

# Stressor Identification -- Moving from Responses to Probable Causes: EPA's Causal Analysis/Diagnosis Decision Information System - CADDIS

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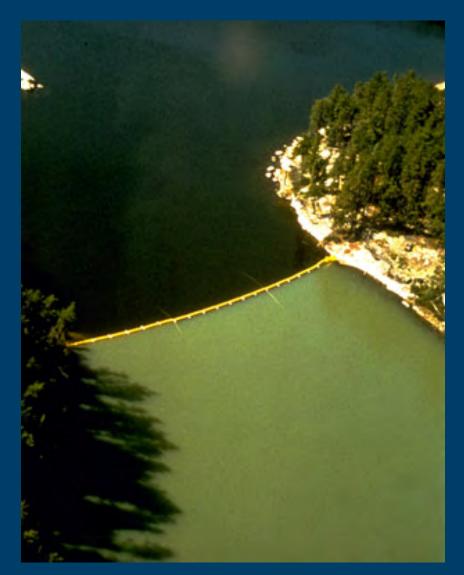




# **Identify the Stressor**

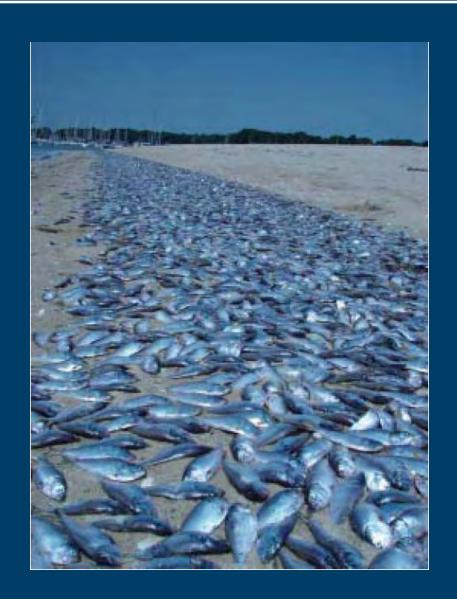
August 1973
 Canadian Lake 226

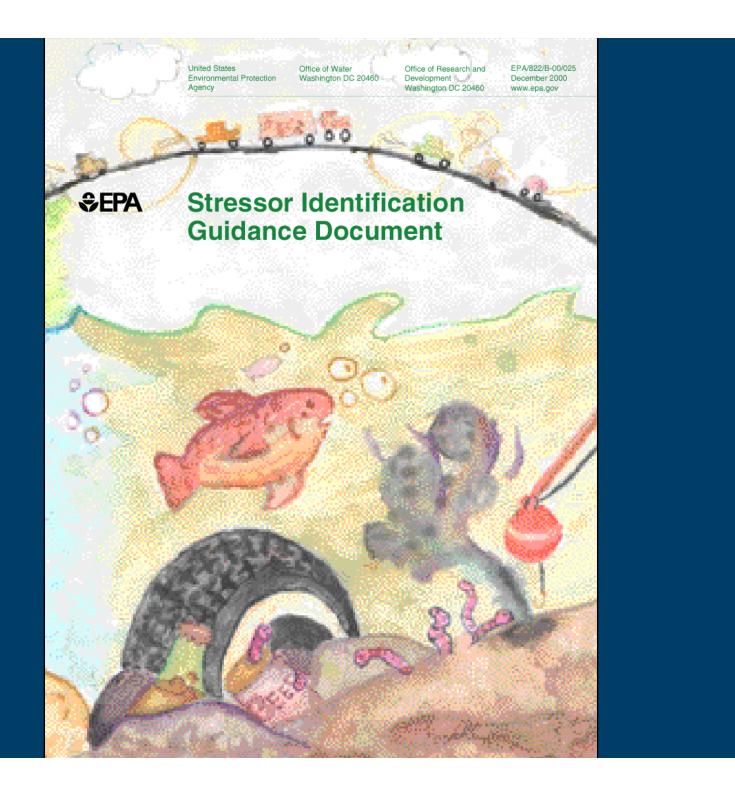
Nutrients? Which nutrient? N or P? Chemical spill?



# **Identify the Stressor**

- Greenwich Bay, RI.
   August 2003
- Nutrients?
   Hydrographic event?
   Chemical spill?
   Pathogens?

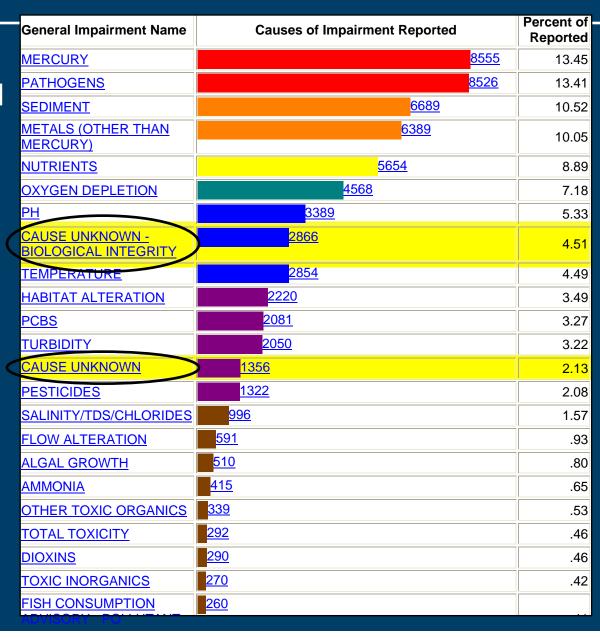




# Why Stressor Identification?

 Many states and several tribes use biological assessments to identify whether streams and small rivers are impaired.

 In many cases, causes of impairment are unknown.



# Why use a formal method?

- To convince stakeholders
- To increase confidence that remedial or restoration efforts can improve biological condition
- To identify causal relationships that are not immediately apparent
- To prevent biases and other lapses of logic

"Science is a way of trying not to fool yourself. The first principle is that you must not fool yourself — and you are the easiest person to fool." [Feynman 1964]

# We all make mistakes about causality

 We overweight meaningful chance events

Every time I wash my car it rains

We all have biases

Flow is always the real problem

We all think we know how to do it

This looks like the last site I studied, where DO was the problem

We form conclusions quickly, based on intuition & prior experiences...

