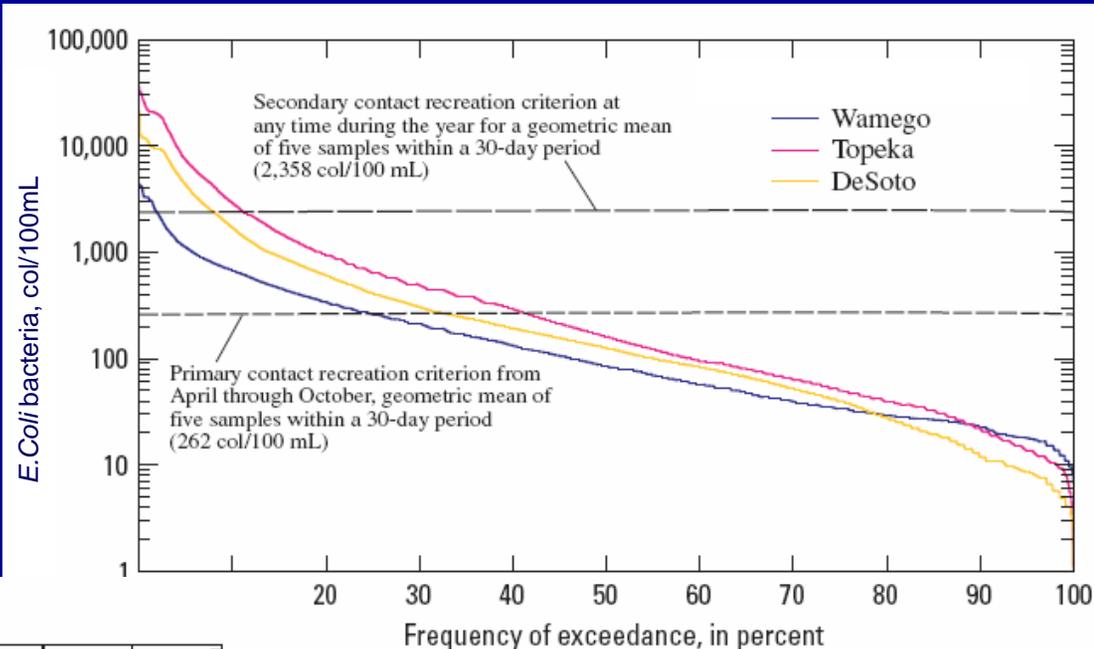
# Bacteria frequently exceed water-quality standards



**During 2000-03 *E. Coli* bacteria density at Topeka exceeded the primary contact criterion 40% of the time.**



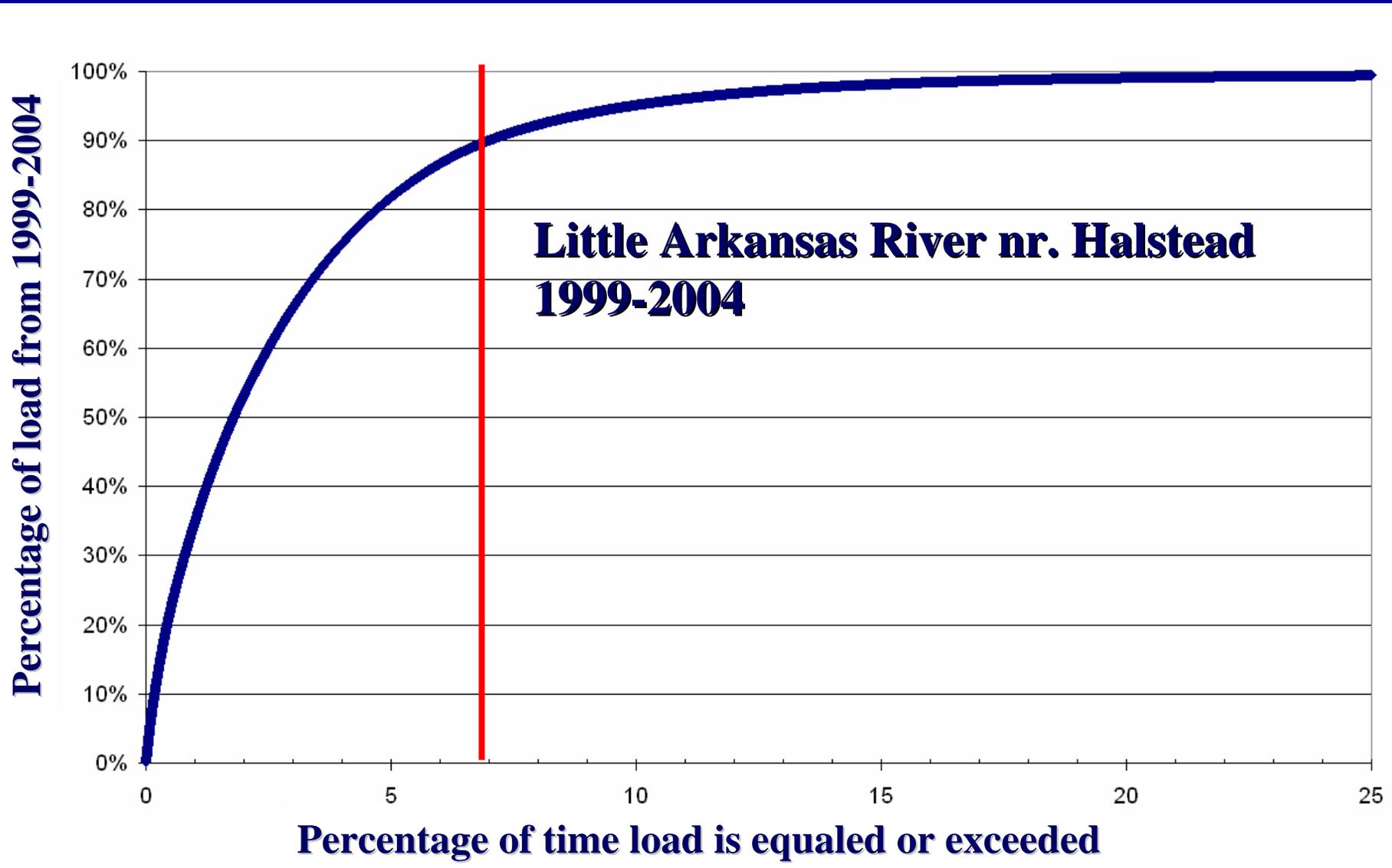
# *E. Coli* density generally largest at Topeka



