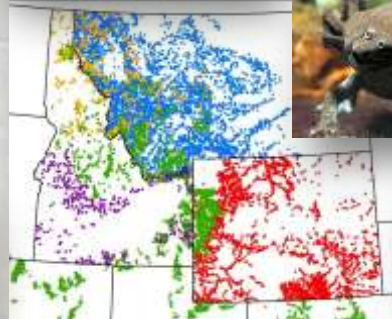
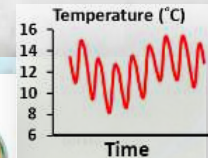
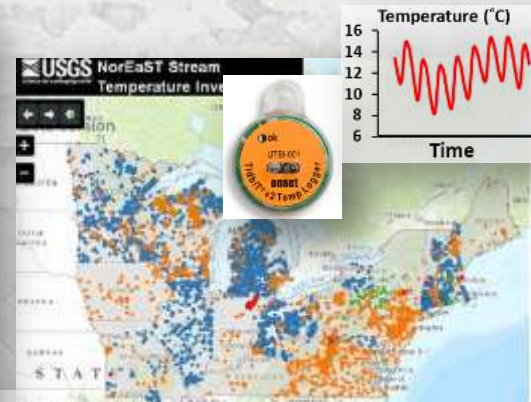
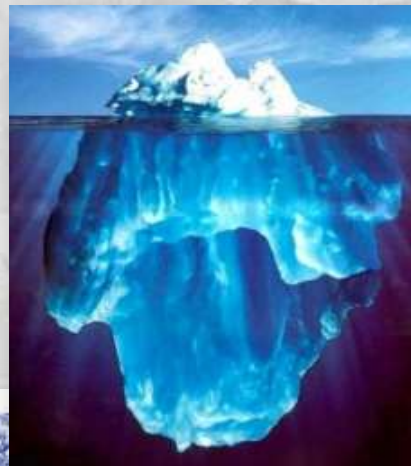