...and because we're smart, we can ably defend our opinions

The # 1 reason for mistaken conclusions is *theory tenacity*!

# **Causation**

- One of the most difficult and controversial concepts in philosophy
- Only one reliable method for establishing causation:
   randomized, replicated, controlled experiment
- Unfortunately, this approach is not usually available

# What is CADDIS?



- Online application that helps users conduct causal assessments of stream biological impairment
  - Strength of evidence-based framework for stressor identification
  - Information on specific stressors, data analysis methods, etc.
  - Tools for data analysis & literature evaluation
  - Case studies



#### **Ouick Finder**

CADLit CADStat Case Studies Causal Assessment Background Getting Started with Data Analysis ICD Application Step-by-step Guide

The Causal Analysis/Diagnosis Decision Information System, or CADDIS, is a website developed to help scientists and engineers in the Regions, States, and Tribes conduct causal assessments in aquatic systems. It is organized into five volumes:

- . Volume 1: Stressor Identification provides a step-by-step guide for identifying probable causes of impairment in a particular system, based on the U.S. EPA's Stressor Identification process. If you are interested in conducting a complete causal assessment, learning about different types of evidence, or reviewing a history of causal assessment theory, start with this volume.
- Volume 2: Sources, Stressors & Responses provides background information on many common sources, stressors, and biotic responses in stream ecosystems. If you are interested in viewing source- and stressorspecific summary information (e.g., for urbanization, physical habitat, nutrients, metals, pH and other stressors), start with this volume.
- · Volume 3: Examples & Applications provides examples illustrating different steps of causal assessments. If you are interested in reading completed causal assessment case studies, seeing how Stressor Identification worksheets are completed, or examining example applications of data analysis techniques, start with this volume.
- Volume 4: Data Analysis provides guidance on the use of statistical analysis to support causal assessments. If you are interested in learning how to use data in your causal assessment, start with this volume.
- . Volume 5: Causal Databases provides access to literature databases and associated tools for use in causal assessments. If you are interested in applying literature-based evidence to your causal assessment, start with this volume.

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#### Top Three Questions

- 1. What's new in the 2010 release of CADDIS?
- 2. How do I cite CADDIS?
- 3. Where can I view a site map for CADDIS?

#### **CADDIS Navigation**

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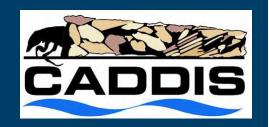
Volume 5: Causal Databases

#### **Recent Additions**

- 1. New Causal Assessment Background section
- 2. New source & stressor modules
  - O Urbanization
  - o Ammonia
  - O Herbicides
  - O Insecticides
  - O pH
  - O Physical habitat
- New causal assessment Case Studies
- 4. Revised Data Analysis section
- Expanded Interactive

Conceptual Diagram application

# **CADDIS** Organization



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[Step-by-Step Guide]

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[Examples, Databases]

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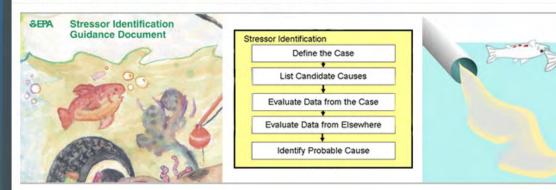
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# CADDIS Volume 1: Stressor Identification

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#### **Quick Finder**

Analogous Stressors Causal Pathway Evidence of Exposure Lab Test of Site Media Manipulation of Exposure Manipulation at Other Sites Mechanistically Plausible Cause Spatial/Temporal Co-occurrence

Stressor-Response from Simulation Models Stressor-Response from Lab Stressor-Response from Other Field Studies

Stressor-Response from the Case Symptoms Temporal Sequence Verified Predictions

CADDIS provides a pragmatic guide for determining the causes of detrimental changes and undesirable biological conditions observed in aquatic systems.

In this volume, we present a five-step process for conducting a causal assessment at a particular site:

- · Step 1: Define the Case
- Step 2: List Candidate Causes
- . Step 3: Evaluate Data from the Case
- Step 4: Evaluate Data from Elsewhere
- Step 5: Identify Probable Causes

This causal assessment process is derived from the Stressor Identification Guidance Document, published jointly by the Office of Water and the Office of Research and Development of the U.S. EPA. The basic approach remains the same, but several changes have been made to make the process more accessible.

This volume also contains additional materials supporting the SI process. Users new to SI may want to read through the Step-by-Step Guide Introduction. More experienced users may wish to jump directly pages on specific types of evidence (listed in the Quick Finder). Users interested in the historial and philosophical underpinnings of causal assessment may wish to review the Causal Assessment Background section.

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#### **Top Three Questions**

- 1. What are the most frequently used types of evidence from the
- 2. What are the most frequently used types of evidence using information from elsewhere?
- 3. Where can I view a site map of this volume?

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# **CADDIS Five Step Process**



Step 1: Define the case

Step 2: List candidate causes

Step 3: Evaluate data from the case

Step 4: Evaluate data from elsewhere

Step 5: Identify probable cause

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#### CADDIS Volume 2: Sources, Stressors & Responses







Deciding which pathways to consider in a causal assessment—that is, listing candidate causes as described in Step 2 of the SI process—sets the framework for causal assessment. This section of CADDIS provides background information on commonly encountered sources, stressors, and responses for use in deciding which candidate causes to consider, as well as in developing cases for or against those candidate causes in the actual assessment.

Each stressor module is organized into five sections, or tabs:

- Introduction provides a summary overview of the stressor, including a checklist of evidence that suggests
  including a given stressor in your assessment (i.e., listing it as a candidate cause).
- When to List provides more detailed information on the sources, activities, site evidence, and biologial
  responses that suggest inclusion as a candidate cause.
- Ways to Measure details different methods for quantifying the stressor.
- Conceptual Diagrams illustrates hypothesized causal linkages among the stressor, its sources, and associated biotic responses.
- · References lists the references cited throughout the module.