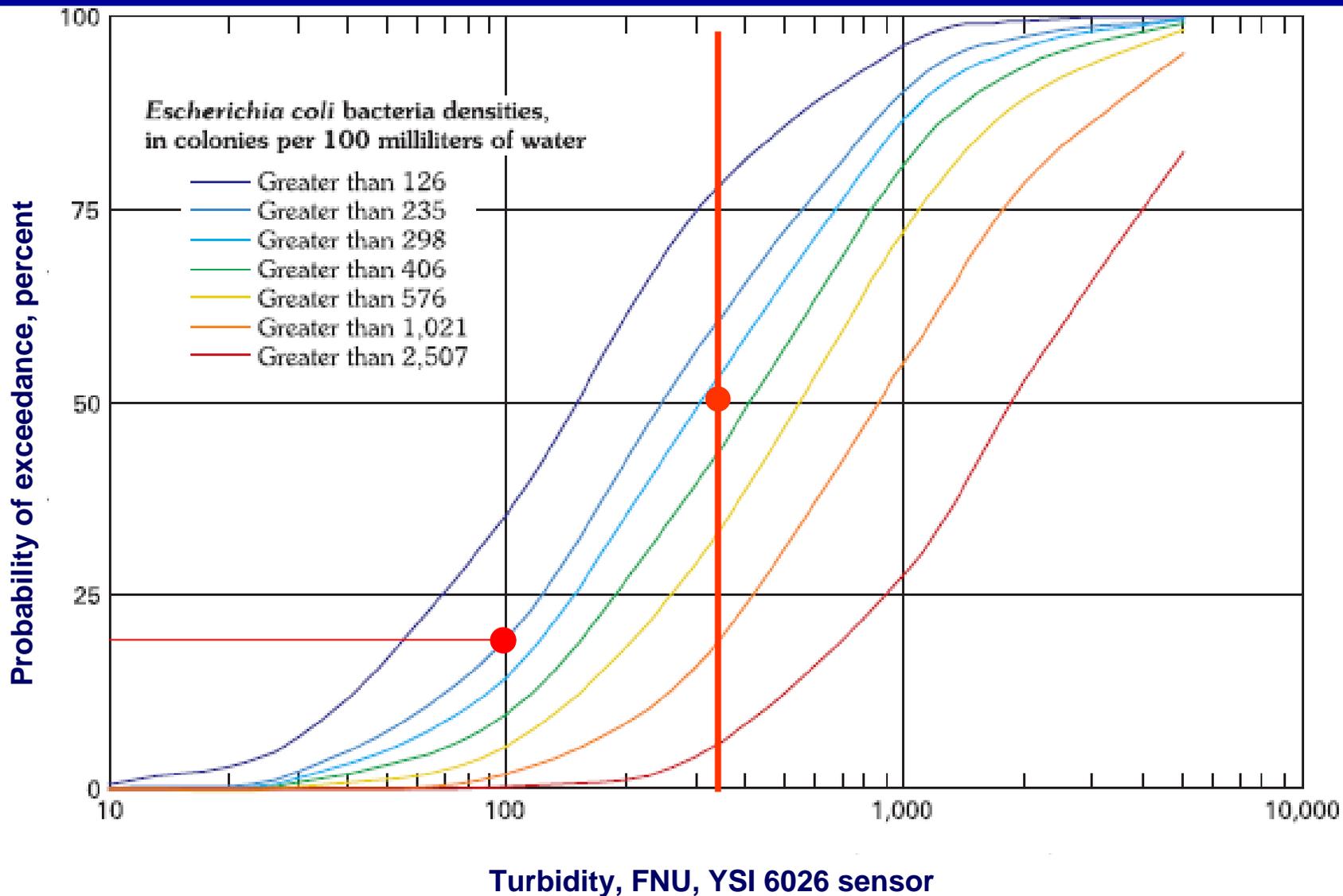
**During the spring, the primary contact criterion was exceeded 80% of the time and the secondary contact criterion was exceeded 25% of the time.**



