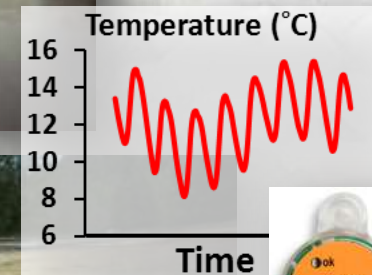
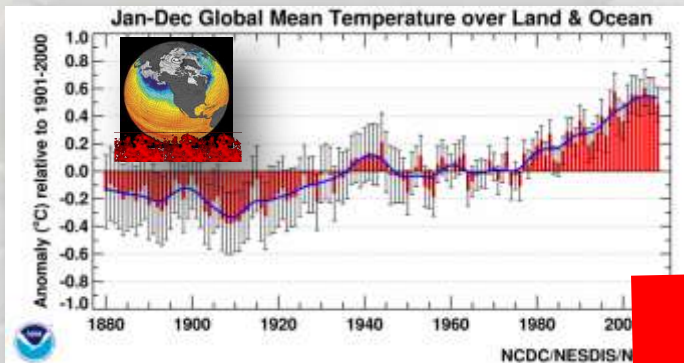
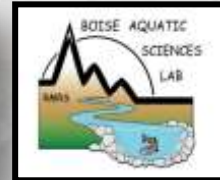


Monitoring & Modeling Stream Temperatures: Lessons Learned in the Rocky Mountains with Utility for Maine?

Dan Isaak, US Forest Service
Rocky Mountain Research Station



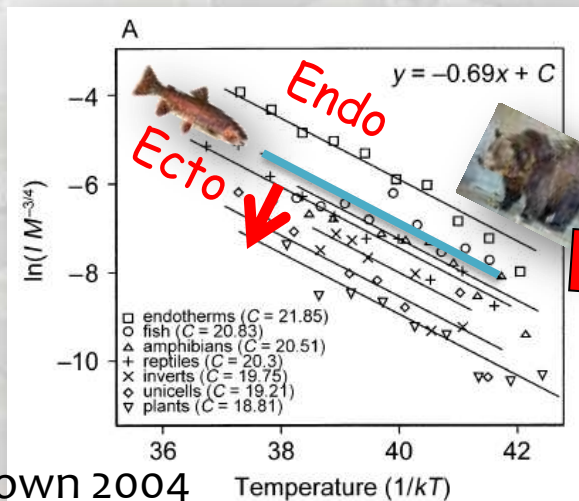


General outline:

- 1) Relevance of temperature & climate change to aquatic biotas
- 2) Trends in stream/lake temperatures
- 3) Monitoring protocols & sampling designs
- 4) Developing useful information from existing data (free money!)
- 5) Synergies that good temperature information creates

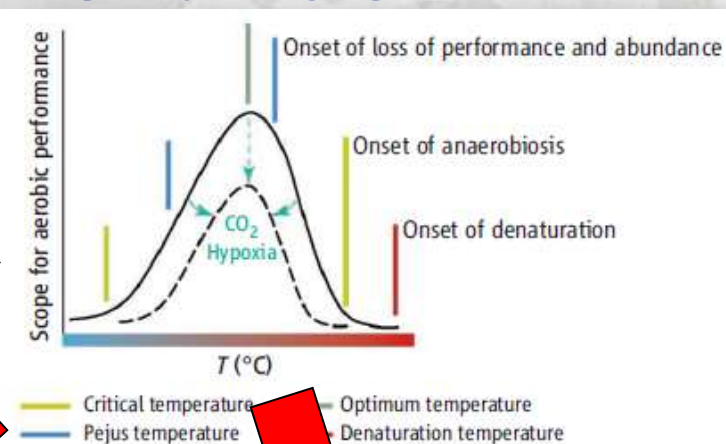
Temperature is Primary Control for Aquatic Ectotherms

Metabolism



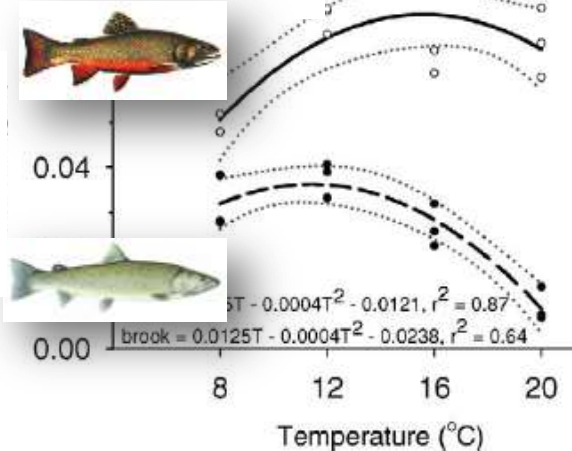
Brown 2004

Thermal Niche



In the lab...