In addition, some stressor modules have a Literature Reviews tab, which presents an annotated bibliography of key references providing general background information, particularly regarding stressor-response relationships.

The source module for urbanization contains similar summary information on effects of urban development on stream ecosystems, but it is presented in a different format. The module is organized using a simple schematic of how urbanization affects streams. Users can click on any shape in the schematic to navigate through the module and focus on areas of interest; within each section (i.e., under each shape) the user can click on additional topic boxes for more detailed information.

Ammonia Dissolved Oxygen Flow Alteration Herbicides Insecticides Ionic Strength Metals Nutrients

pH Physical Habitat Sediments Temperature
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Urbanization

#### **Top Three Questions**

- What are sources, stressors & responses?
- Is there additional literature-based information available for these sources, stressors & responses?
- 3. Can I view a site map of this volume?

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## Nutrients

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Figure 1. A cyanobacterium (Nodularia spumigens) bloom in the Gippsland Lakes, Victoria, Australia in January, 2002.
Courtesy of J.D. Kinnon, Wood's Hole Oceanographic Institute.

Nutrients are elements that are essential for plant growth, including nitrogen (N), phosphorus (P), potassium (K), calcium (Ca), magnesium (Mg), sulfur (S), and silicon (Si). N, P, and K are considered primary nutrients, and N and P are the major limiting nutrients in most aquatic environments.

When considering candidate causes, N and P are evaluated to determine the trophic status (or relative nutrient condition) of freshwater systems. In lakes, streams, large rivers, and estuaries, trophic status may be expressed in terms of oligotrophy (low nutrients, minimally productive), mesotrophy (moderate nutrients, moderately productive), or eutrophy (high nutrients, highly productive).

In most cases, nutrients are not proximate stressors for aquatic communities. Although certain forms of N [i.e., unionized ammonia (NH3), nitrite (NO2-) and, in

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#### Examples

Case studies

Authors: J.C. Kurtz, M.B. Griffith, M.A. Morrison, C.E. Hornig

some cases, nitrate (NO3-)] may be toxic, these effects are considered in the ammonia and unspecified toxic chemicals modules. Nutrients have indirect adverse effects on aquatic communities through their effects on primary production, the growth and accumulation of plant and algal biomass, and the species composition of algae (i.e., phytoplankton in lakes or

periphyton in streams) and other plant assemblages (Figures 1 and 2); Dodds and Welch 2000).

Increasing primary production and changes in plant species composition can be proximate causes of effects on consumers (i.e., macroinvertebrates and fish) by:

 Altering food resources: the amount of food resources, their type (e.g., living plant and algal biomass versus detritus), or their palatability (e.g., changes in cell size in algae for filter-feeding animals);



Consider listing nutrients as a candidate cause when the following sources and activities, site evidence, and biological effects are present:

#### Sources and Activities

- Wastewater treatment plant effluents
- Industrial effluents
- Municipal landfills and waste disposal sites
- Animal feed lots or confined animal feeding operations
- Construction and development sites
- Combined stormwater and sanitary sewers
- · Agricultural and irrigation runoff
- Runoff from impervious surfaces associated with urban or other developed areas
- Pasture and rangeland runoff
- · Septic systems
- · Atmospheric deposition
- Landscaping runoff, such as from residential lawns, golf courses, and athletic fields

#### Site Evidence

- Proliferation of filamentous algae or algal mats
- Phytoplankton blooms (i.e., green water)
- Abundant macrophytes

#### **Biological Effects**

- Alteration of algal assemblages (i.e., phytoplankton or periphyton)
- Alteration of invertebrate assemblages (i.e., zooplankton or benthic macroinvertebrates)
- Fish kills

Consider these commonly associated candidate causes when listing nutrients as a candidate cause:

- Dissolved oxygen
- Temperature
- · Suspended and bedded sediments
- pH
- Ammonia toxicity
- Pathogens
- · Co-migrating contaminants

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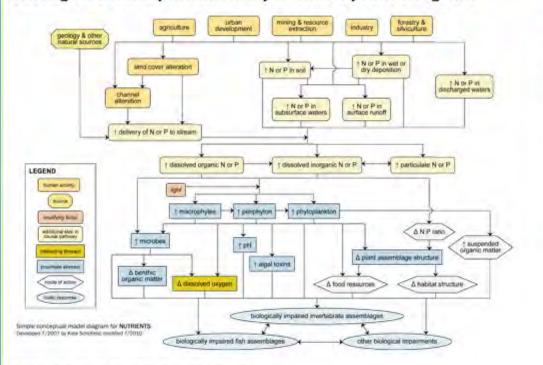
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## Nutrients

Introduction When to List Ways to Measure Conceptual Diagrams References

# Nitrogen & Phosphorus: Simple Conceptual Diagram



#### Diagram Options

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- . Detailed diagram for P
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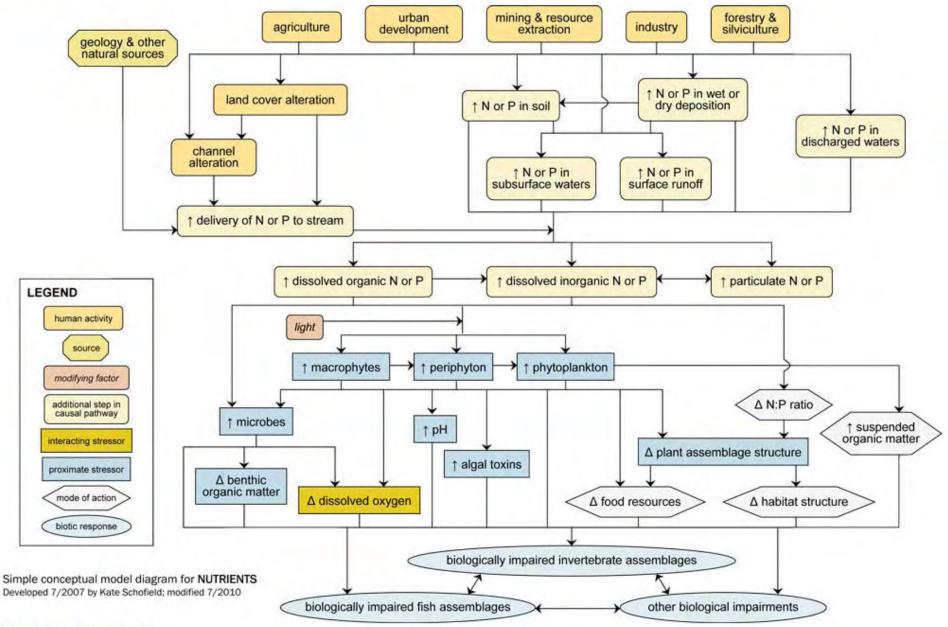
- Diagram PDF for N & P [1 p, 76 K, About PDF]
- . Diagram PPT for N & P
- Narrative PDF for N & P [2 pp. 19 K, About PDF]