# 90 percent of the load occurs in 7 percent of the time

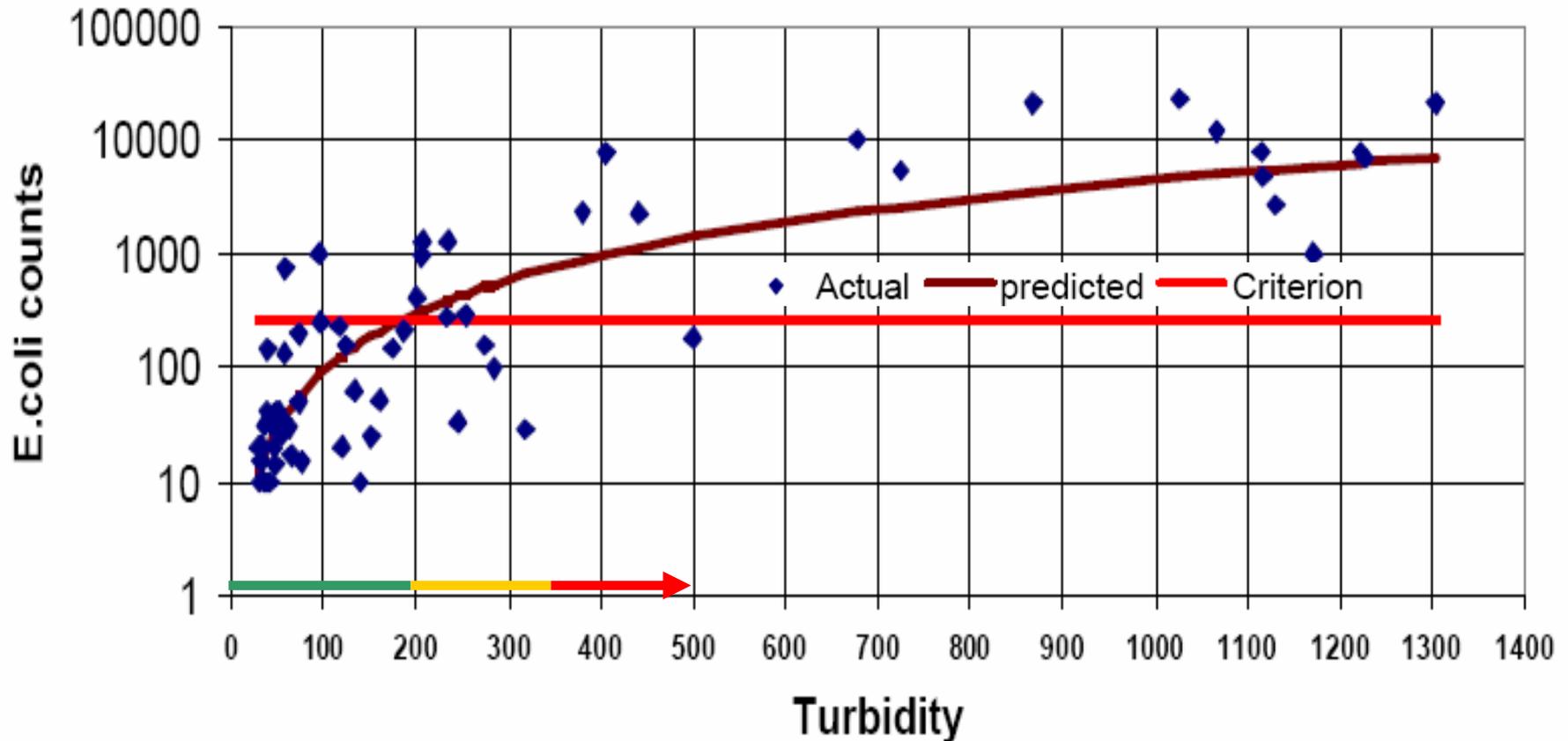


# Turbidity to estimate probability of exceeding E. coli criteria

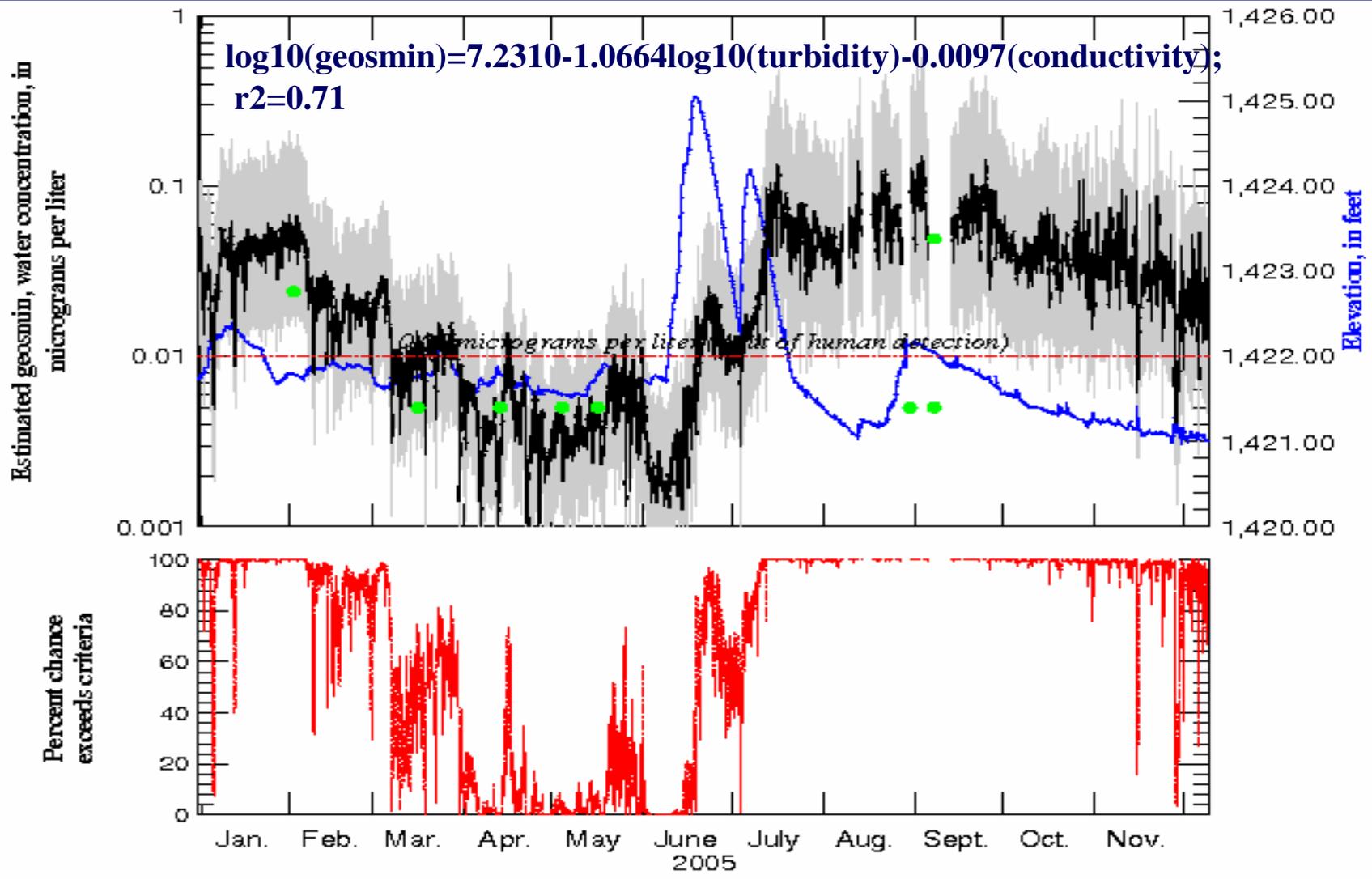


**Kansas River TMDL incorporates continuous turbidity data.  
When turbidity > 350 FNU, *E. coli* criteria likely to be exceeded.**

**Turbidity-Primary *E. coli* Relationship at Desoto**



# Future: Real-time estimation of geosmin in Cheney Reservoir (2005)



Estimated real-time geosmin, water concentration in Cheney Reservoir near Cheney, KS



# What does it cost to operate a site?

## Continuous monitoring and developing relations

- Purchase or rent monitor and install
- O&M for 6 sensors and records
- Sampling (15-30 times over 2 years)
- Regression analysis and report
- Put estimates on the web

## Subsequent years

- O&M for 6 sensors and records
- Sampling (3-5 times per year)

# Benefits of Real Time Water Quality

- **Improve our understanding of the hydrology and water quality of streams**
- **Continuously measure water quality in real time like streamflow**
- **Comparison to water-quality criteria**
- **Provide notification of changes in water-quality conditions for water treatment and recreation in real time**
- **Better estimate selected constituent concentrations and loads with defined uncertainty**
- **Identify source areas and evaluate trends for NPDES, BMPs and TMDLs**
- **Optimize timing of sample collection**

# Future Challenges for Continuous Water Quality

- **Need more and better direct measurement sensors**
- **Reduce O&M costs/time**
- **Ice and shallow water installations**
- **More installations nationwide to better understand variability**
- **Detection of water-quality trends and BMPs effectiveness**
- **Improve ways to estimate and communicate uncertainty**
- **Continued sampling to document that relations remain representative**

# Real-time continuous concentrations and loads on the Web—

<http://ks.water.usgs.gov/Kansas/rtqw/>



Prepared in cooperation with the CITY OF WICHITA, Kansas State Geologist

### Regression Models for Water-Quality Constituents and Yield South-Central Kansas

Water-Resources Investigations Report 01-4055



Prepared in cooperation with the U.S. FISH AND WILDLIFE SERVICE

### Characterization of Water Quality Based on Regression Models for Wildlife Resources

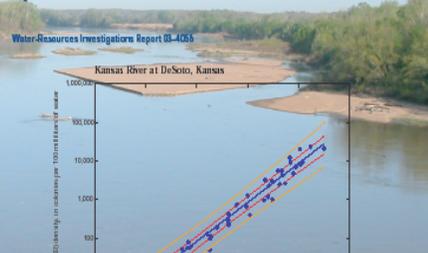
Water-Resources Investigations Report 01-4055



Prepared in cooperation with the KANSAS DEPARTMENT OF HEALTH AND ENVIRONMENT U.S. ENVIRONMENTAL PROTECTION AGENCY

### Comparison and Continuous Estimates of Fecal Coliform and Escherichia Coli Bacteria in Selected Kansas Streams, May 1999 Through April 2002

Water-Resources Investigations Report 01-4055



Prepared in cooperation with the CITY OF OLATHE, KANSAS and the KANSAS DEPARTMENT OF HEALTH AND ENVIRONMENT

### Surface-Water-Quality Constituents, Taste-and-Odor Occurrence and Yields in Lower Kansas River, Northeast Kansas Watershed, Northeast Kansas

Scientific Investigations Report 2005-5165



Prepared in cooperation with the KANSAS DEPARTMENT OF HEALTH AND ENVIRONMENT

### Estimation of Constituent Concentrations, Densities, Loads, and Yields in Lower Kansas River, Northeast Kansas, Using Regression Models and Continuous Water-Quality Monitoring, January 2000 Through December 2003



Scientific Investigations Report 2005-5165

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

## Kansas Real-Time Water Quality

Select desired options for data display:

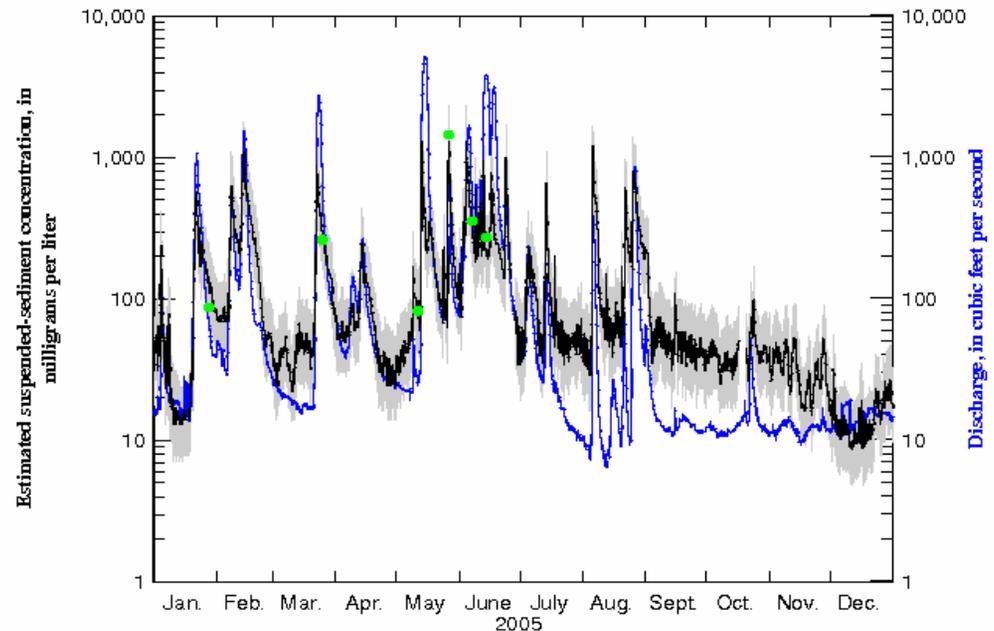
**USGS station:** 07143672 Little Arkansas River at Highway 50 near Halstead, KS

**Parameter:** Est. suspended-sediment Concentration Hourly < Go >

**Time period:** Year 2005 All January < Go >

**Other info:** Data < Go **Statistics:** Summary < Go

Note: Because of daily variation in some parameters, daily data may be better to view for Year-to-date and annual plots.



Estimated real-time suspended-sediment concentration in Little Arkansas River at Highway 50 near Halstead, KS

# Contact Information

Andy Ziegler- [aziegler@usgs.gov](mailto:aziegler@usgs.gov), 785-832-3539

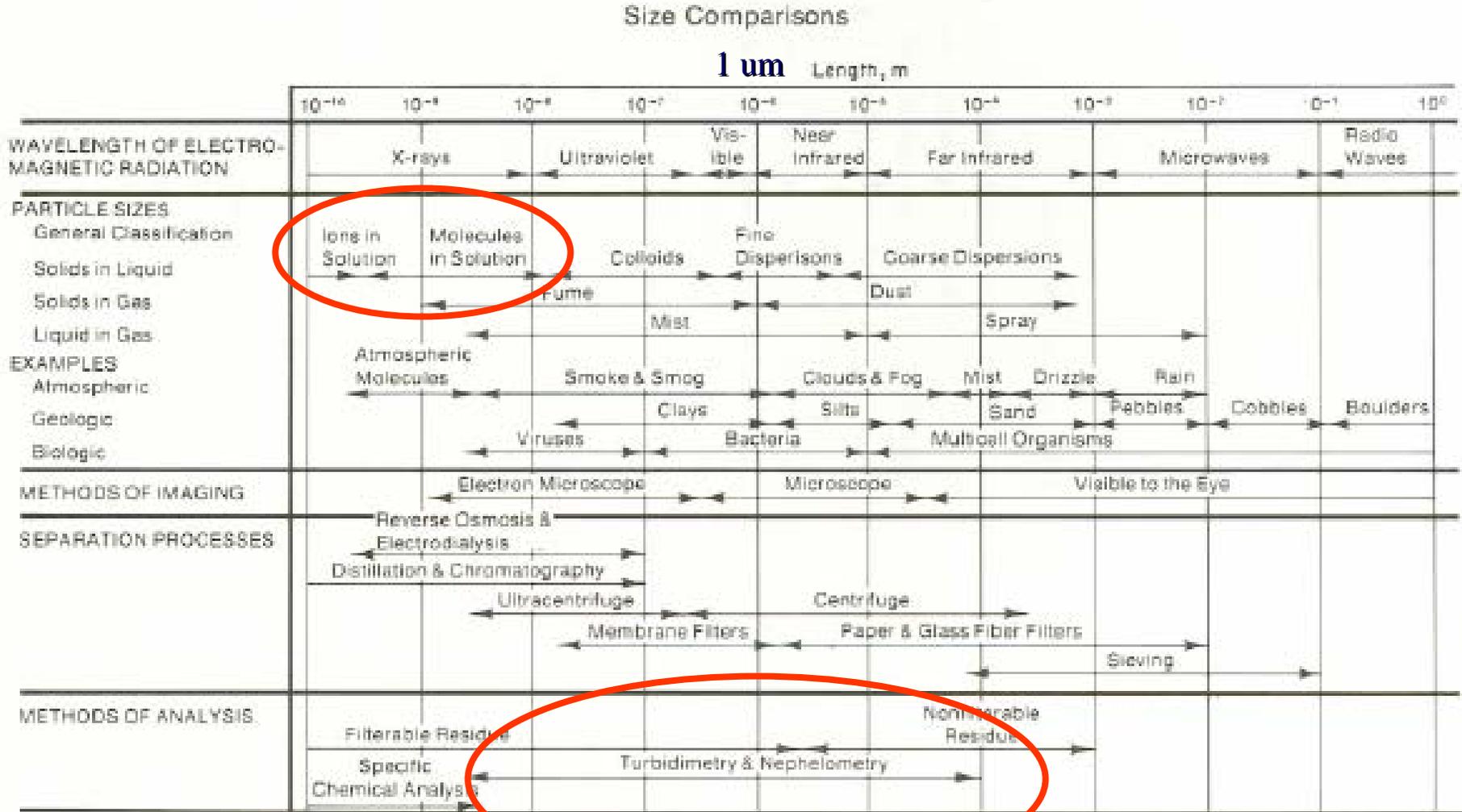
Trudy Bennett- [trudyben@usgs.gov](mailto:trudyben@usgs.gov), 316-773-3225