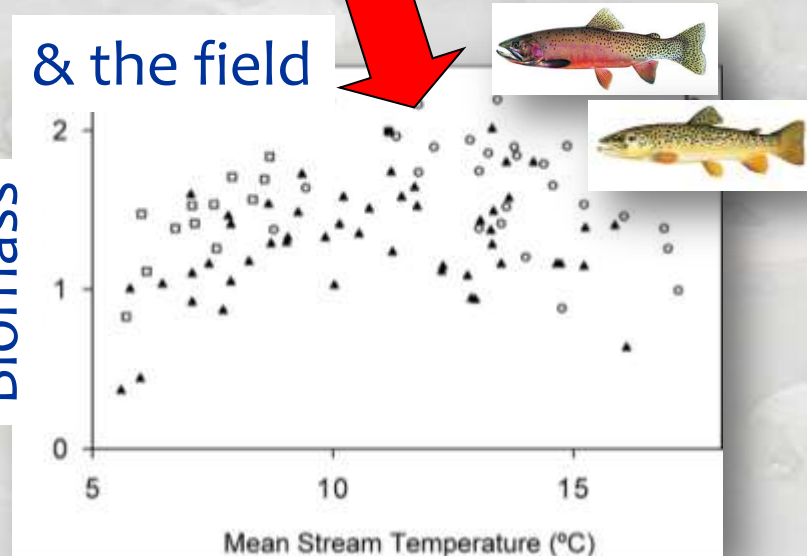
Growth



McMahon et al. 2007

& the field

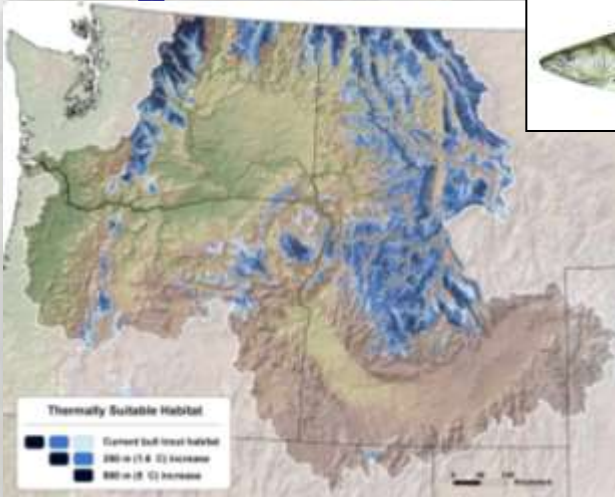
Biomass



Isaak & Hubert 2004

Temperature Regulation – Spatial Distributions

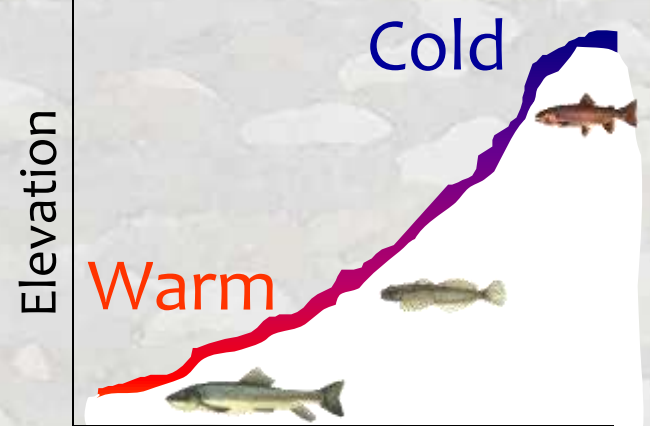
Regional Scale



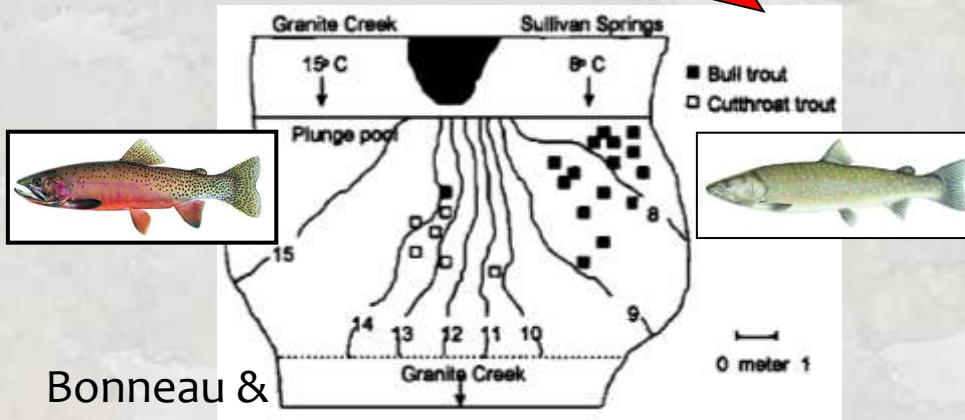
Rieman et al. 2007



Stream Scale



Stream Distance

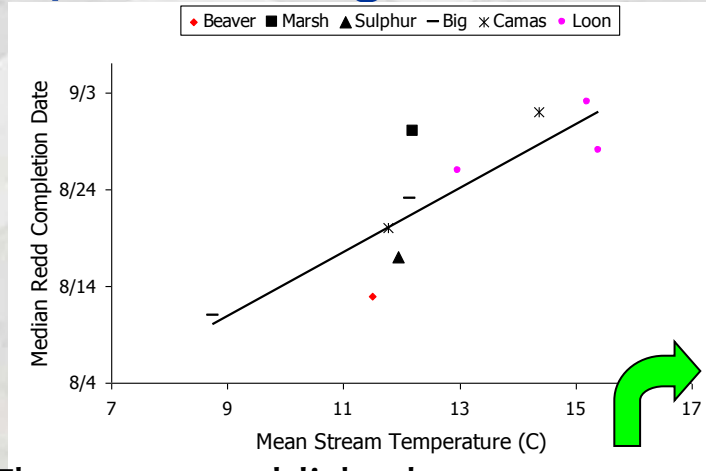


Bonneau & Scarnecchia 1996