# The National Stream Internet Project

**BIG DATA = BIG POSSIBILITIES**



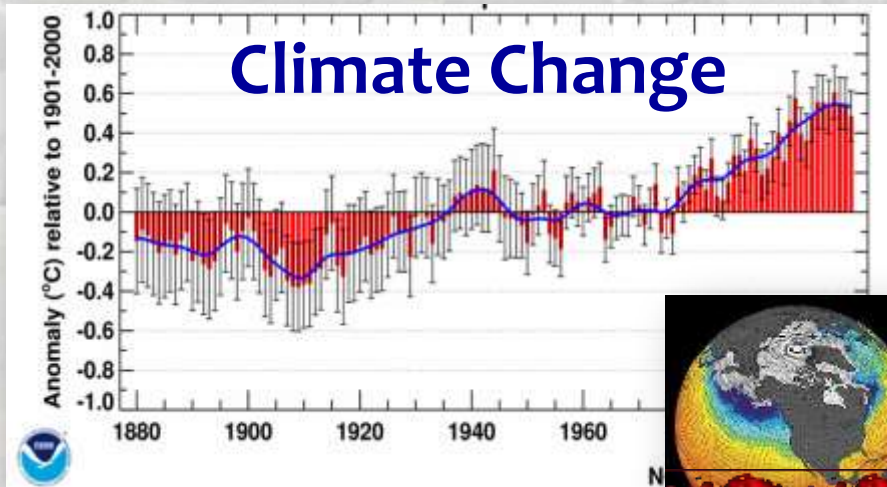
LANDSCAPE  
CONSERVATION  
COOPERATIVES



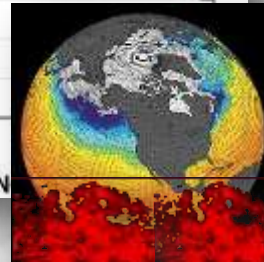


# More Pressure, Fewer Resources

## Climate Change



## Urbanization & Population Growth



## Shrinking Budgets

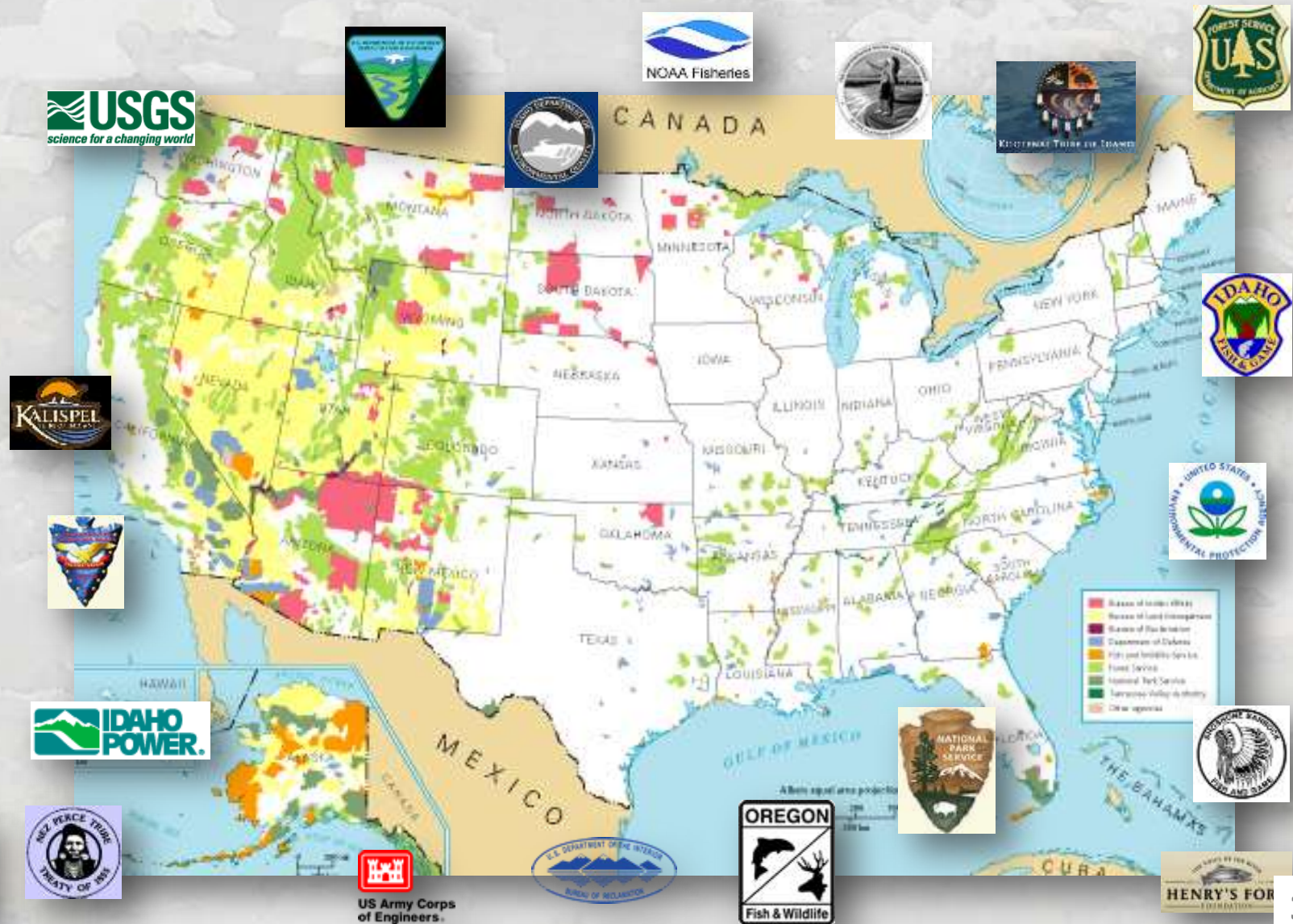


Need to do more  
with less



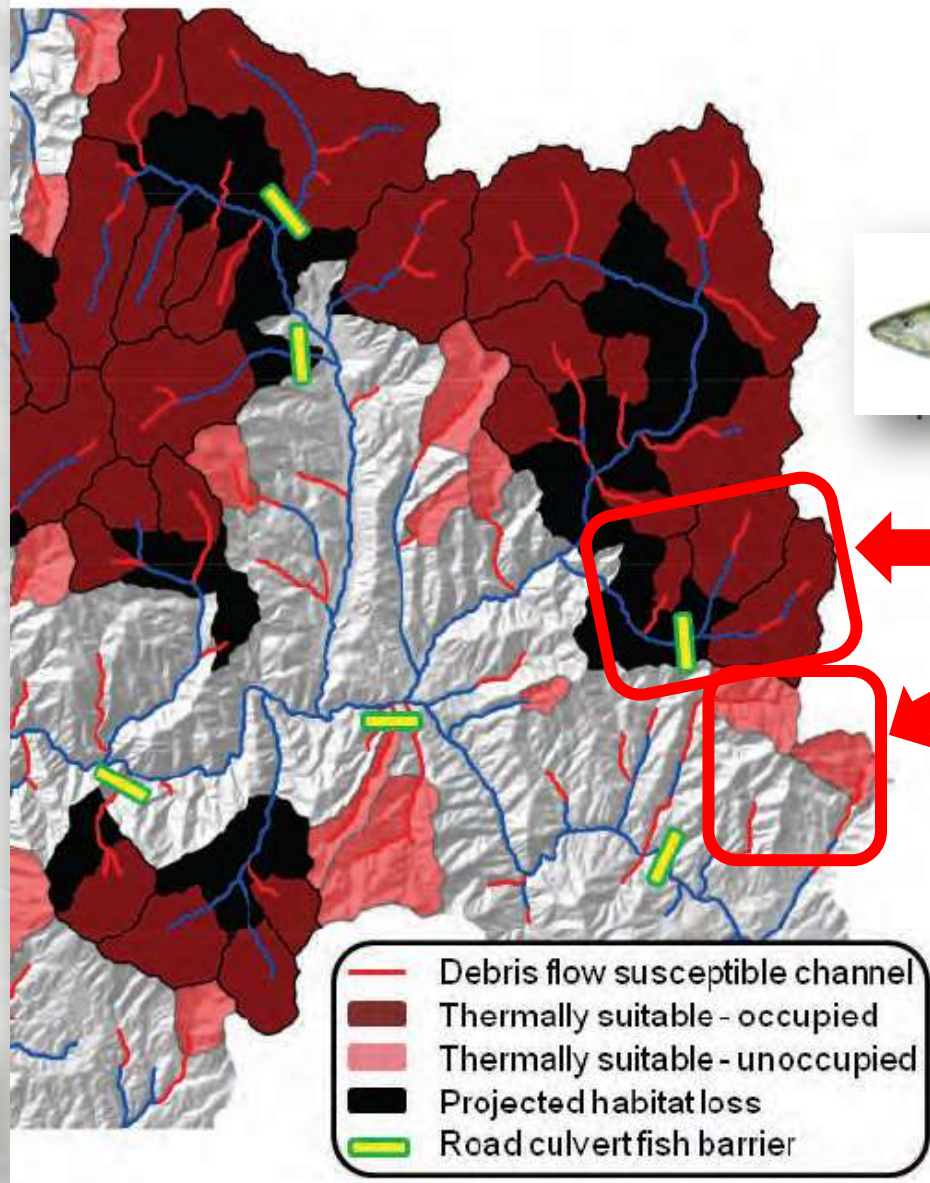


# Strategically Consistent Information Across Broad Areas for Efficient Planning





# Tactically Precise Information for Local Decisions & Project Implementation



I'm going to invest here...

...instead of here





# A Stream Internet is...

A network of people, data, digital information systems & analytical techniques that interact synergistically to create & communicate massive amounts of “information” efficiently





# Key Ingredient #1: NHD Streams

Nationally consistent geospatial database



Cooter et al. 2010. A nationally consistent NHDPlus framework for identifying interstate waters: Implications for integrated assessments and interjurisdictional TMDLs. *Environmental Management* **46**:510-524.

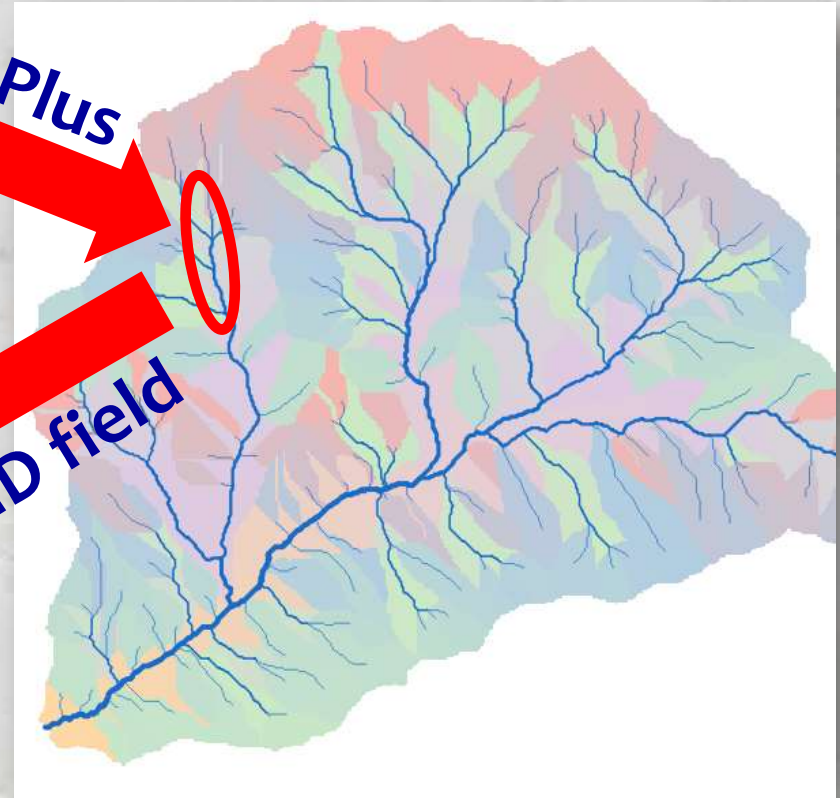


# Key Ingredient #2: The “PLUS” part of NHDPlus (Stream Reach Descriptors)



NHDPlus

COMID field



- Elevation
- Slope
- %Landuse
- Precipitation

100's more...

Wang et al. 2011. A Hierarchical Spatial Framework and Database for the National River Fish Habitat Condition Assessment. *Fisheries* 36:436-449.



## #2. more “PLUSs” coming...

Environ Monit Assess (2009) 151:143–160  
DOI 10.1007/s10661-008-0256-z

### Predicting the biological condition of streams: use of geospatial indicators of natural and anthropogenic characteristics of watersheds

Daren M. Carlisle • James Falcone •  
Michael R. Meador

COMID 1

COMID 3

COMID 2

Ecological Indicators 10 (2010) 264–273

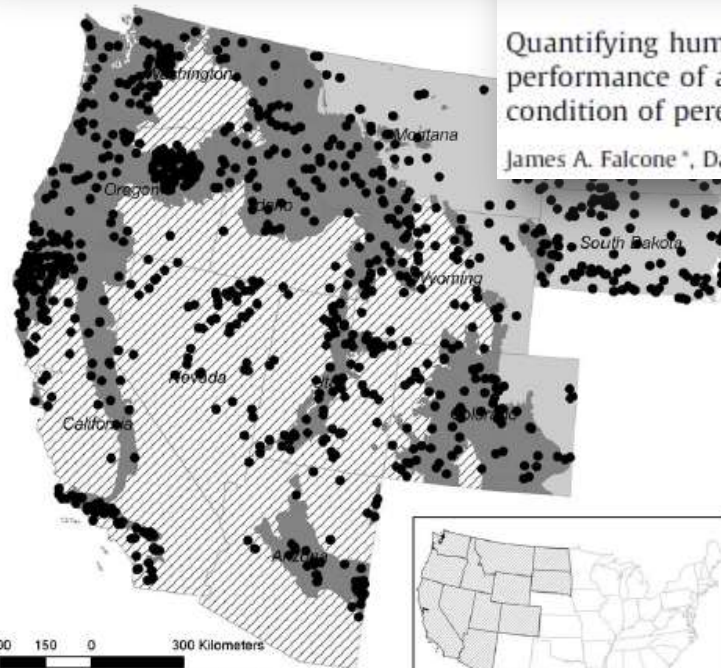
Contents lists available at ScienceDirect

Ecological Indicators

homepage: [www.elsevier.com/locate/ecolind](http://www.elsevier.com/locate/ecolind)

### Quantifying human disturbance in watersheds: Variable selection and performance of a GIS-based disturbance index for predicting the biological condition of perennial streams