Click diagram to view larger version

## Diagram narrative

Enrichment of aquatic systems due to excess nutrient concentrations is a common cause of biological impairment. Although aquatic plants and microbes require nitrogen (N) and phosphorus (P) for growth and reproduction, excess nutrient inputs may adversely affect biotic communities. Often these excess inputs of N and P are related to human activities and sources in the watershed, which influence in-stream nutrient concentrations via six dominant pathways: (1) by increasing the delivery of N or P from the watershed;

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## Nutrients

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APHA (American Public Health Association); AWWA (American Water Works Association); WEF (Water Environment Federation) (1998)
Standard Methods for the Examination of Water and Wastewater (20th edition). American Public Health Association, Washington DC.

References

Conceptual Diagrams

ASTM (1999) Annual Book of ASTM Standards. American Society for Testing and Materials, Philadelphia PA.

Barbour MT, Gerritsen J, Griffith GE, Frydenborg R, McCarron E, White JS, Bastian ML (1996) A framework for biological criteria for Florida streams using benthic macroinvertebrates. Journal of the North American Benthological Society 15:185–211.

Barbour MT, Gerritsen J, Snyder BD, Stribling JB (1999) Rapid bioassessment protocols for use in wadeable streams and rivers: periphyton, benthic macroinvertebrates, and fish (2nd edition). U.S. Environmental Protection Agency, Office of Water, Washington DC. EPA 841-B-99-002.

Carlson RE, Simpson J (1996) A Coordinator's Guide to Volunteer Lake Monitoring Methods. North American Lake Management Society. 96 pp.

Clarke KR, Warwick RM (1994) Change in Marine Communities: An Approach to Statistical Analysis and Interpretation. Plymouth Marine Laboratory, National Research Council.

Deshon JE (1995) Development and application of the Invertebrate Community Index (ICI). Pp. 217–243 in: David WS, Simon TP (Eds). Biological Criteria and Assessment: Tools for Risk-Based Planning and Decision Making. Lewis Publishers, Boca Raton FL.

Dodds WK, Welch EB (2000) Establishing nutrient criteria in streams. Journal of the North American Benthological Society 19 (1):186-196.

Griffith MB, Hill BH, McCormick FH, Kaufmann PR, Herlihy AT, Selle AR (1995) Comparative application of indices of biotic integrity based on periphyton, macroinvertebrates, and fish to southern Rocky Mountain streams. Ecological Indicators 5:117-136.

Klemm DJ, Blocksom KA, Fulk FA, Herlihy AT, Hughes RM, Kaufmann PR, Peck DV, Stoddard JL, Thoeny WT, Griffith MB, Davis WS (2003) Development and evaluation of a macroinvertebrate biotic integrity index (MBII) for regionally assessing Mid-Atlantic Highlands streams. Environmental Management 31:656-669.

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## Ammonia

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Figure 1. Landfill settling pond. Courtesy of U.S. EPA Region 10: The Pacific Northwest, KPC Photo Gallery.

Ammonia (NH3) is a common toxicant derived from wastes (Figure 1), fertilizers, and natural processes. Ammonia nitrogen includes both the ionized form (ammonium, NH4+) and the unionized form (ammonia, NH3). An increase in pH favors formation of the more toxic unionized form (NH3), while a decrease favors the ionized (NH4+) form. Temperature also affects the toxicity of ammonia to aquatic life. Ammonia is a common cause of fish kills, but the most common problems associated with ammonia relate to elevated concentrations affecting fish growth, gill condition, organ weights, and hematocrit (Milne et al. 2000).

Exposure duration and frequency strongly influence the severity of effects (Milne et al. 2000).

Ammonia in sediments typically results from bacterial decomposition of natural and anthropogenic organic matter that accumulates in sediment. Sediment microbiota mineralize organic nitrogen or (less commonly) produce ammonia by dissimilatory nitrate reduction. Ammonia is especially prevalent in anoxic sediments because nitrification (the

oxidation of ammonia to nitrite [NO2-] and nitrate [NO3-]) is inhibited. Ammonia generated in sediment may be toxic to benthic or surface water biota (Lapota et al. 2000).

#### Related Links

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- Temperature
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- ICD
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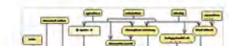
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Authors: G.W. Suter II, S.M. Cormier, K. Schofield, M. Bowersox, H. Latimer

Ammonia also exerts a biochemical oxygen demand on receiving waters (referred to as nitrogenous biological oxygen demand or NBOD) because dissolved oxygen is consumed as bacteria and other microbes oxidize ammonia into nitrite and nitrate. The resulting dissolved oxygen reductions can decrease species diversity and even cause fish kills. Additionally, ammonia can lead to heavy plant growth (eutrophication) due to its nutrient properties (see the Nutrients module). Conversely, algae and macrophytes take up ammonia, thereby reducing aqueous concentrations.

Checklist of sources, site evidence and biological effects



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# Dissolved Oxygen

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Figure 1. This natural stream in a forest setting has water flowing over boulders, causing turbulence and aeration.