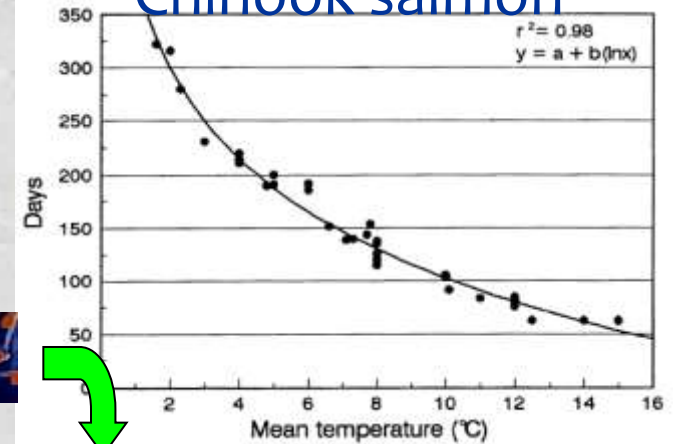
Temperature Regulation - Life Cycle

Spawn timing - Chinook salmon



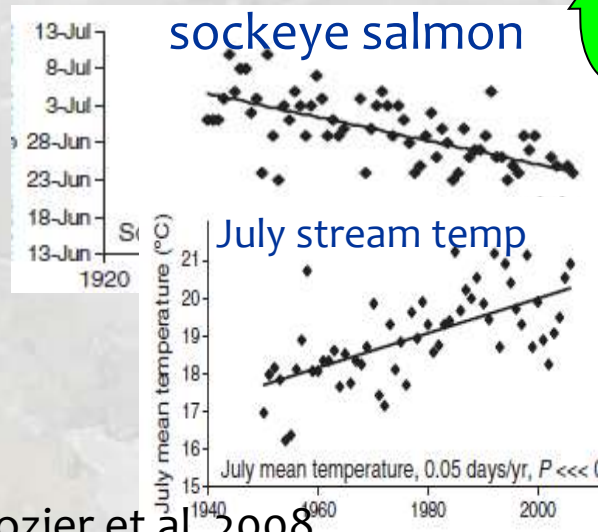
Thurow, unpublished

Incubation length - Chinook salmon



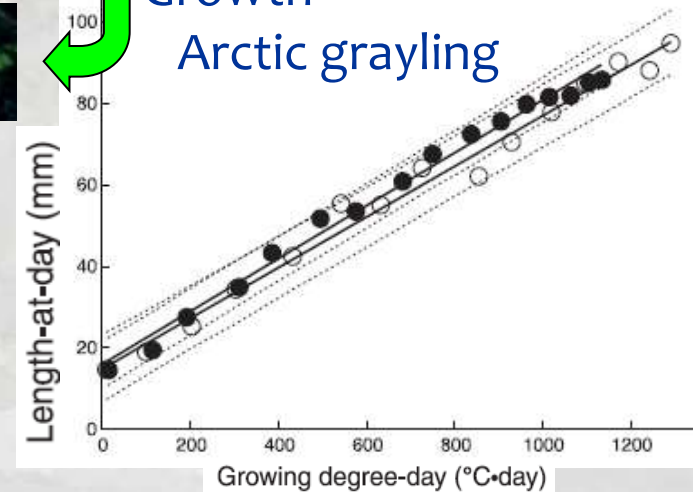
Brannon et al. 2004

Migration timing - sockeye salmon



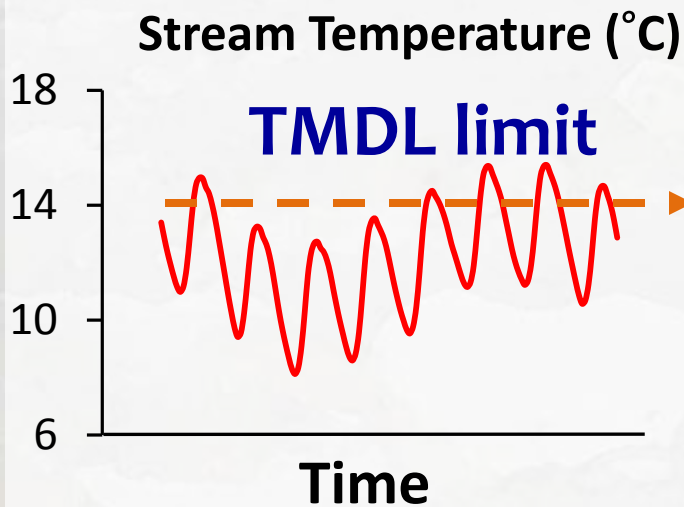
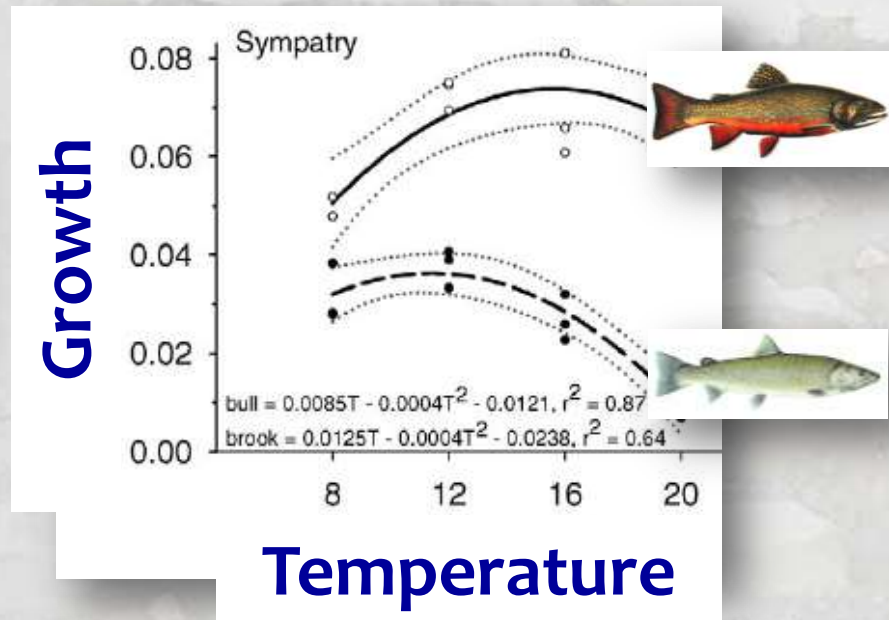
Crozier et al. 2008