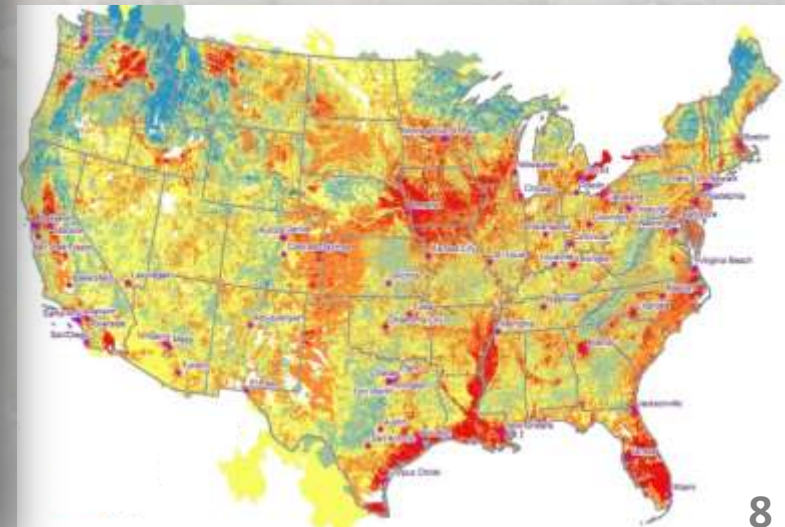
James A. Falcone\*, Daren M. Carlisle, Lisa C. Weber



USEPA-defined ecoregions

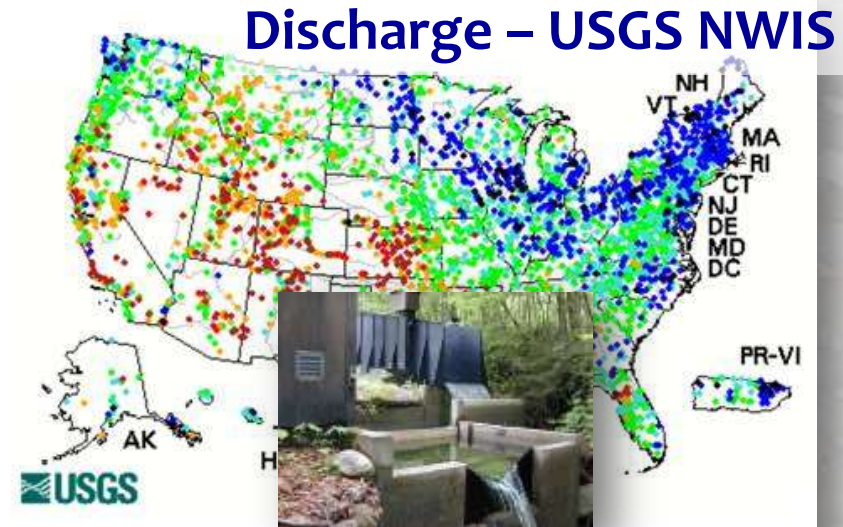
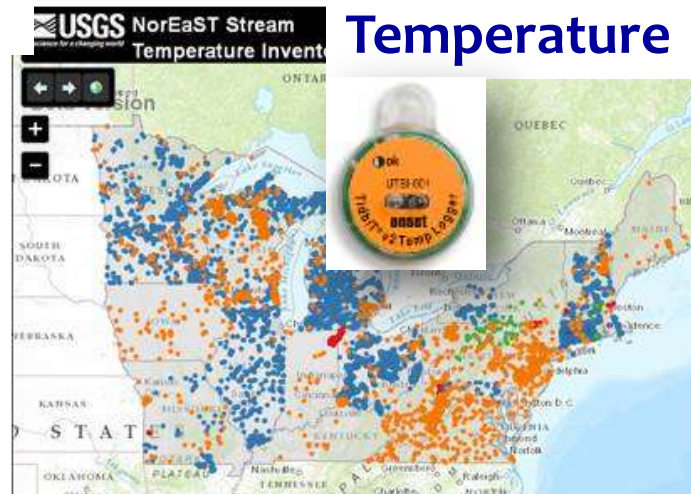
- Plains
- Xeric
- Mountains

## StreamCat

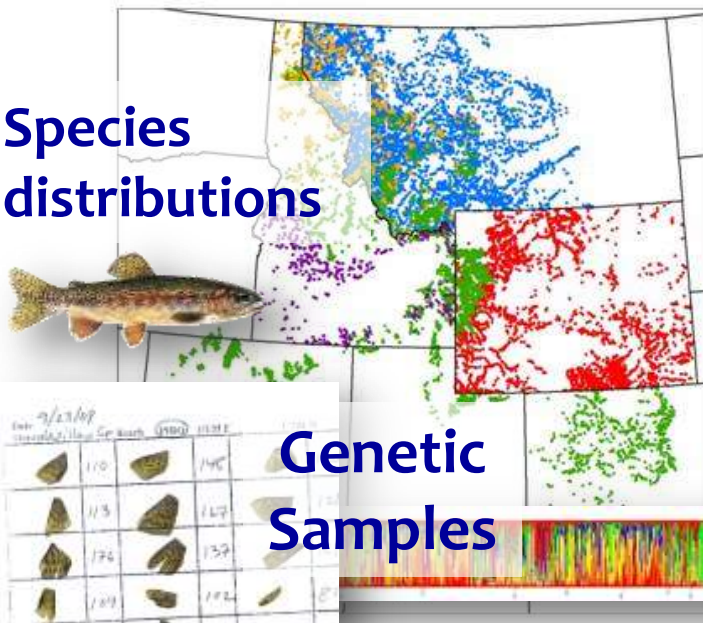




# Key Ingredient #3: Mountains of Data Exist for Information Creation

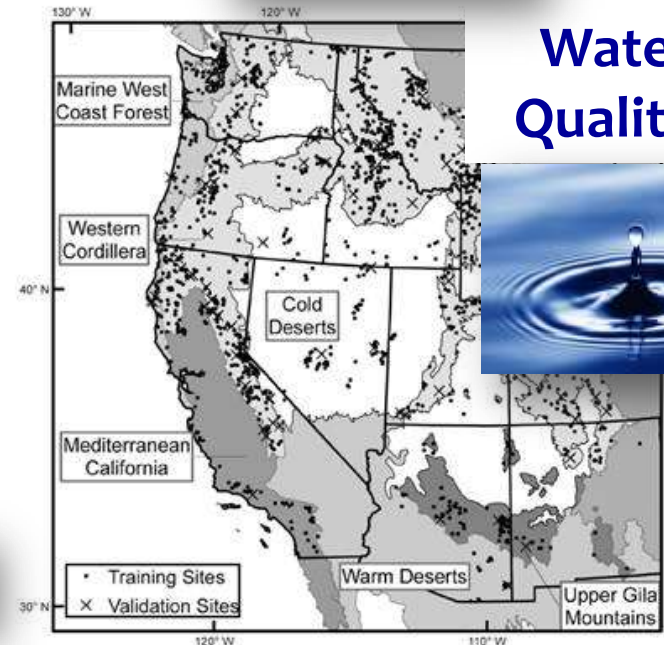


**Species distributions**



**Genetic Samples**

**Water Quality**

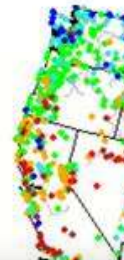




# Key Ingredient #3: Mountains of Data Exist for Information Creation

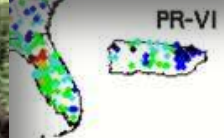
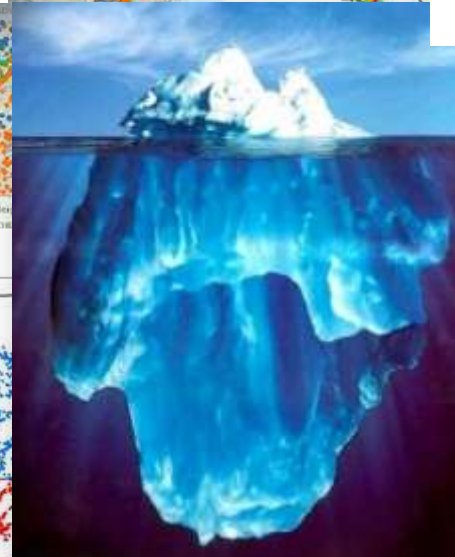
**Free  
millions!**

Temperature



Discharge – U

**Free  
millions!**



Sp  
di

**Free  
millions!**



Genetic  
Samples



**Free  
millions!**



Water  
Quality





# Key Ingredient #4: Statistical Models for Data on Stream Networks... FINALLY!

Environ Ecol Stat (2006) 13:449–464  
DOI 10.1007/s10651-006-0022-8

ORIGINAL ARTICLE

## Spatial statistical models that use flow and stream distance

Jay M. Ver Hoef · Erin Peterson ·  
David Theobald



*Journal of Statistical Software*

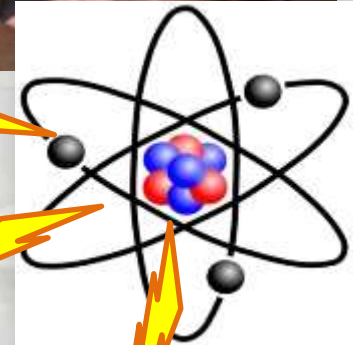
January 2014, Volume 56, Issue 3.