Teresa Rasmussen- [rasmuss@usgs.gov](mailto:rasmuss@usgs.gov), 785-832-3576

## Online Resource information:

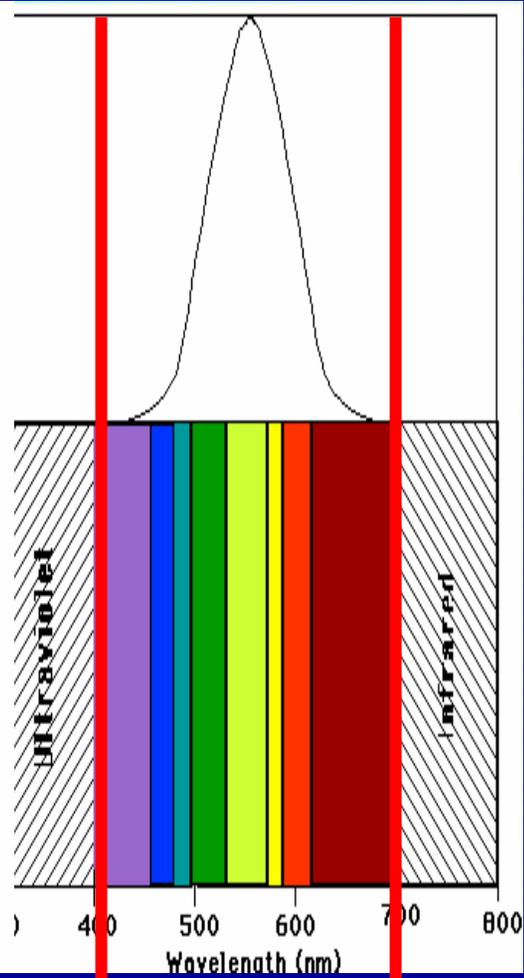
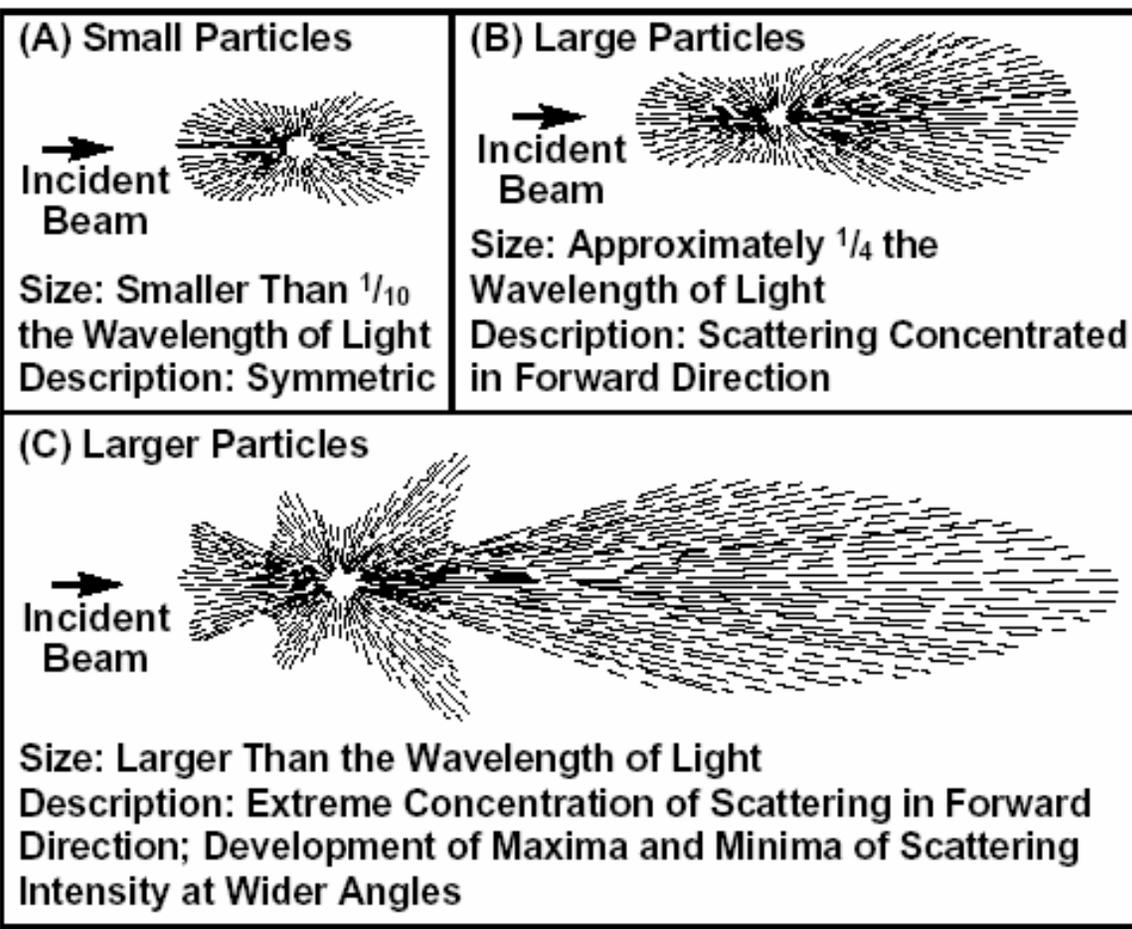
- <http://ks.water.usgs.gov/Kansas/rtqw/>
- <http://ks.water.usgs.gov/Kansas/pubs/reports/>
- [http://pubs.water.usgs.gov/tm1D3/--protocols for CWQM](http://pubs.water.usgs.gov/tm1D3/--protocols%20for%20CWQM)
- <http://water.usgs.gov/pubs/circ/2003/circ1250/>
- <http://water.usgs.gov/owq/FieldManual/index.html>

# Grain sizes and turbidity measurement



Units of measure: Angstrom,  $\text{\AA} = 10^{-10}\text{m}$ ; Micrometer,  $\mu\text{m} = 10^{-6}\text{m}$ ; Meter, m.