Growth - Arctic grayling



Dion and Hughes 1994

Concern About "Climate" Led to Temperature TMDL Standards



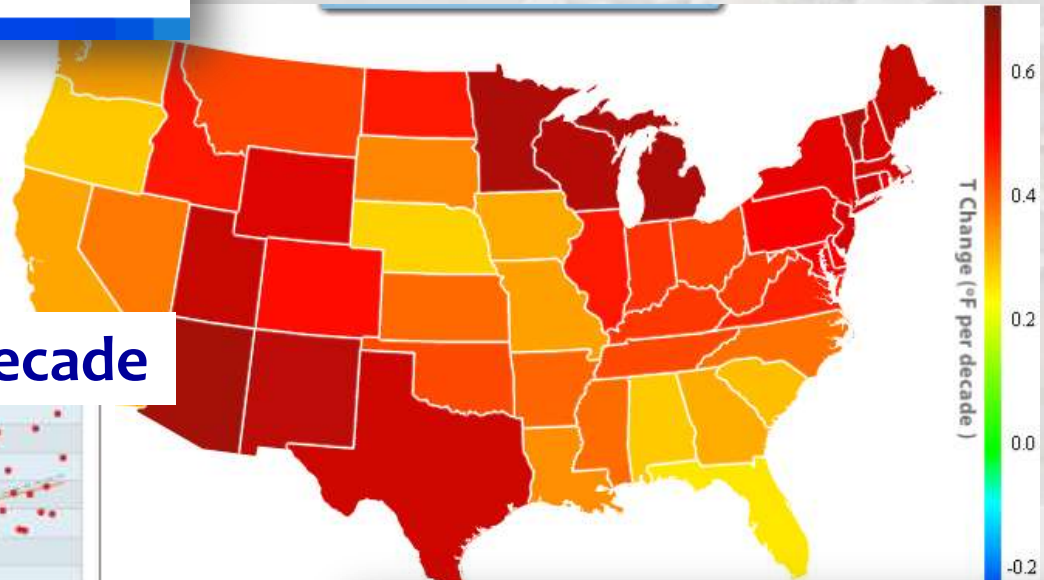
Too Hot!



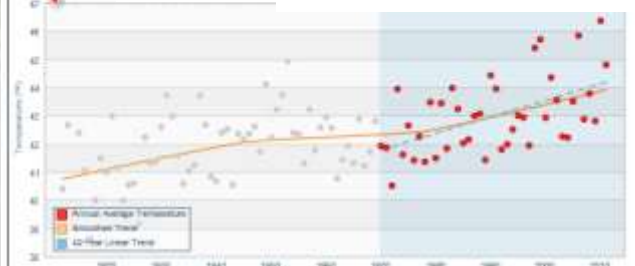
New Concerns About “Climate Change”

Air Temperature Warming Rates (1970 – 2011)

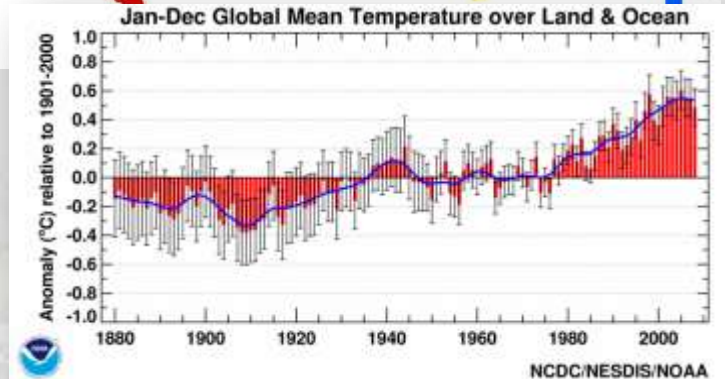
CLIMATE CENTRAL



Maine 0.59 °C/decade



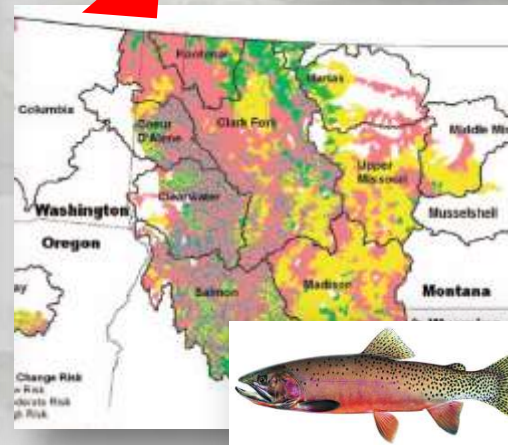
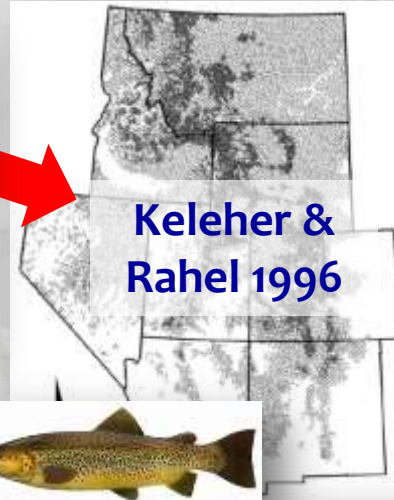
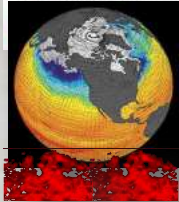
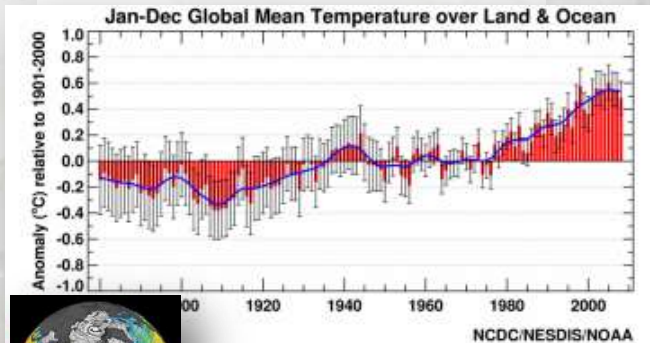
“Heat is on report” Tebaldi 2012



<http://www.climatecentral.org/news/the-heat-is-on/>

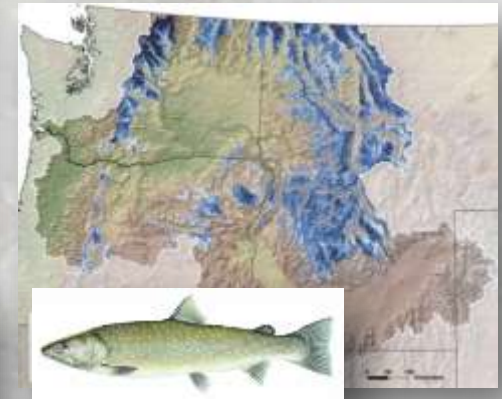
Concern About “Climate Change” Drives Biological Vulnerability Assessments

Air Temp trends



Many Others...