<http://www.jstatsoft.org/>

## STARS: An ArcGIS Toolset Used to Calculate the Spatial Information Needed to Fit Spatial Statistical Models to Stream Network Data

Erin E. Peterson  
CSIRO

Jay M. Ver Hoef  
NOAA



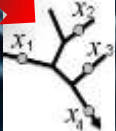
## SSN: An R Package for Spatial Statistical Modeling on Stream Networks

Jay M. Ver Hoef  
NOAA National  
Marine Mammal Laboratory

Erin E. Peterson  
CSIRO, Brisbane

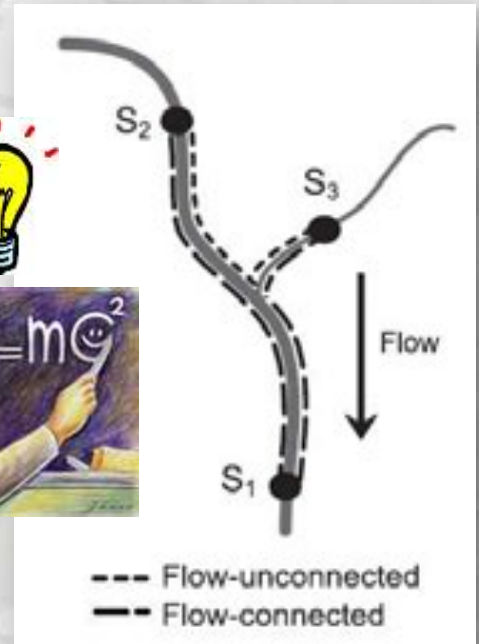
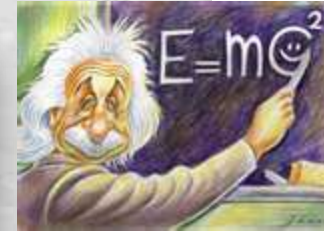
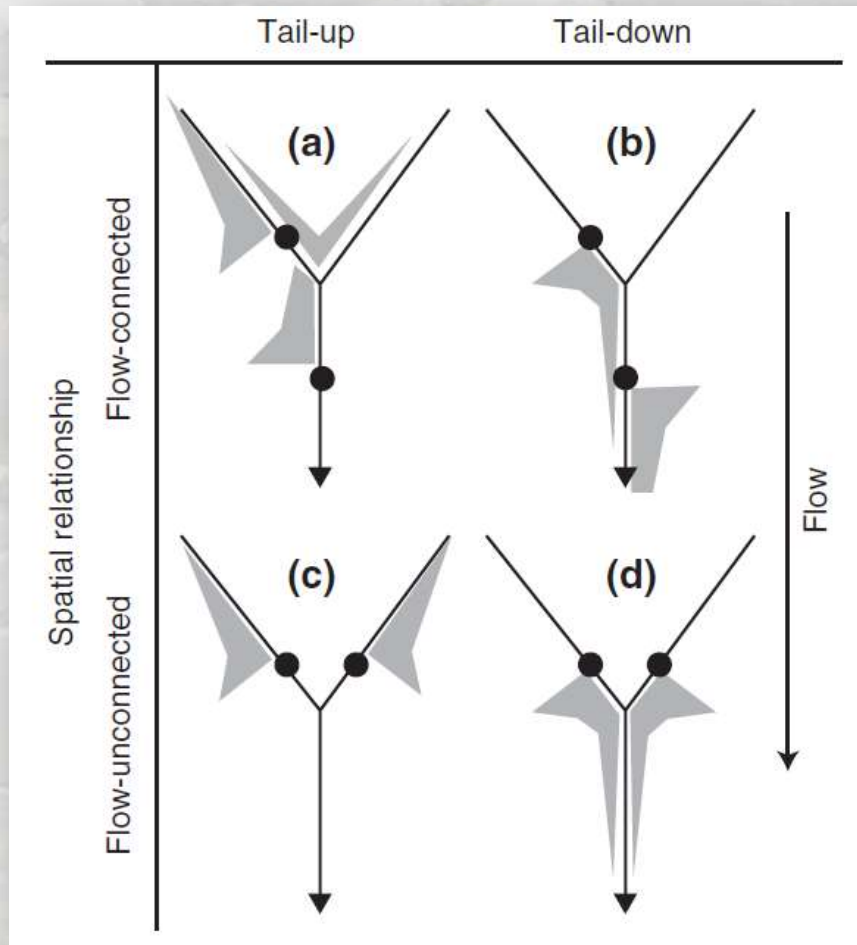
David Clifford  
CSIRO, Brisbane

Rohan Shah  
CSIRO, Brisbane





# Key Innovation is Covariance Structure Based On Network Structure



- Models “understand” how information moves among locations
- Models account for spatial autocorrelation among observations

Peterson et al. 2007. *Freshwater Biology* 52:267-279;

Peterson & Ver Hoef. 2010. *Ecology* 91:644-651.

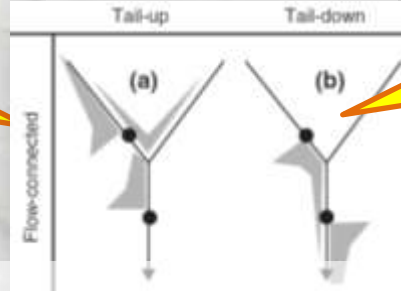
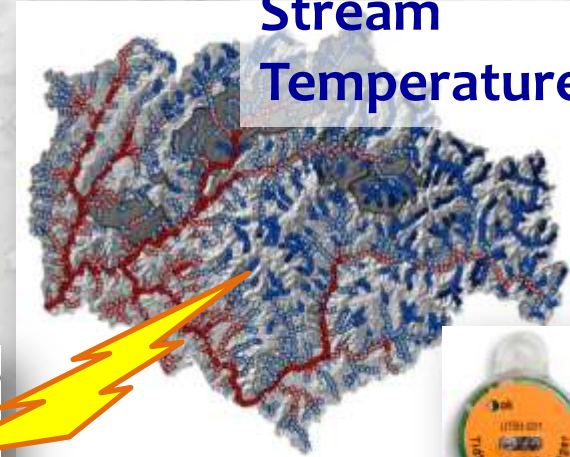


# Stream Models are Generalizable...

## Response Metrics

- Gaussian
- Poisson
- Binomial

## Stream Temperature

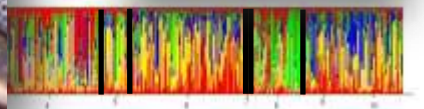
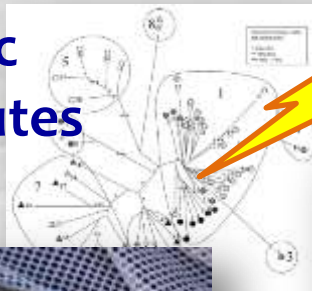