# Scattering of light by substances in water



ISO 7027  
GLI Method 2

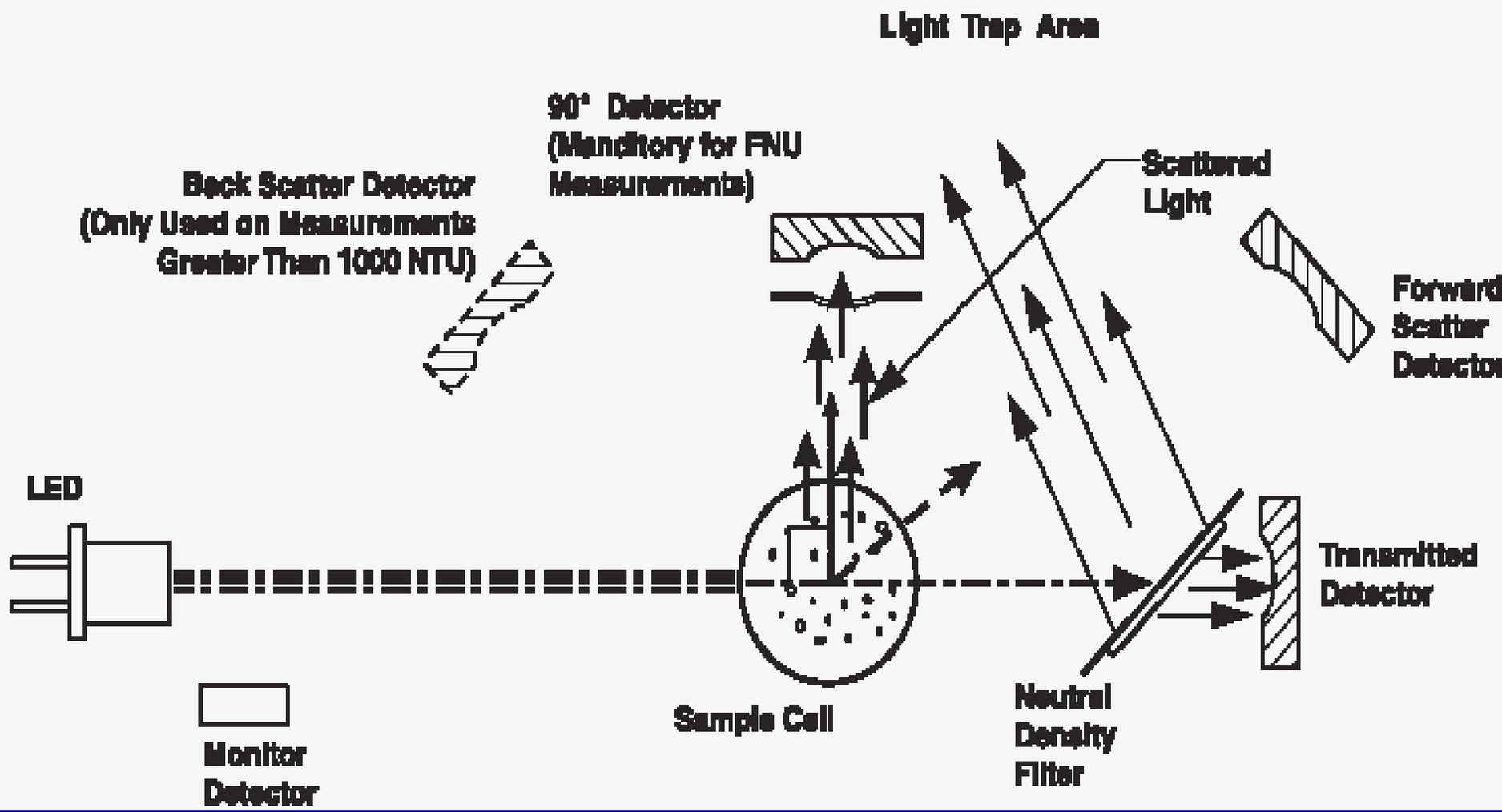
EPA 180.1

860



From Brumberger and other "Light Scattering"  
Science and Technology, 1968  
Reproduced from Sadar, 1998

Figure 4 2100NIS/ANIS Light Path Diagram for Low-Level Measurement



From Mike Sadar, Turbidity Instrument Comparison HACH, 1999  
Technical Information Series, 7063



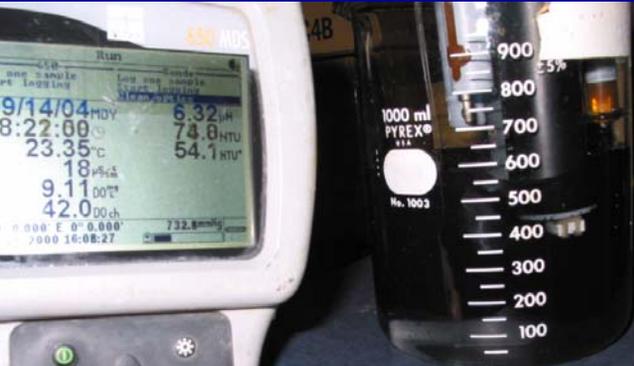
# Color can affect turbidity

Powder activated carbon

Kansas soil

Powdered limestone

400 milligrams per liter



YSI6026; 75 FNU  
YSI6136; 54 FNU



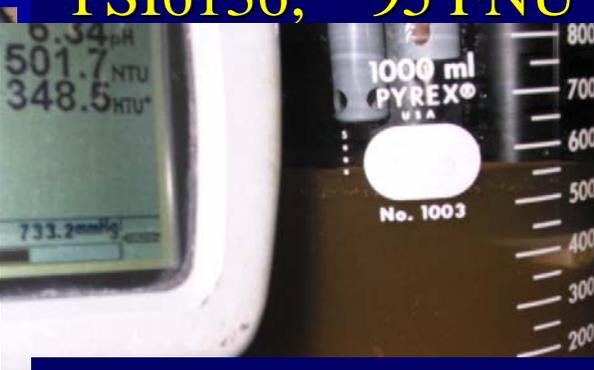
YSI6026; 124 FNU  
YSI6136; 95 FNU



YSI6026; 170 FNU  
YSI6136; 114 FNU



YSI6026; 140 FNU  
YSI6136; 50 FNU



YSI6026; 500 FNU  
YSI6136; 350 FNU



YSI6026; 540 FNU  
YSI6136; 410 FNU

1,600 milligrams per liter

# Method needs to be stored with the data

Reporting units corresponding to different turbidity instrument designs		
[nm, nanometers; °, degree]		
Detector geometry	Light Wavelength	
	White or broad band (with a peak spectral output of 400-680 nm)	Monochrome (spectral output typically near infrared, 780-900 nm)
Single Illumination Beam Light Source		
At 90° to incident beam	Nephelometric Turbidity Unit (NTU) <sup>a</sup>	Formazin Nephelometric Unit (FNU) <sup>b</sup>
At 90° and other angles. An instrument algorithm uses a combination of detector readings, which may differ for values of varying magnitude.	Nephelometric Turbidity Ratio Unit (NTRU)	Formazin Nephelometric Ratio Unit (FNRU)
At 30° ± 15° to incident beam (backscatter)	Backscatter Unit (BU)	Formazin Backscatter Unit (FBU)
At 180° to incident beam (attenuation)	Attenuation Unit (AU)	Formazin Attenuation Unit (FAU)
Multiple Illumination Beam Light Source		
At 90° and possibly other angles to each beam. An instrument algorithm uses a combination of detector readings, which can differ for values of varying magnitude.	Nephelometric Turbidity Multibeam Unit (NTMU)	Formazin Nephelometric Multibeam Unit (FNMU)

<sup>a</sup> Use of NTU: limited to instruments that comply with EPA Method 180.1 (U.S. Environmental Protection Agency, 1993).

<sup>b</sup> Use of FNU: pertains to instruments that comply with ISO 7027, the European drinking-water protocol (International Organization for Standardization, 1999), which includes many of the submersible turbidimeters that are in common use in the USGS for onsite measurements.