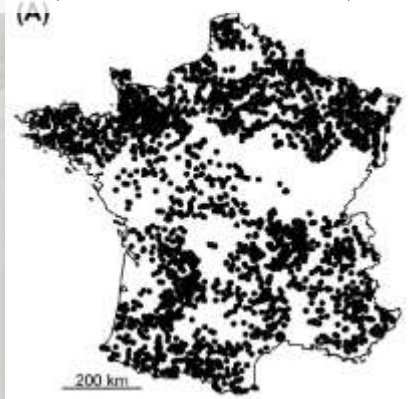
- Isaak et al. 2010
- Eaton & Schaller 1996
- Reusch et al. 2012
- Rahel et al. 1996
- Mohseni et al. 2003
- Flebbe et al. 2006
- Rieman et al. 2007
- Kennedy et al. 2008
- Williams et al. 2009
- Wenger et al. 2011
- Almodovar et al. 2011



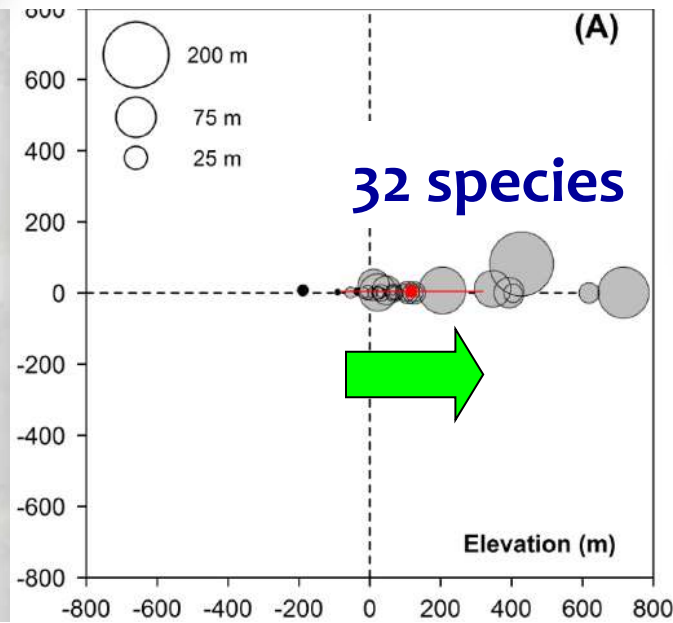
French Study Documents Biological Response



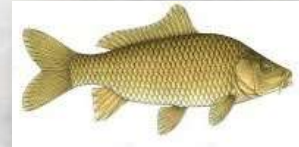
Survey sites
(n = 3,500)



Difference in stream fish
distributions (1980's vs 2000's)



Change in Elevation (m)



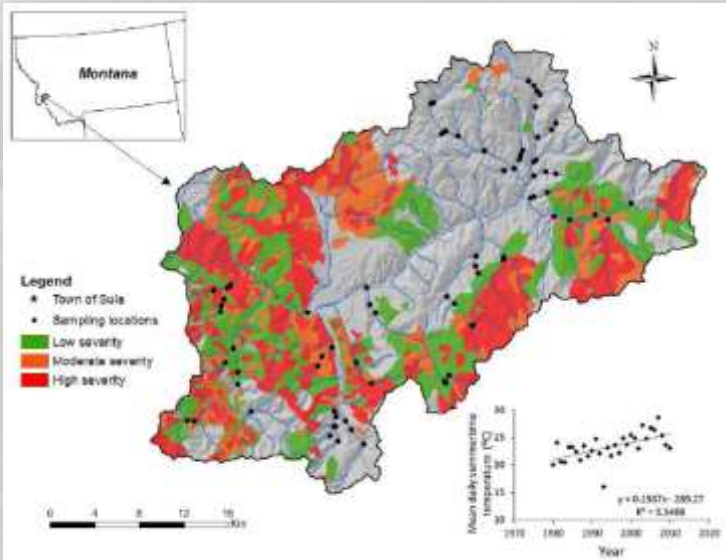
March of the fishes...



Comte & Grenouillet. 2013. Do stream fish track climate change? Assessing distribution shifts in recent decades. *Ecography* 36:1236-1246.

Distribution Shifts in Montana Bull Trout Populations

- Resurveyed Rich et al. 2003 sites 20 years later
- 77 sites, 500 m in length
- Modeled extirpations/colonizations accounting for detection efficiency

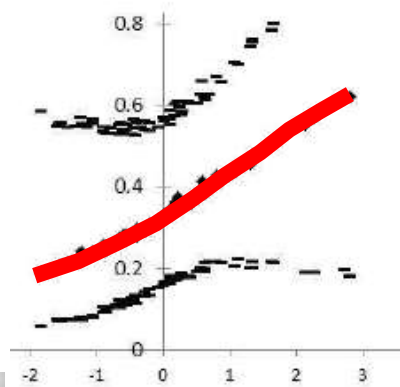


Eby et al. In Review. Evidence of climate-induced range contractions for bull trout to cooler, higher elevation sites in a Rocky Mountain watershed, U.S.A. *Conservation Biology*