## Distribution & abundance



## Statistical stream models

## Genetic Attributes



## Water Quality Parameters



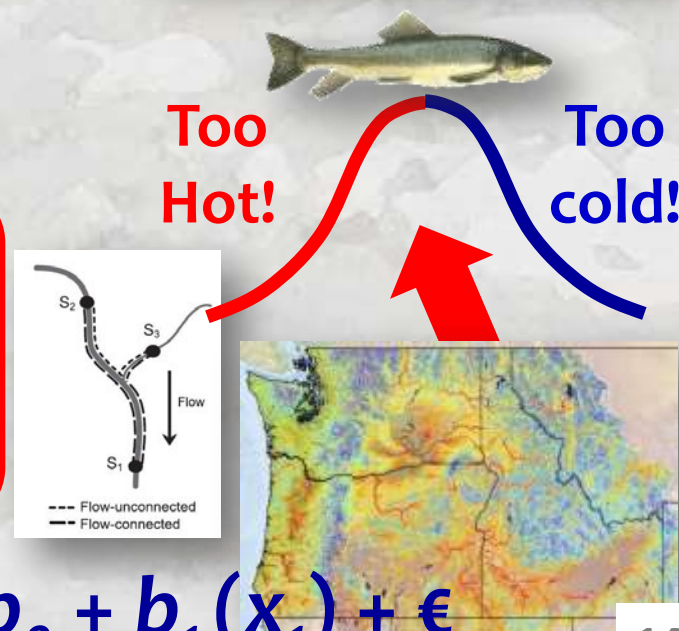


# Applications of Stream Network Models

- Parameter estimation & prediction
- Status & trend assessments
- Efficient monitoring designs
- Block-kriging for reference site comparisons & fish population estimates



- Mining of BIG DATA databases
  - Climate scenarios
  - Temperature criteria
  - Species distribution models



$$Y = b_0 + b_1(x_1) + \epsilon$$



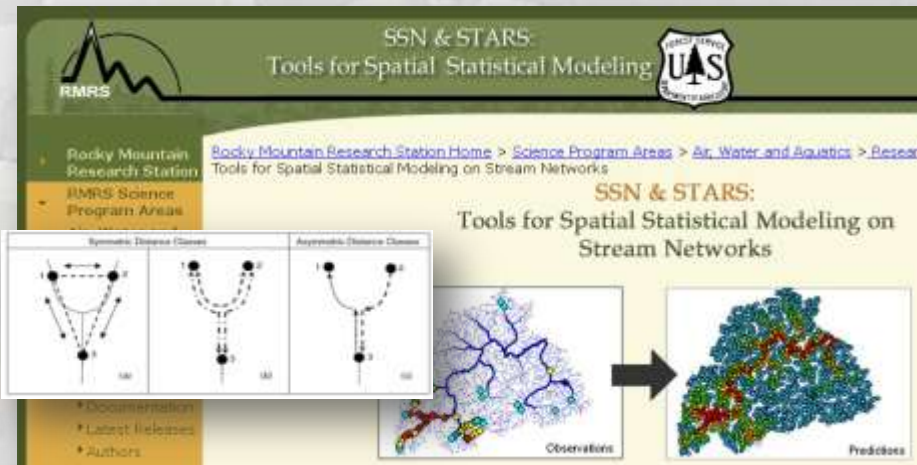
# User Community is Growing Rapidly...

## SSN/STARS Website

>20,000 website visits  
in first 2.5 years

Free, high-quality  
software

>600 software  
downloads



Locations of visits to SSN/STARS website in last month







# 3<sup>rd</sup> Annual Stream Statistics Training

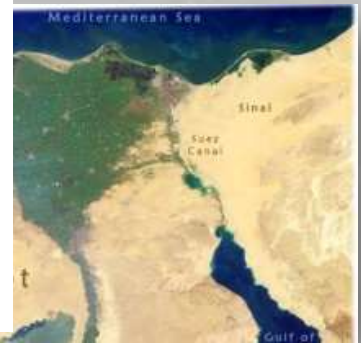


  
*stream*

## workshop

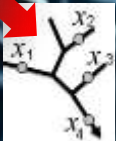
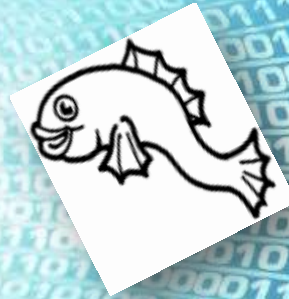
overview of spatial  
models (webinar)

days: work 1-on-1 with  
to model your data





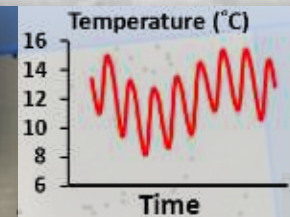
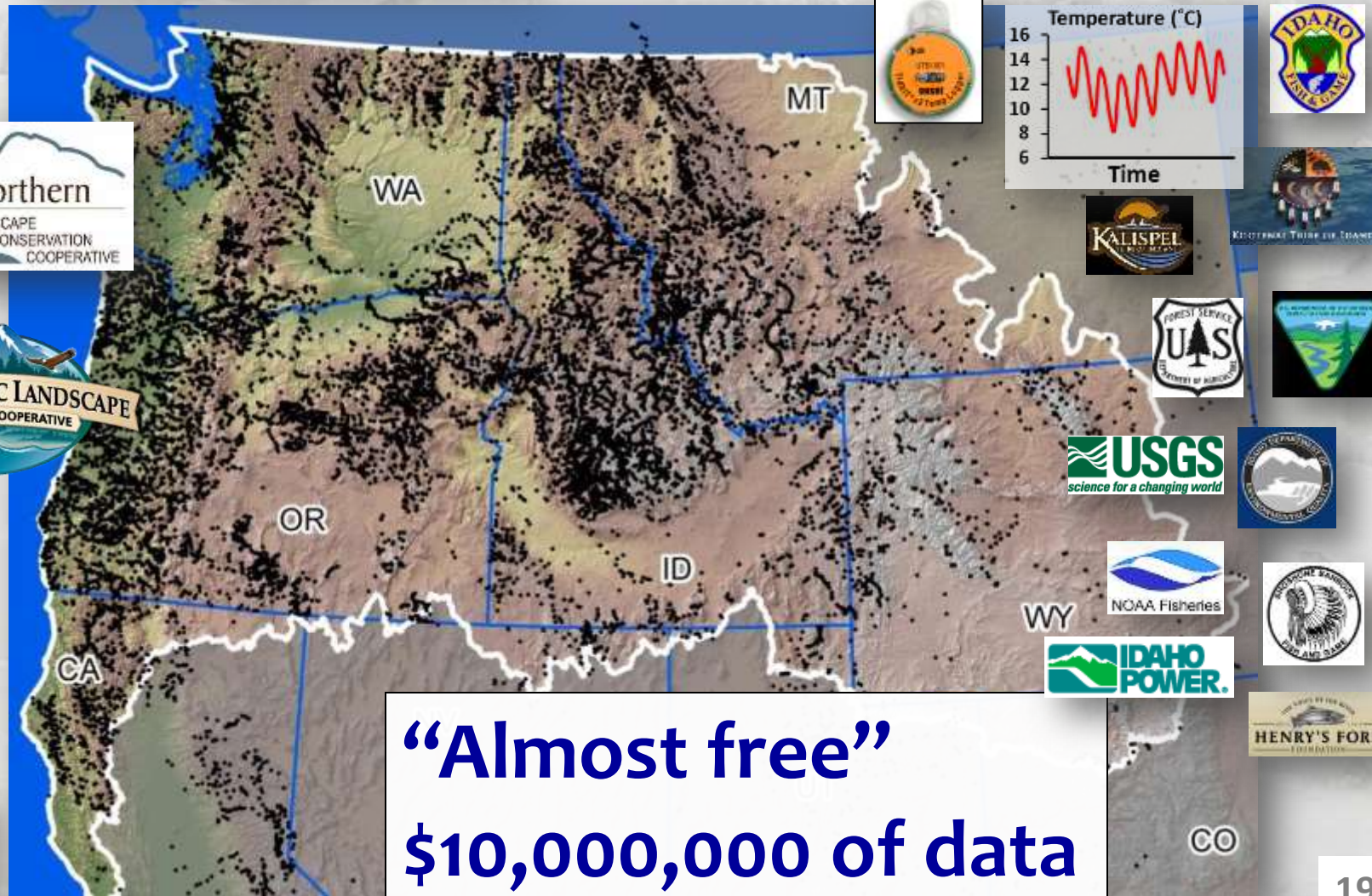
# A BIG DATA Example of Stream Internet Technologies in Action







- >80 resource agencies
- >50,000,000 hourly records
- >15,000 unique stream sites



**“Almost free”  
\$10,000,000 of data**





NO

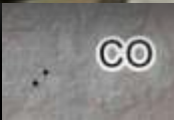
It's the MOTHER  
LODE!



INFORMATION!