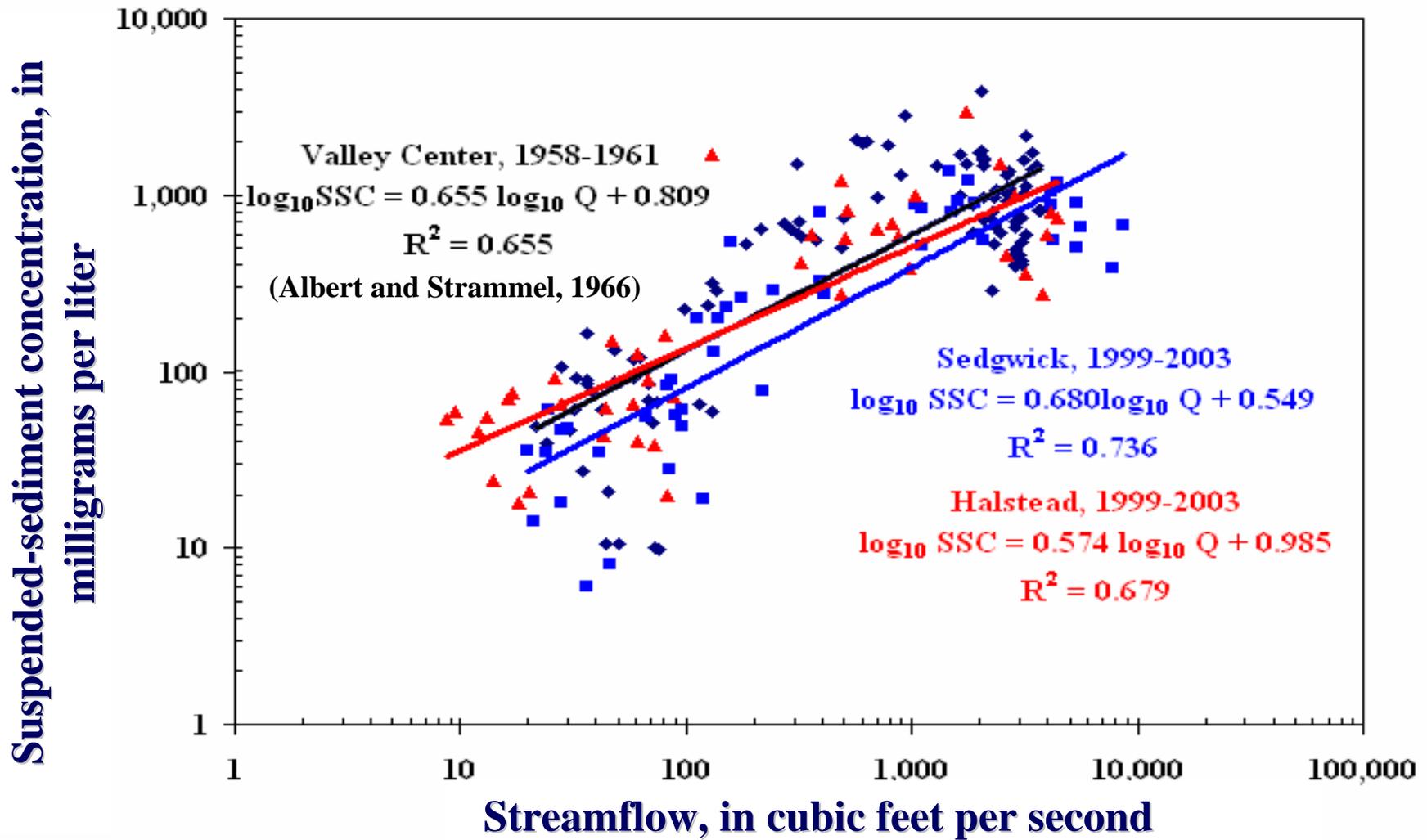
## REFERENCES

Anderson, C.W., 2004, Turbidity, (version 2): U.S. Geological Survey Techniques of Water-Resources Investigations, book 9, chap. A6, section 6.7, accessed September 24, 2004 from [http://water.usgs.gov/owq/FieldManual/Chapter6/6.7\\_contents.html](http://water.usgs.gov/owq/FieldManual/Chapter6/6.7_contents.html).

# Fouling of sensors increases operational costs

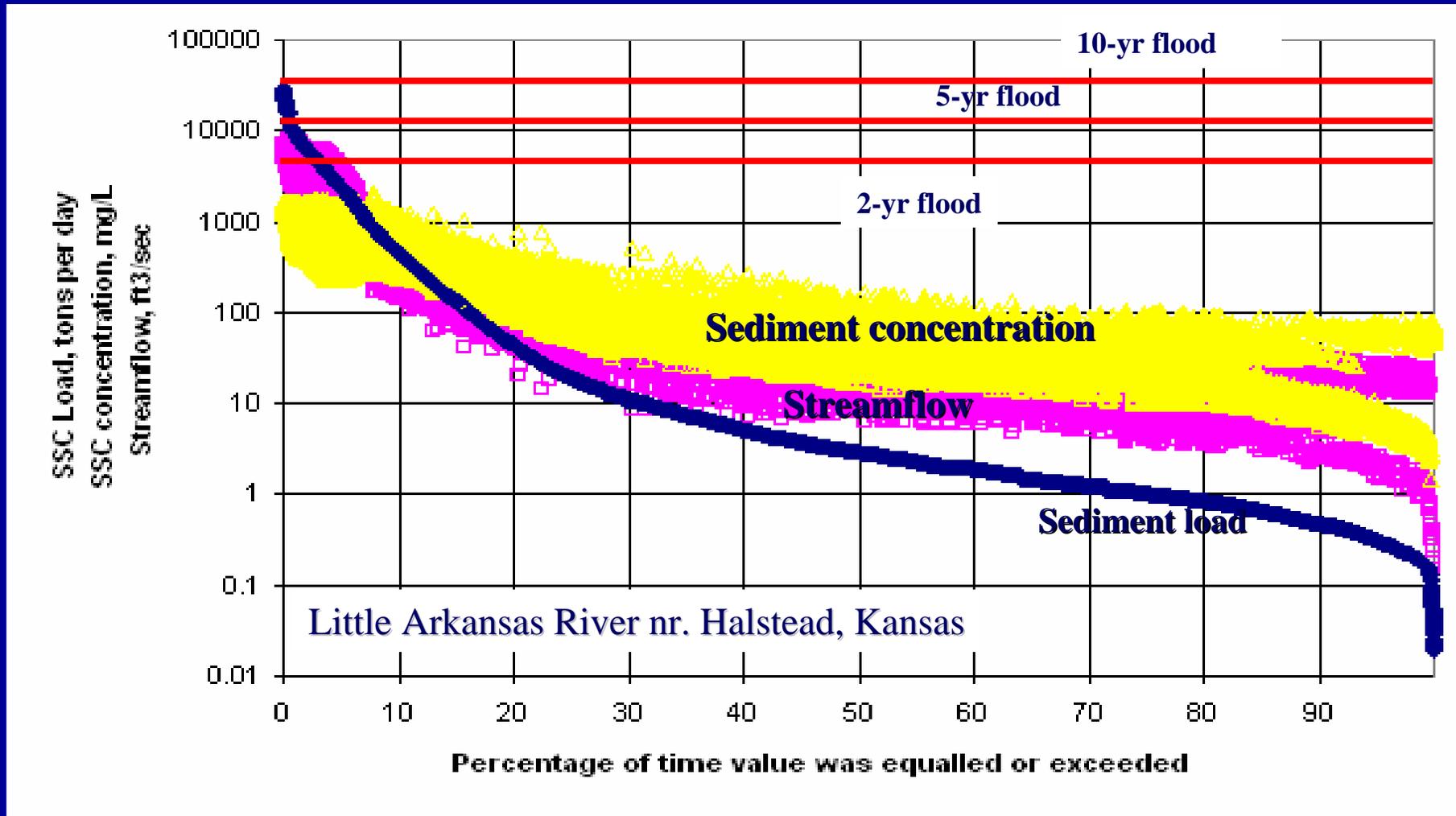


# Streamflow-estimated suspended-sediment concentration



- Q explains only about 70 percent of the variability
- Little change in relation in 40 years

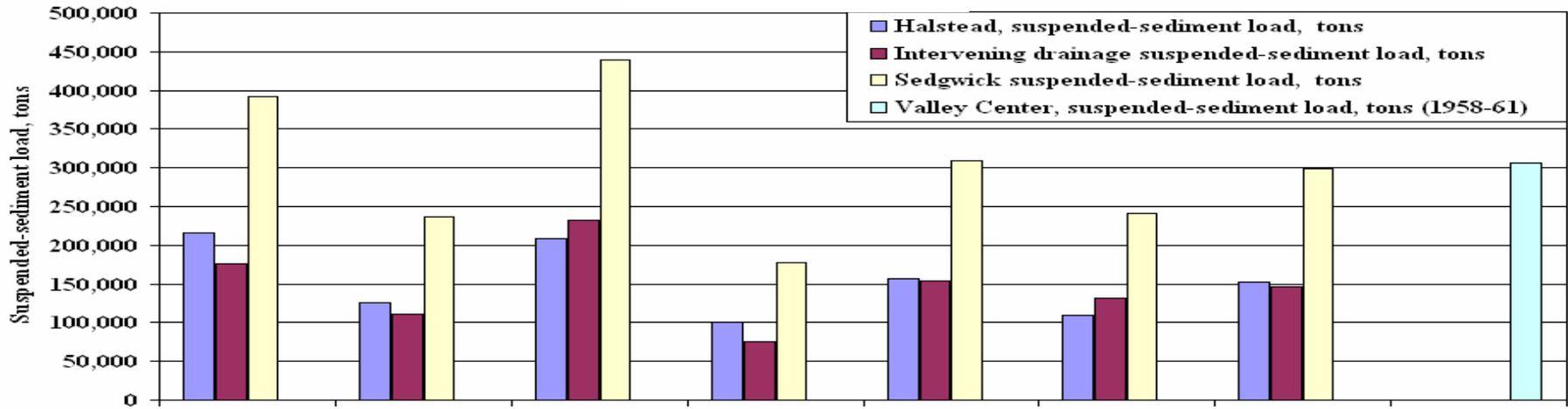
# How can changes be documented with factor of 10 variability in concentration and streamflow for the equivalent load?