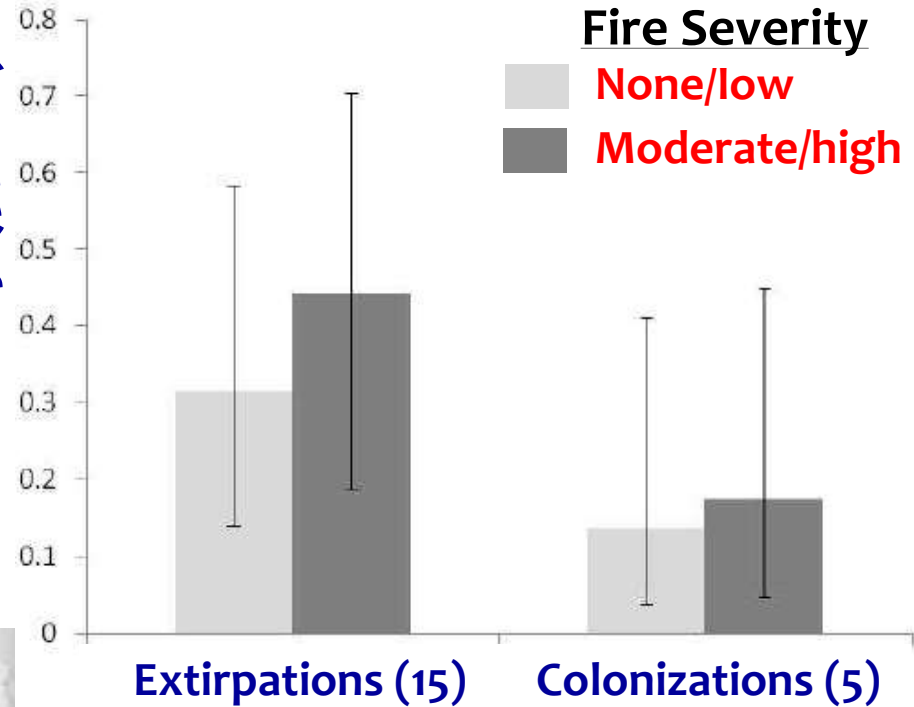
Distribution Shifts in Montana Bull Trout Populations



Extirpation probability (95%CI)



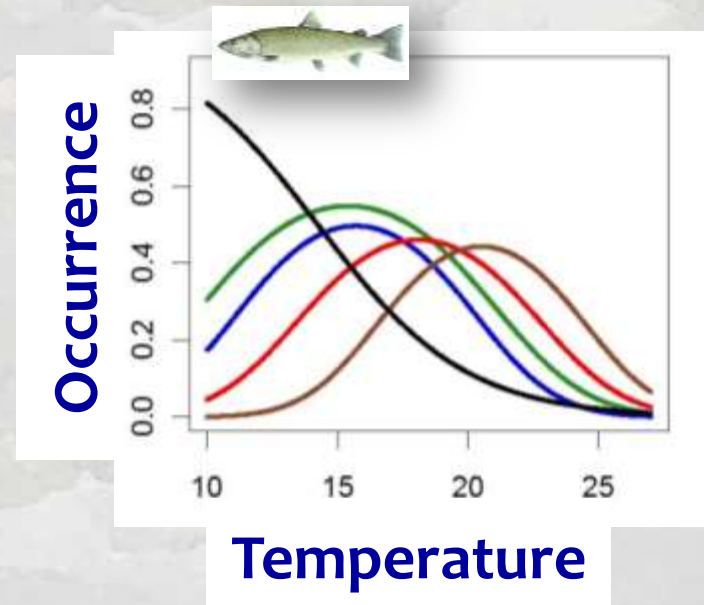
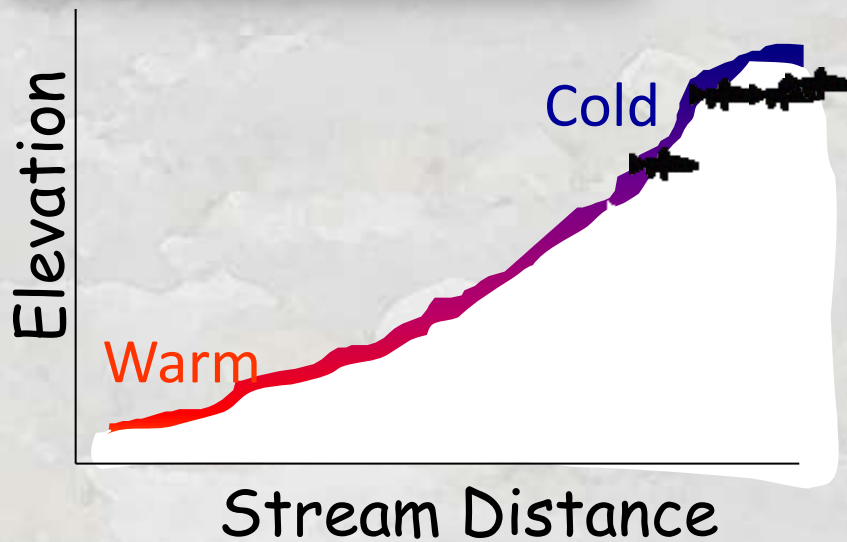
Probability (95%CI)



Why That's a Problem...