\$10,000,000 of data



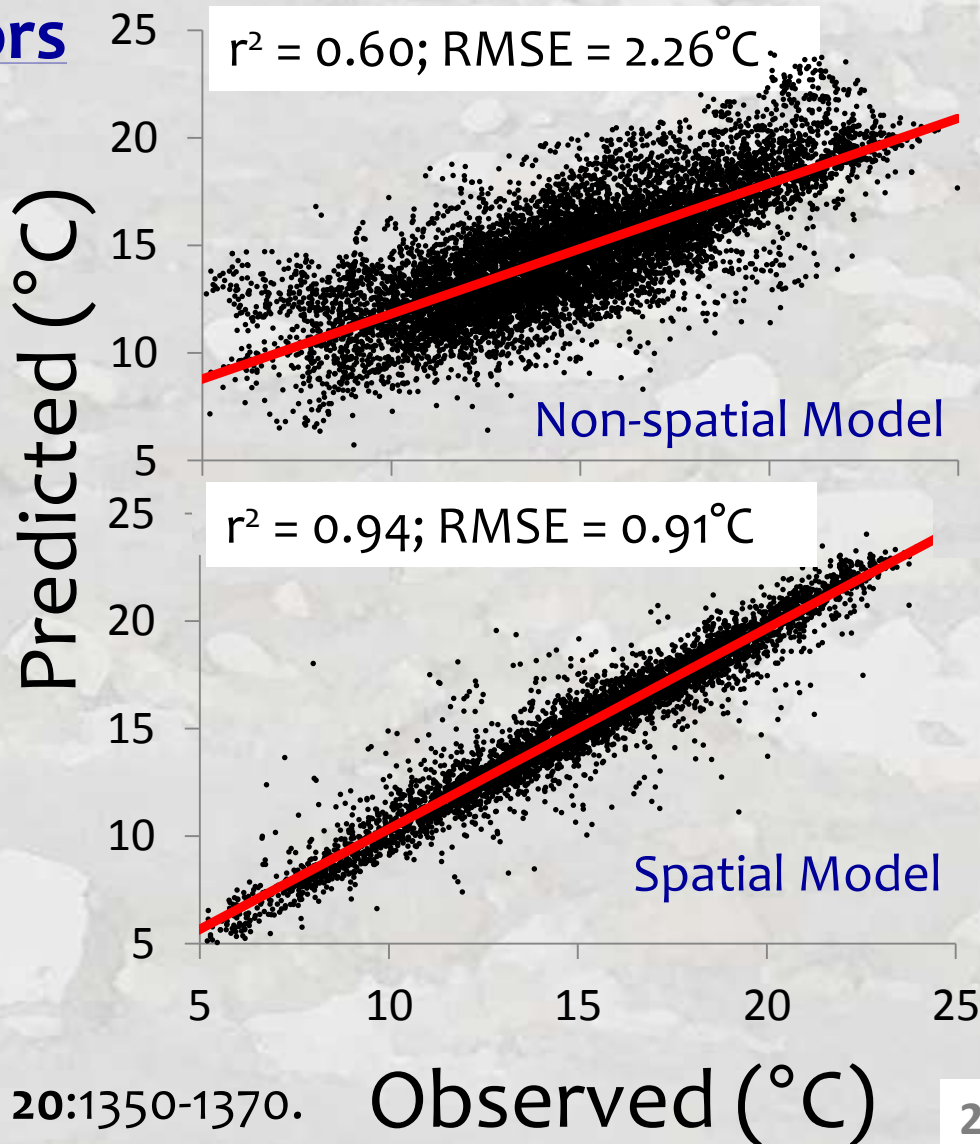


# Spatial vs Non-Spatial Temperature Model

## Covariate Predictors

1. Elevation (m)
2. Canopy (%)
3. Stream slope (%)
4. Ave Precipitation (mm)
5. Latitude (km)
6. Lakes upstream (%)
7. Baseflow Index
8. Watershed size (km<sup>2</sup>)
9. Glacier (%)
10. Discharge (m<sup>3</sup>/s)  
**USGS gage data**
11. Air Temperature (°C)  
**RegCM3 NCEP reanalysis**  
**Hostetler et al. 2011**