Courtesy of Eric Vance, U.S. EPA.

Dissolved oxygen (DO) refers to the concentration of oxygen gas incorporated in water. Oxygen enters water by direct absorption from the atmosphere, which is enhanced by turbulence (Figure 1). Water also absorbs oxygen released by aquatic plants during photosynthesis. Sufficient DO is essential to growth and reproduction of aerobic aquatic life (e.g., see Murphy 2006, Giller and Malmqvist 1998, Allan 1995).

Advice for deciding whether to include depleted or (less commonly) excessive DO as a candidate cause is provided in this module.

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- Flow alteration

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Case studies

Authors: S.K.M. Marcy, G.W. Suter II, S.M. Cormier

# Checklist of sources, site evidence and biological effects

This module addresses low or excessive DO as a proximate stressor, that should be listed as a candidate cause when potential human sources and activities, site observations, or observed effects support portions of the source-to-impairment pathways in the conceptual diagram for DO (Figure 2). A checklist is provided below to help you identify key data and information useful for determining whether to include DO among your candidate causes; for more information on specific sources and activities, site evidence, and biological effects listed in the checklist, click on checklist headings or go to the When to List tab of this module.



Figure 2. A simple conceptual diagram illustrating causal



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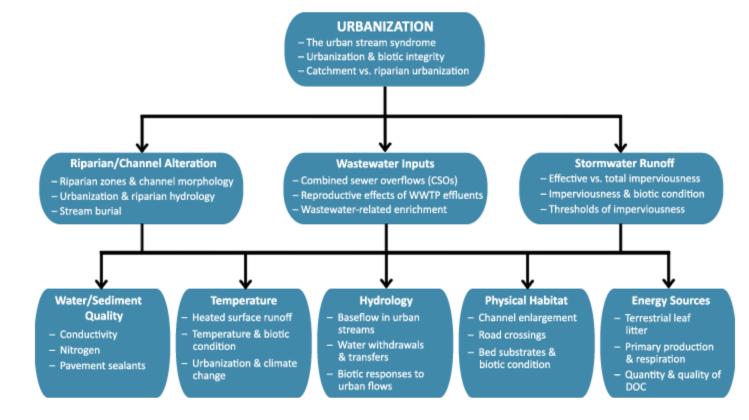
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Click on any heading to see more detailed information about that pathway. Click on subheadings to read more about highlighted topics under each heading.

Urbanization is an increasingly pervasive land cover transformation that significantly alters the physical, chemical and biological environment within surface waters.

The diagram above provides a simple schematic illustrating pathways through which urbanization may affect stream ecosystems. **Riparian/channel alteration**, **wastewater inputs** and **stormwater runoff** associated with urbanization can lead to changes in five general stressor categories: **water/sediment quality**, water **temperature**, **hydrology**, **physical habitat** within the channel, and basic **energy sources** for the stream food web.

This module is organized along these pathways. You can learn more about urban stream sources and stressors by clicking on these headings in the diagram above. You can click on subheadings within each shape to learn about specific topics in greater detail. To return to this organizational diagram from any point in the module, simply click on the Urbanization link in navigation bar (at left) or



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#### CADDIS Volume 3: Examples & Applications



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#### This volume provides examples that illustrate different aspects of a causal analysis.

- The Analytical Examples section provides examples illustrating the use of different data analyses to inform
  particular types of evidence. If you are interested in seeing how data analysis techniques can be applied in
  causal assessment, start with this section.
- The Worksheets section provides examples from the Little Scioto River in Ohio, one of the first Stressor Identification-based causal analyses conducted. These examples are presented as "worksheets" that one might complete as one conducts a causal analysis, so this section is a good place to start if you are planning on conducting a complete causal assessment.
- The Case Studies section provides brief summaries of completed causal assessments, as well as links to full
  case study reports. If you are interested in seeing how others have conducted causal assessments, start with this
  section.
- The State & Other Regulatory Examples section describes how different states have incorporated causal
  analysis and stressor identification (SI) in their water quality programs. If you are interested in seeing who is
  using the SI process and how they are using it, start with this section.
- The Galleries section provides examples of relationships that have been observed between common stressors
  and biological responses. If you are interested in viewing or downloading example stressor-response figures,
  start with this section.

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#### **Top Three Questions**

- Where are examples of completed case studies?
- How do I determine if a stressor co-occurs with the effect?
- 3. Where can I get a site map for this volume?

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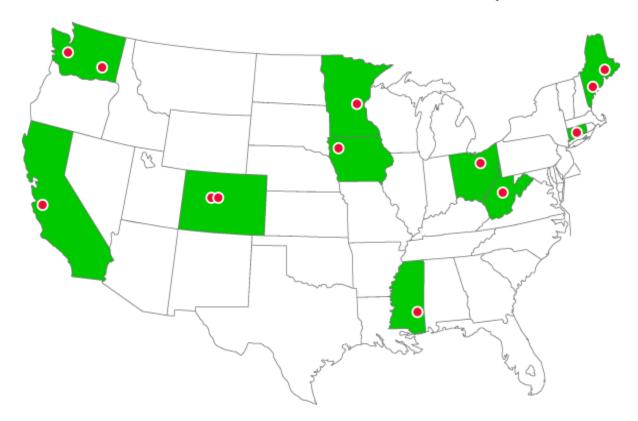
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## Case Studies

These reports provide examples of how some assessors have developed and interpreted evidence to determine causes of biological impairments, and in some cases improved the quality of an ecosystem. They provide different examples of how to organize an assessment report, analyze data, and present results. Most of the cases assess rivers and streams, but a few assess terrestrial ecosystems.

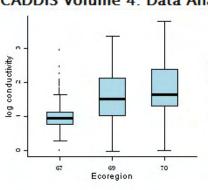
The process for identifying causes of biological impairments continues to improve. As a result you will note differences among the case studies. In some examples, comments have been inserted by the U.S. EPA editor or the authors. These comments are not meant to indicate that these causal analyses are in error, but to assist other SI users by suggesting alternative approaches that may be applied to their cases.