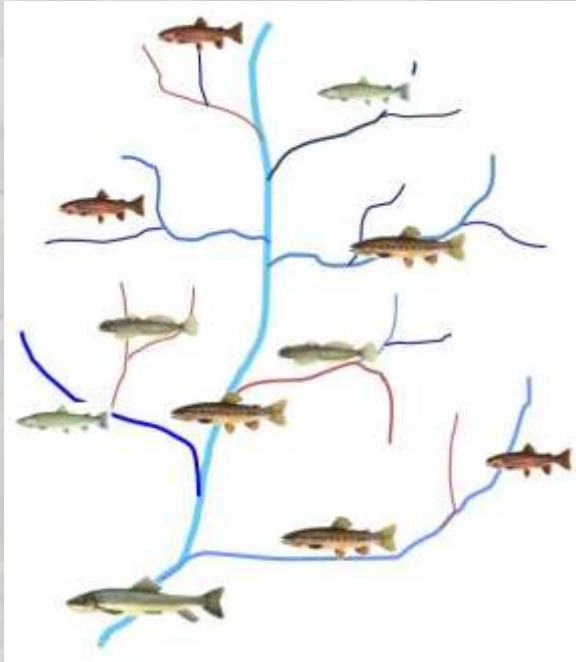


- Occur throughout Pacific Northwest
- ESA Listed as Threatened in 1998
- Cold thermal niche
- Exist on “mountain-top islands”



The 21st-Century will Be a Transitional One

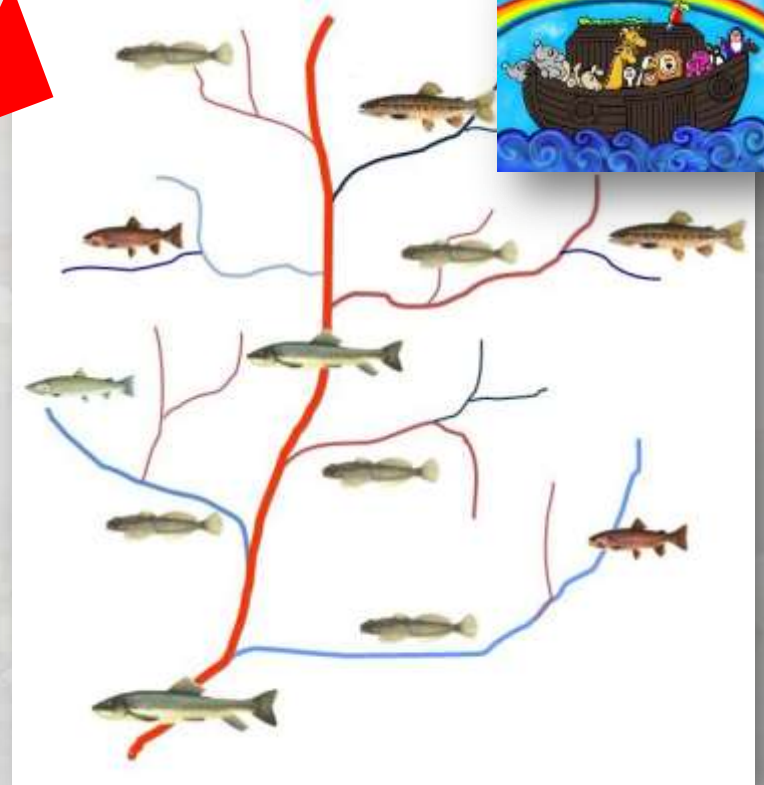
Current Status



What are our Goals?