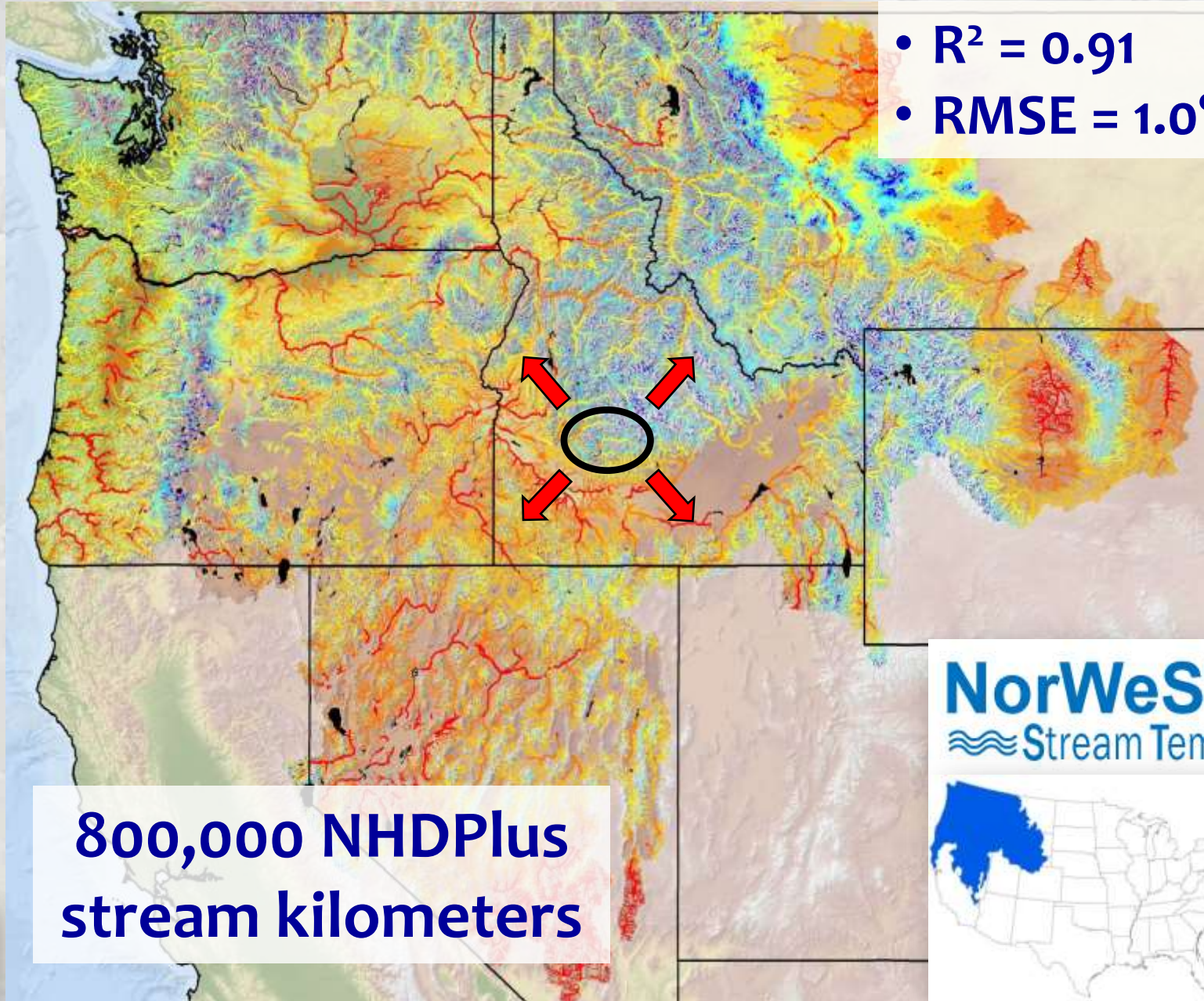
## Mean August Temperature





# High-Resolution Stream Scenarios

- $R^2 = 0.91$
- $RMSE = 1.0^{\circ}C$



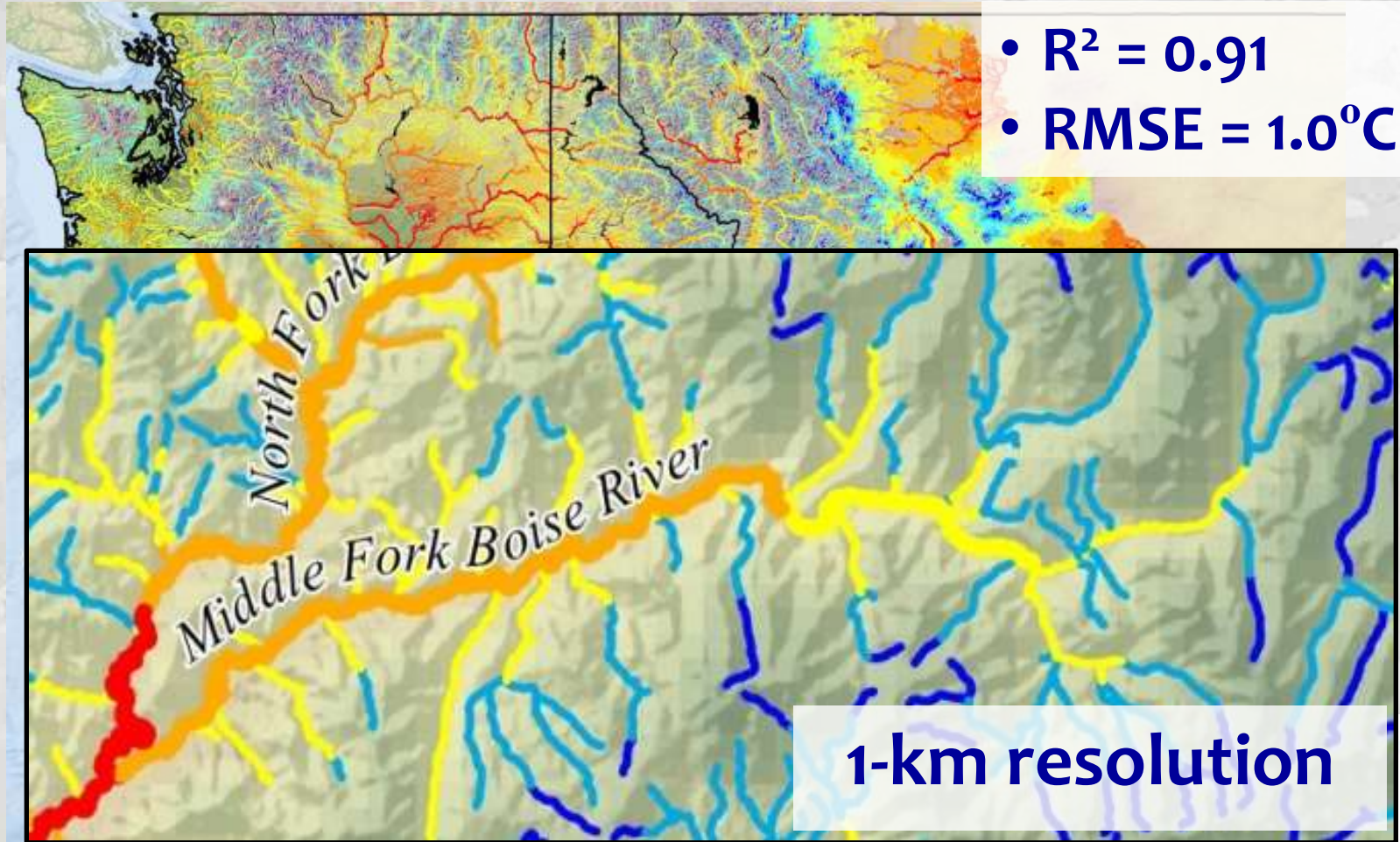
**800,000 NHDPlus  
stream kilometers**

**NorWeST**  
Stream Temp





# High-Resolution Stream Scenarios



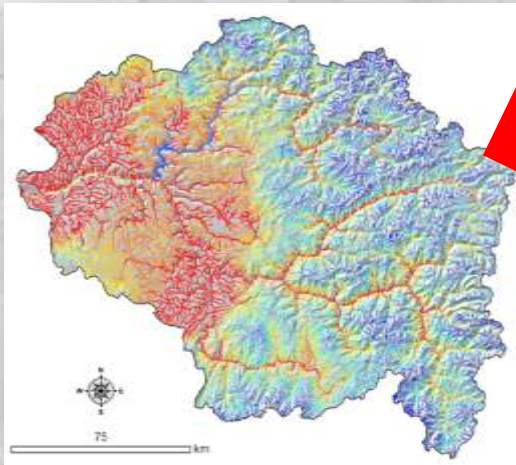
**800,000 NHDPlus  
stream kilometers**



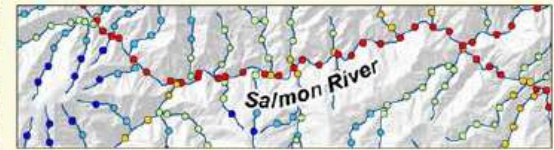


# Website Distributes Scenarios & Temperature Data as GIS Layers

- 1) GIS shapefiles of stream temperature scenarios

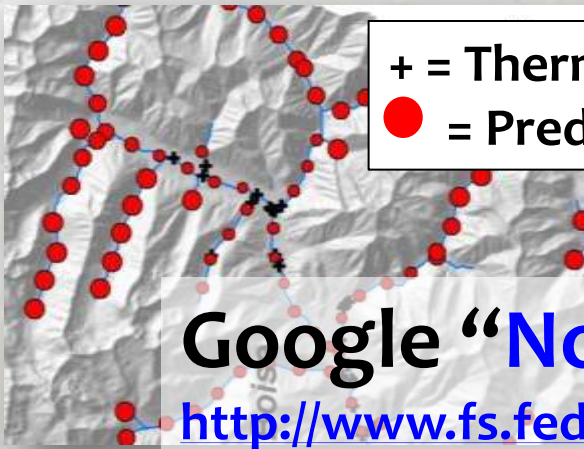


**NorWeST**  
Stream Temp



*Regional Database and Modeled Stream Temperatures*

- 2) GIS shapefiles of stream temperature model prediction precision



+ = Thermograph  
● = Prediction SE

- 3) Temperature data summaries

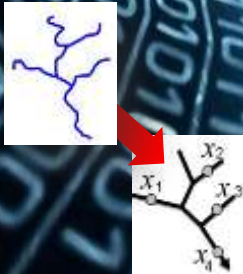


Google “**NorWeST**” or go here...

<http://www.fs.fed.us/rm/boise/AWAE/projects/NorWeST.sh>

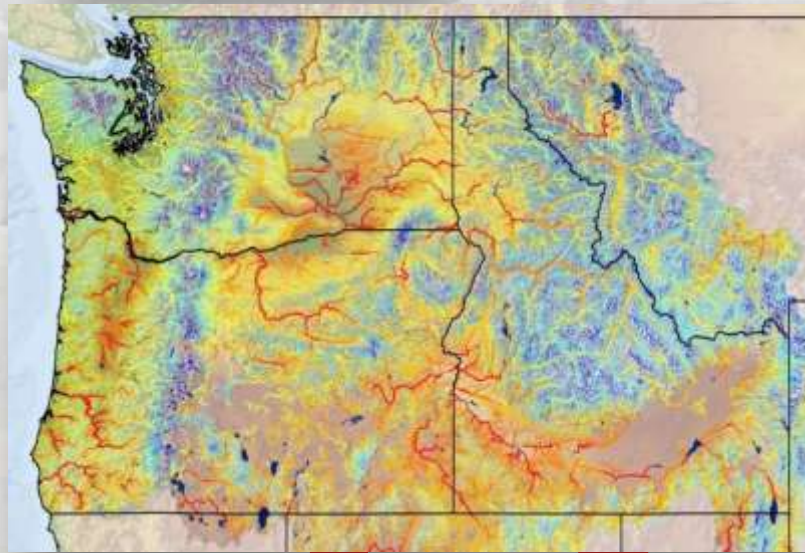


- 10,000 visits/year
- 1,146 downloads last 6 months





# Temperature Synergies...



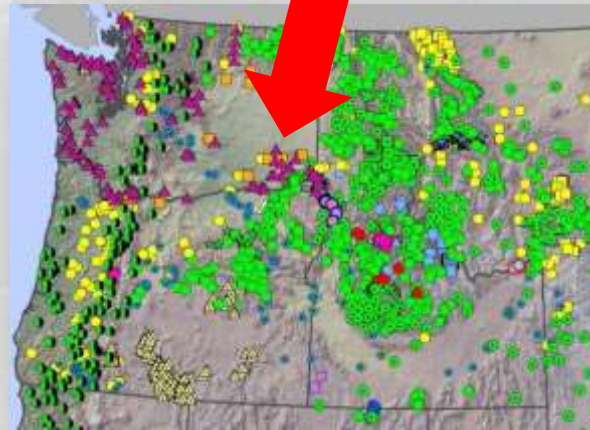
Regulatory temperature standards



Too Hot!