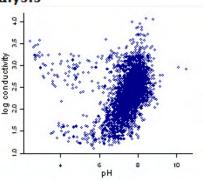
#### Click on a location to view details about its case study.

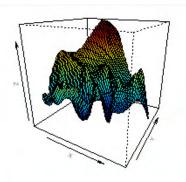


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# CADDIS Volume 4: Data Analysis







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Autocorrelation Classification and Regression Trees Conditional Probability Confounding Controlling for Natural Variability Correlation Analysis Interpreting Statistics Multivariate Data Exploration PECBO Propensity Scores Quantile Regression Regression Analysis Scatterplots Spatial Analysis and GIS SSDs Tests of Significant Difference Traits

This volume of CADDIS was developed as a reference for users seeking information on different analytical techniques that can be applied to causal analysis.

Data analysis is a key phase of a causal assessment. In many cases, statistical analyses can be used to inform different types of evidence and strengthen confidence in the results of causal assessments.

The materials in this volume have been organized into topic areas (listed at right) which may be read individually or in sequence. Most materials were written for users with a basic background in statistics. Some topic areas also include advanced materials on an optional "Details" page.

- Selecting an Analysis Approach: initial guidance for selecting appropriate analyses that can inform different phases of a causal analysis.
- Getting Started: things to think about before you start analyzing data.
- Basic Principles & Issues: basic concepts to keep in mind while analyzing observational data.
- Exploratory Data Analysis: techniques for becoming familiar with your data.
- Basic Analyses: "building block" statistical methods.
- Advanced Analyses: statistical methods requiring knowledge of one or more basic techniques.
- Download Software: implementations of some basic and advanced techniques.

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#### **Top Three Questions**

- Where can I download CADDIS software?
- 2. How can I analyze my data?
- 3. Can I view a site map of this volume?

#### **CADDIS Navigation**

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## CADDIS Volume 4: Data Analysis





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You are here: EPA Home » CADDIS » Data Analysis » Basic Principles & Issues: Confounding

# **Basic Principles & Issues**

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Causal Databases

# Confounding

The effect of a stressor on a measure of biological condition (i.e., the stressor-response relationship) may be misunderstood if other environmental variables or stressors that may affect the biological measure are ignored. In many cases, a simple relationship observed

Interpreting Statistics

Author: D. Farrar

between a measure of biological condition and a single stressor may reflect the effects of additional stressors. For example, increased urban land use encompasses many different stressors (e.g., increased flow flashiness, increased concentrations of different pollutants, and degraded physical habitat), all of which can influence the aquatic biological community.

Analyses to estimate stressor-response relationships often must take measures to avoid attributing biological effects to a single stressor when observed effects are as readily attributable to simultaneous exposure to multiple, associated stressors. This issue is particularly important when estimating stressor-response relationships from large, regional data sets, in which multiple, associated stressors are common.

## Identifying concomitant variables

We use the term *concomitant variables* for variables that might confound estimates of the effect of a stressor variable on a measure of biological condition. Conceptual diagrams showing linkages between sources, stressors, and biological responses can help one identify a set of concomitant variables. In particular, one should look for variables that provide alternate pathways linking the stressor of interest and the biological effect, and include variables that block these pathways (see Confounding: Details for more information).

## One approach for controlling for confounding variables

For a basic data analysis tool that can address confounding to some degree, we emphasize scatterplots in combination with stratification. Stratification breaks the dataset into subsets (i.e., strata) that are relatively homogeneous with respect to one or more concomitant variables. If there is adequate variation within strata for the stressor of interest, one can evaluate the stressor-response relationship with concomitant variables approximately fixed, minimizing their influence on the

Table 1. Percent substrate sand/fines (SED) in different strata. Column labeled as r shows the correlation coefficient between total nitrogen and SED within each stratum

# CADDIS Volume 4: Data Analysis

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You are here: EPA Home » CADDIS » Data Analysis » Download Software: Overview

## **Download Software**

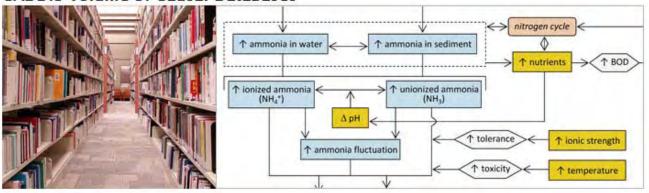
Overview | CADStat | SSD Generator | R Command Line Tutorial

This section provides access to tools that you can download and use to analyze your data. Three tools currently are available:

- Tool 1: CADStat. CADStat is a menu-driven package of several data visualization and statistical methods, based on JGR
  (a Java Graphical User Interface to R).
- Tool 2: Species Sensitivity Distribution (SSD) Generator. The SSD Generator is a Microsoft Excel template that
  allows you to calculate and plot the proportion of species affected at different levels of exposure in laboratory toxicity
  tests.
- Tool 3: R Command Line Tutorial. On this page, you can download R scripts (i.e., programs) and sample data to walk
  through a primer on R, a free statistical software package. Background material and R scripts for predicting environmental
  conditions from biological observations also are available in a separate section.

The tools you select depend on the methods you need and your comfort level with programming. If you are **inexperienced with programming**, we recommend you begin by using the tools that do not require programming expertise. CADStat for, example, will allow you to conduct several types of statistical analyses using a menu-driven interface, and the Species Sensitivity Distribution (SSD) Generator provides detailed instructions and macros that may be used to generate an SSD. If you are **familiar with the R statistical package**, you may wish to use our more complex tools which require some knowledge of command-line statistical programming and provide more analytical flexibility.

#### CADDIS Volume 5: Causal Databases



#### **Ouick Finder**

CADLit Advanced Search CADLit Keyword Search CADLit User Guide ICD Application

This section of CADDIS provides two tools (at right) to help users access and apply literature-based evidence in their causal assessments. These tools are designed for users interested in finding and compiling scientific literature (peer-reviewed and other) to support or weaken the cases for particular causal

A key part of causal assessment is taking what has been learned about causal pathways in other systems and using that knowledge to inform the current assessment. In the Stressor Identification process, this application of previous research typically occurs in Step 2: List Candidate Causes and Step 4: Evaluate Data from Elsewhere.