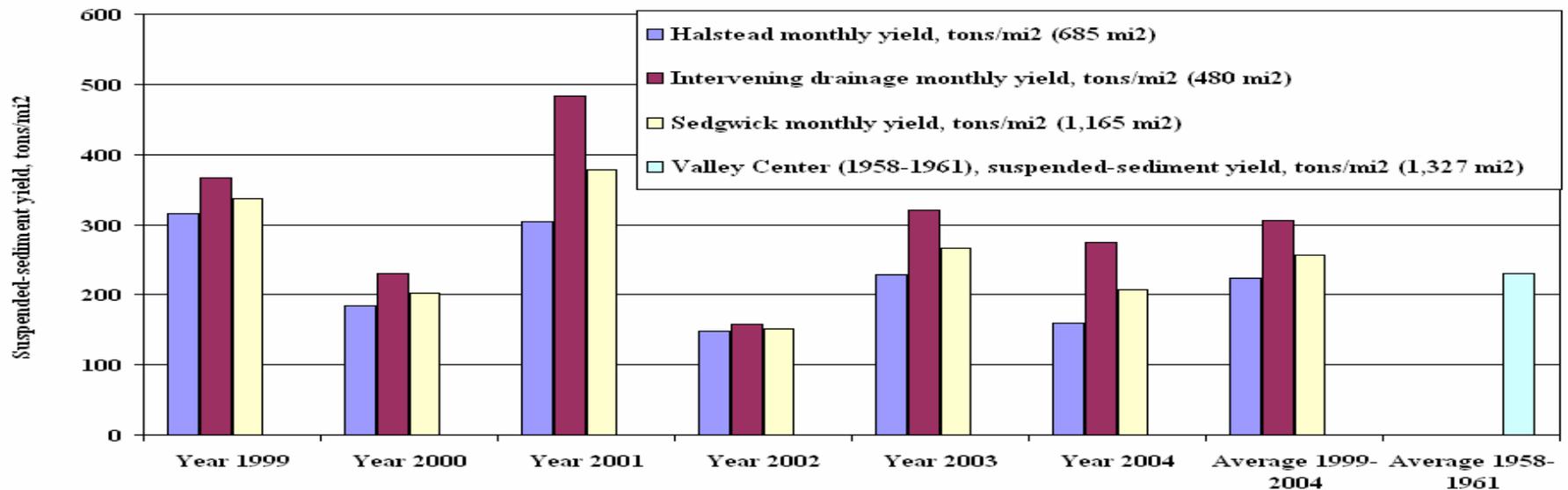
- Capture the variability during the largest streamflows
- Compare the storm yields

# Annual loads and yields unchanged in last 40 years

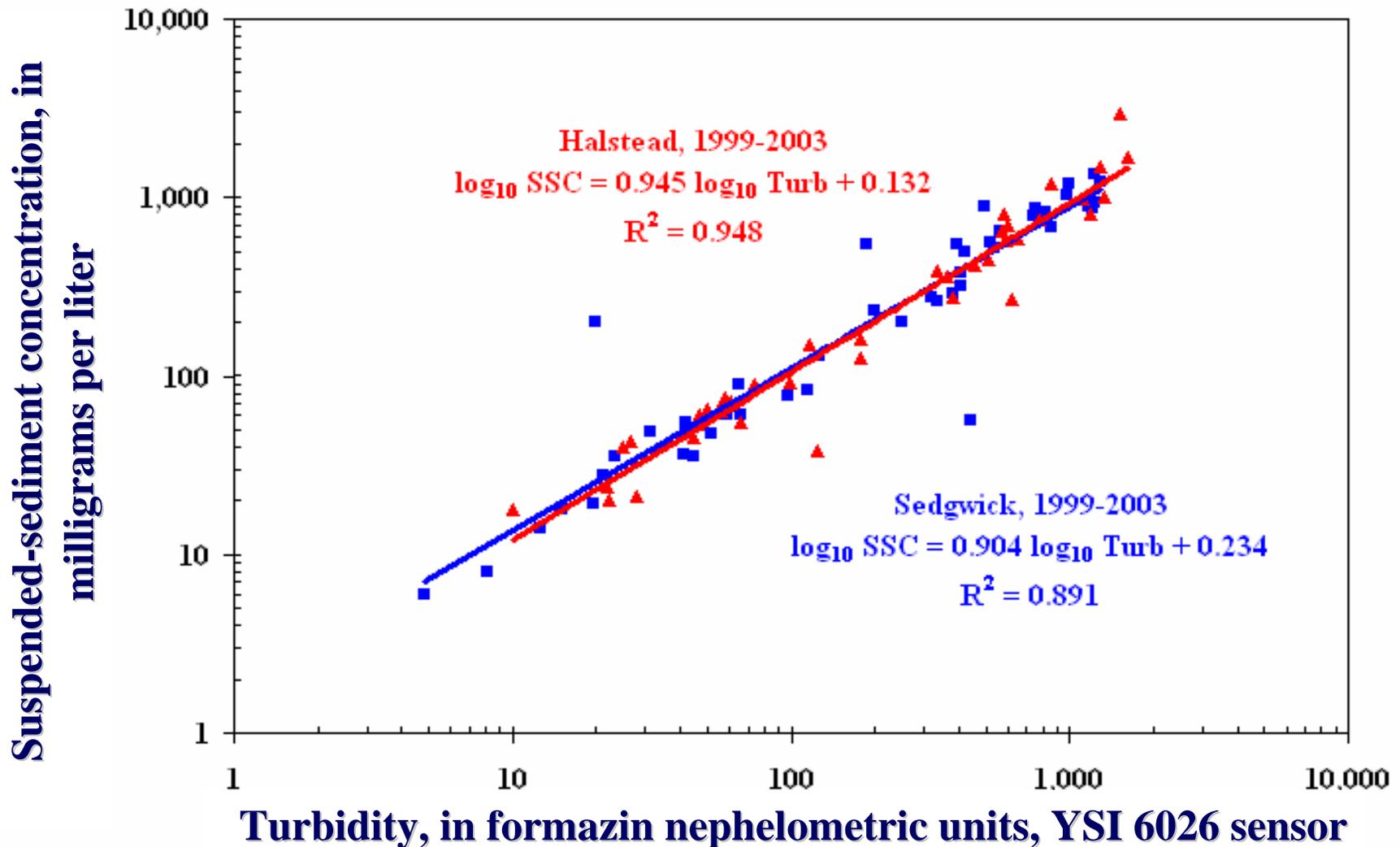
## Load



## Yield



# Turbidity provides an accurate estimate of suspended-sediment concentrations



# Estimated bacteria using 30-day geometric mean