Too cold!

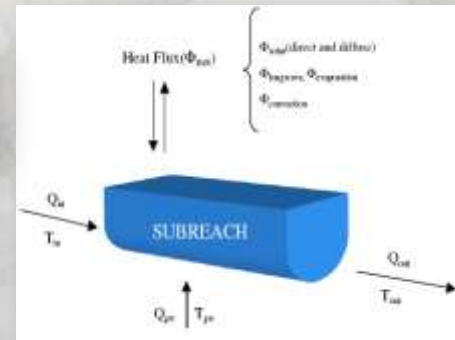
Data access accelerates temperature research



Coordinated interagency monitoring



Species distribution models & climate assessments

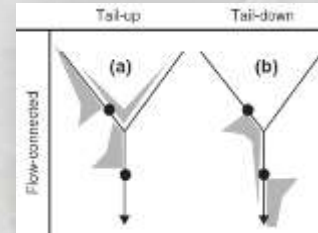




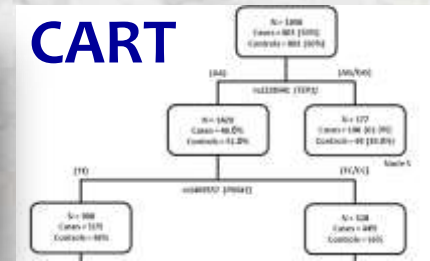
# Doesn't Matter How We Get There...

Many good models & designs...

**SPARROW** **GRTS**



**CART**

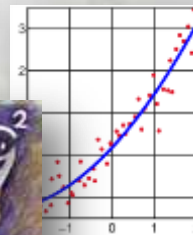
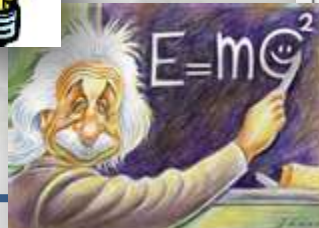


Many good programs...



**The National Rivers and Streams Assessment**

Needs for new models & programs...

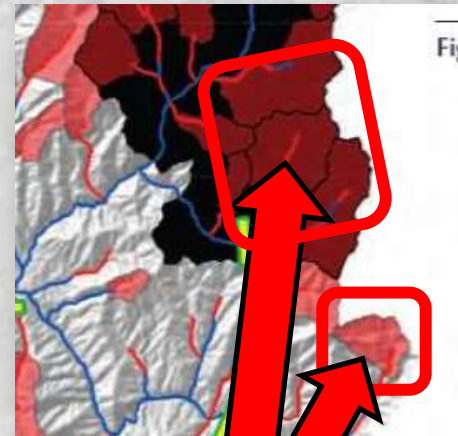
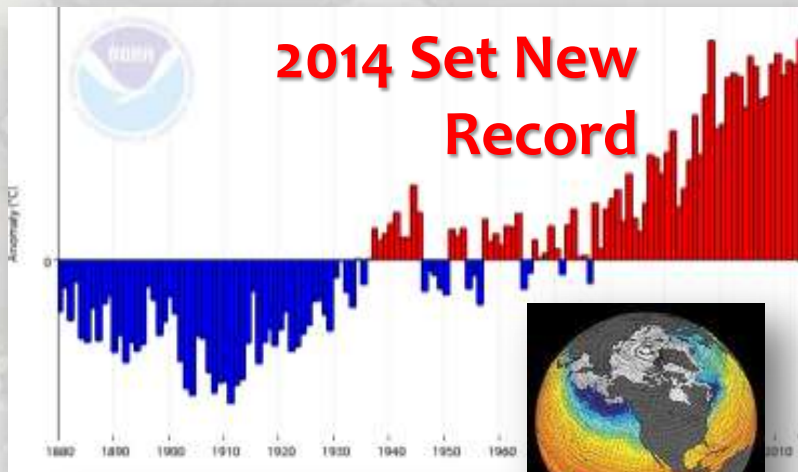




# “Information” & Efficiency Are Key

## Good Information for Decision Making is Critical

The 21<sup>st</sup>-Century will Be  
a Transitional One



I'm going to invest here...

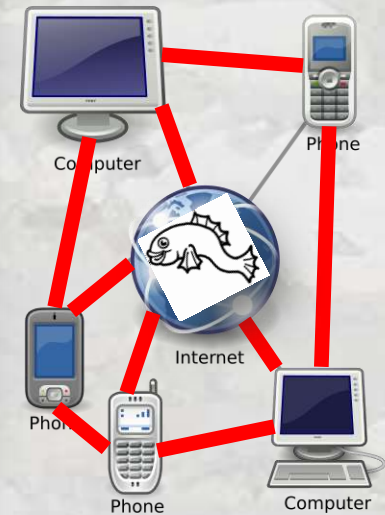
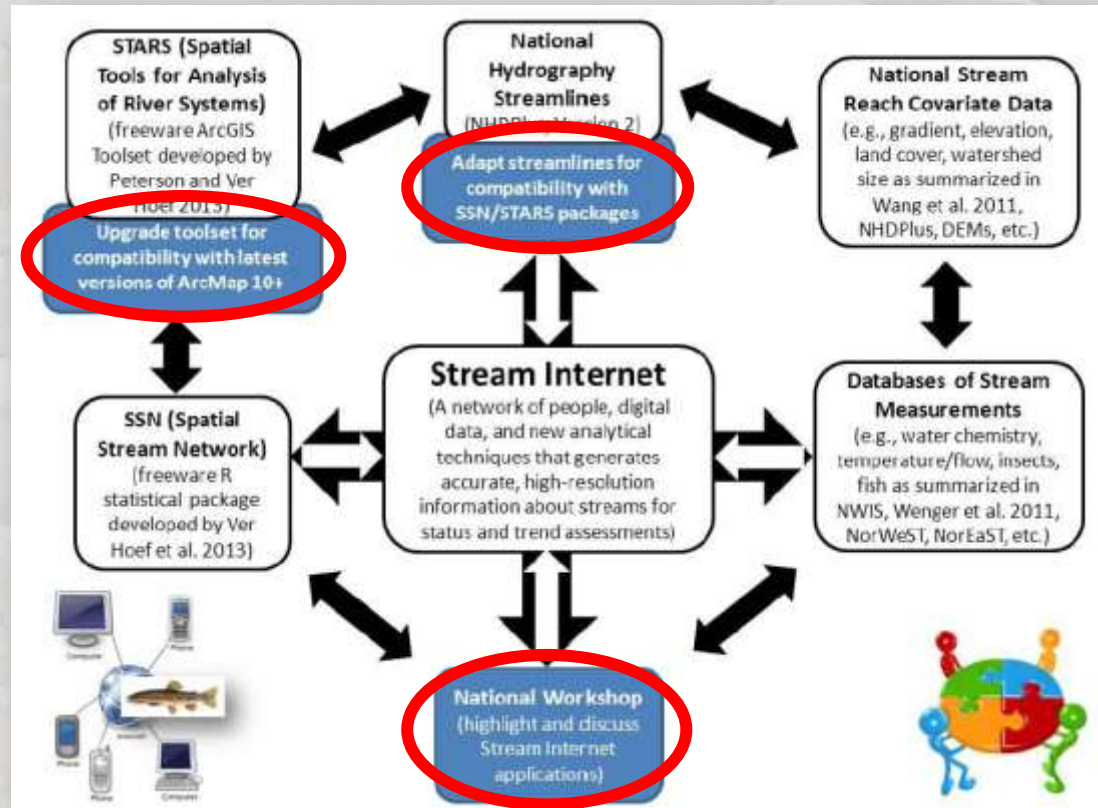
...not here





# Stream Internet Project Tasks

- 1) Develop compatibility between spatial stream analysis tools and national hydrography layer (NHDPlus, v2)
- 2) Update STARS stream analysis tools to ArcMap 10.2
- 3) Host a workshop to brainstorm about possibilities that new analyses & databases provide to address key questions & information needs





# Vision: TSI through the NSI

High-resolution space-time  
information for all stream things



3,000,000 stream kilometers