ICD Quick Start Instructions ICD User Guide

ructions Viewing ICDs Editing ICDs

- The Interactive Conceptual Diagram (ICD)
   application uses conceptual diagrams as an
   organizing framework to provide supporting
   literature for linkages among different sources,
   stressors, and responses. Users can view
   literature linked to existing diagrams by clicking
   on diagram shapes, as well as create and
   populate their own diagrams with supporting
   literature.
- The CADDIS Literature Resource (CADLit)
  contains information on stressor-response
  associations reported in the peer-reviewed
  scientific literature. Currently, the stressors
  considered in CADLit include metals, sediment,
  and nutrients, although literature dealing with
  other stressors currently is being added.

Contact Us



#### **Top Three Questions**

- How do I access the ICD application?
- 2. How do I access CADLit?
- 3. Can I view a site map of this volume?

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pathways.

# The ICD application



- Visual tool for organizing & accessing cause-effect information
- > 400 papers
  - Metals

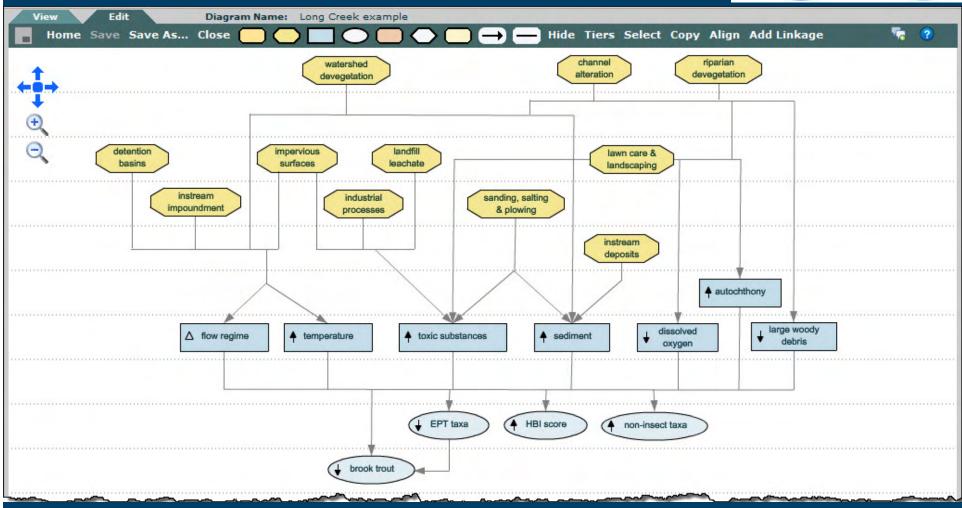
Temperature

Sediment

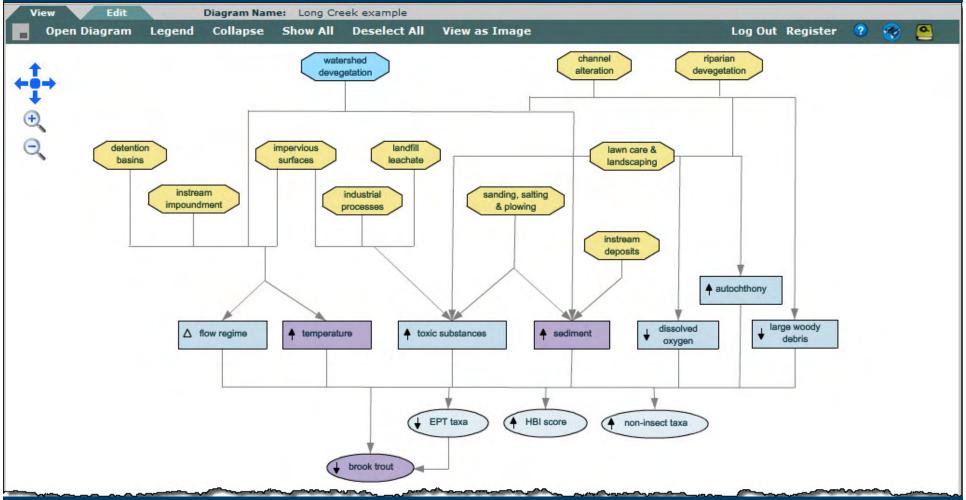
- Urbanization
- Nitrogen & phosphorus
- 2 modes
  - View mode: access supporting literature for selected linkages (shape pair combinations)
  - Edit mode: create & modify diagrams, link supporting literature to diagrams

# An ICD example...

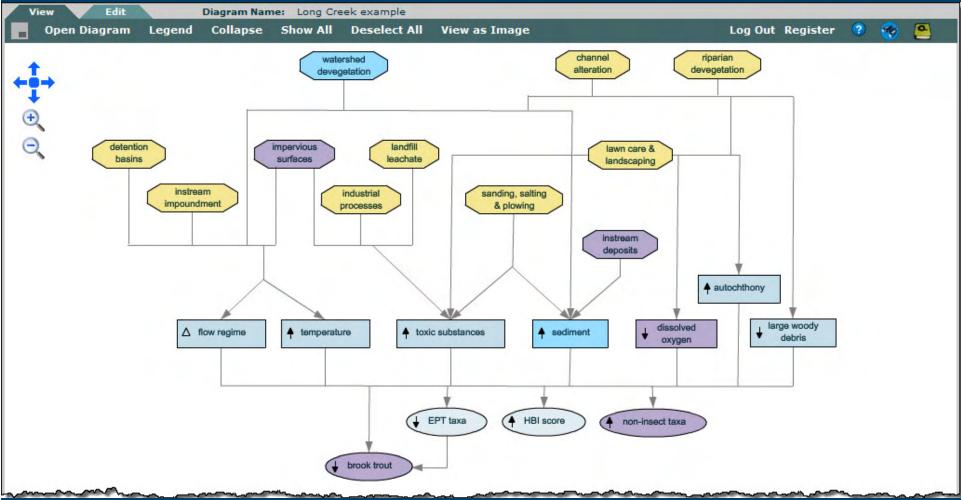




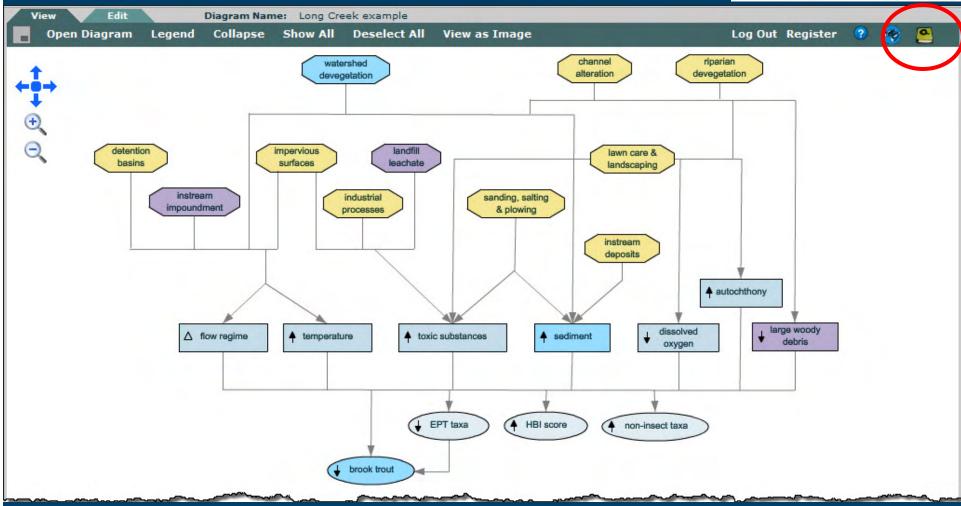




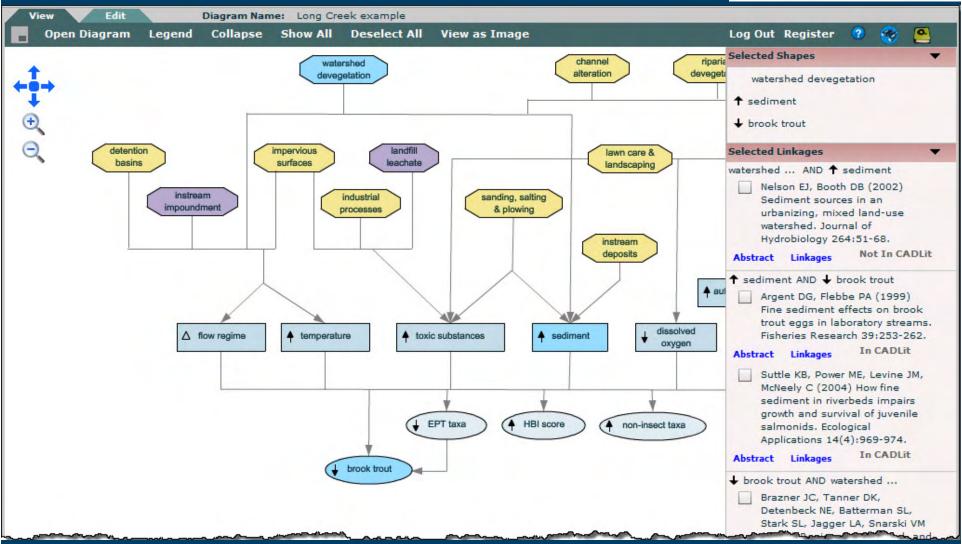












## CADDIS Volume 5: Causal Databases

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**Administrator Tools** 

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Causal Databases ICDs **CADLit** 

CADLit contains stressor-response information for multiple stressor exposures reported in the peer-reviewed scientific literature.

As part of a causal analysis, CADLit can help you:

- Identify candidate or potential causes of impairment by providing information that may support or negate causal pathways in conceptual model diagrams.
- Support or negate the contribution of a specific stressor to an impairment by providing qualitative and quantitative data from other studies of similar stressor scenarios.

At this time, CADLit contains information for metals, sediment, and nutrients identified through literature searches up to 2009. We continue to expand the scope of the CADLit to include more stressors and types of information, so please contact with suggestions for additions (including submission of new papers by the authors).

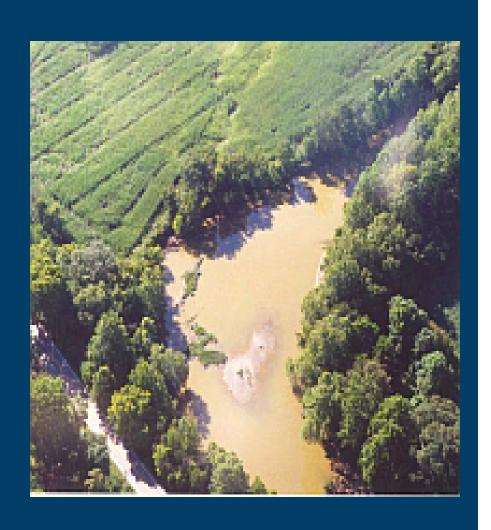
Some additional characteristics of the CADLit database:

- Many of the reviewed papers are from studies in the United States and Canada, but a significant number of papers are from other parts of the world.
- The surveyed literature generally will be peer-reviewed papers in the English language from journal abstracted in bibliographical databases, such as Biological Abstracts, Biosis, Current Contents, Science Direct or Google Scholar.
- . If more than one set of data were analyzed independently in a study, separate listings, called datasets, occur in the data base for each set of data.

To begin searching the CADLit database, select either the Keyword Search or Advanced Search tab above. For more information on searching and querying CADLit, see the CADLit User's Guide.

# **CADDIS: A Team Effort**

- Thanks to the many ecologists, hydrologists, engineers, and statisticians who have contributed to CADDIS.
- Additional thanks to our state partners for case study contributions.
- Suggestions for future enhancements welcome.



www.epa.gov/caddis