Desired Future Status

Perhaps fewer, but happy & stable populations of target species

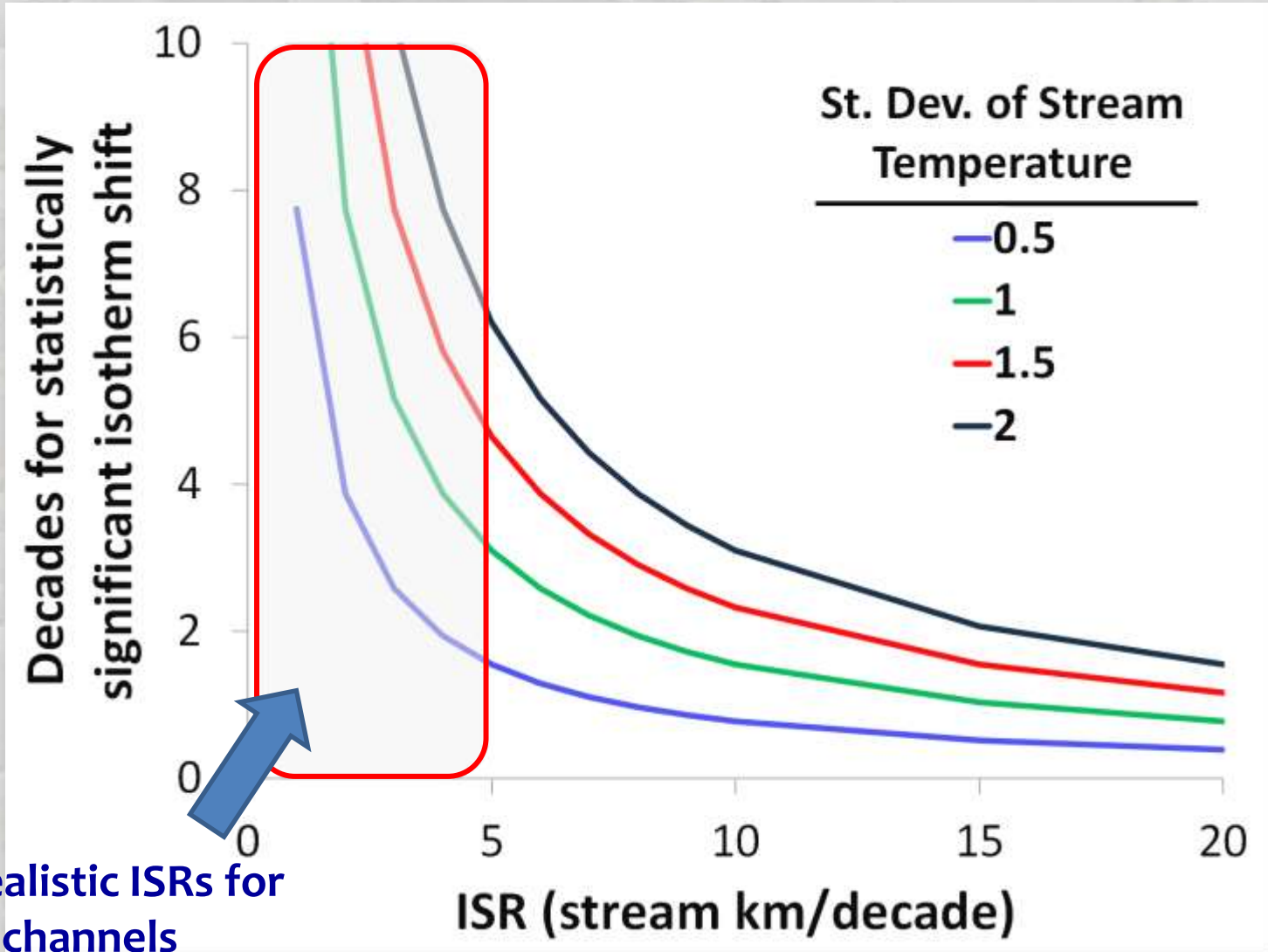


Perhaps some new invaders, but nightmare invasion scenarios avoided



Changes Will Happen Slowly

20 – 60 years for significant isotherm shifts



Realistic ISRs for 1% channels

Changes Will Happen Slowly

20 – 60 years for significant isotherm shifts

Occur Over The Span of Careers



Time is a Double-Edged Sword

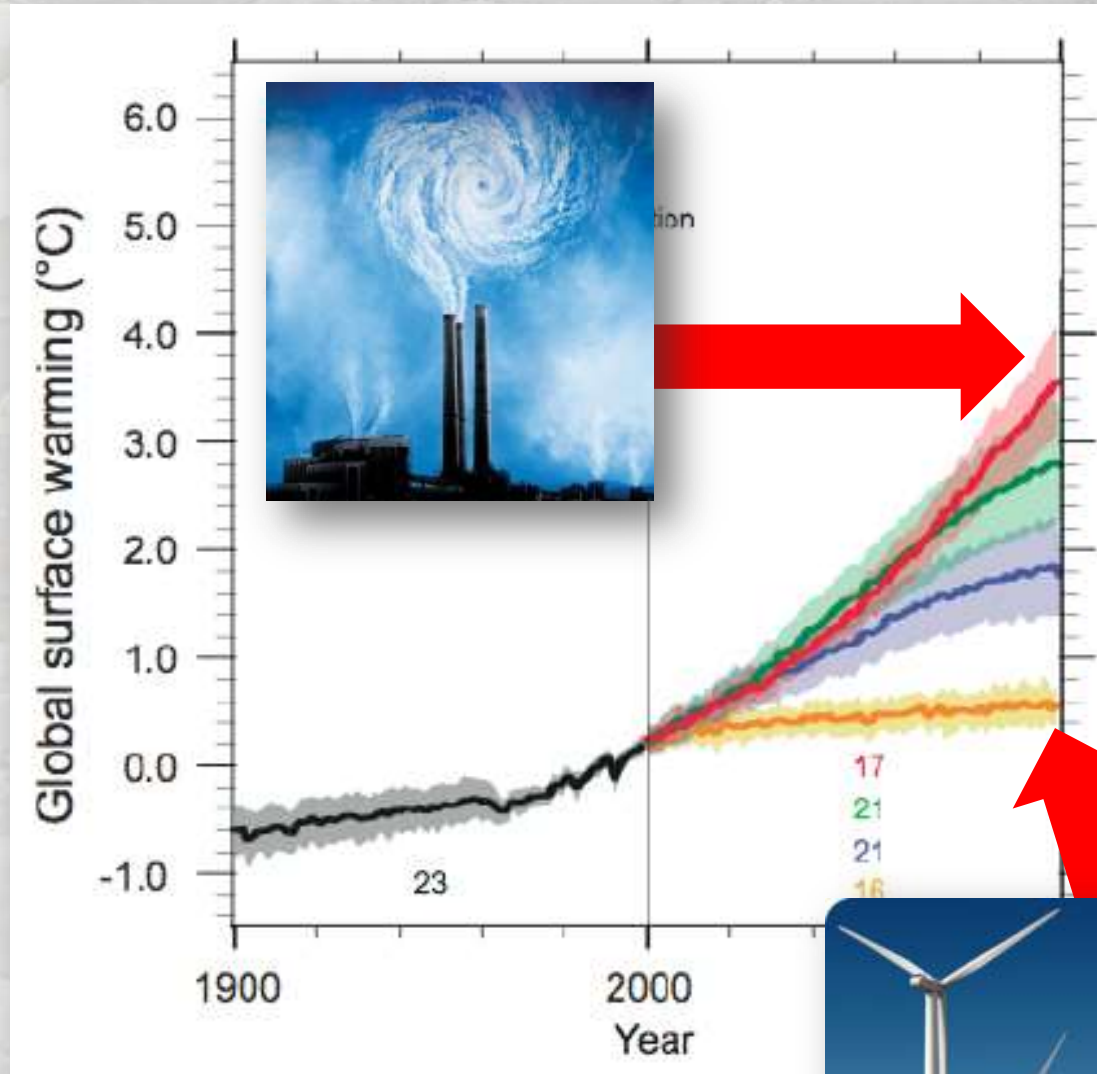
Strategic planning
is possible, but...



...urgency
may be lacking



Current Choices Set Future Trajectories



Current Choices Set Future Trajectories

Choice A: Coexistence (accept change passively &/or shape transition to more desirable communities)



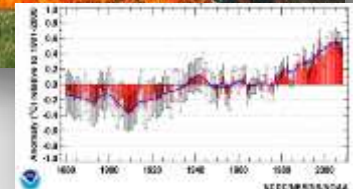
OR?



Choice B: Resistance (protect native biodiversity & other currently valued resources)



**Conservation reserves,
important fisheries**



Climate-Smart Prioritization of Habitat Restoration

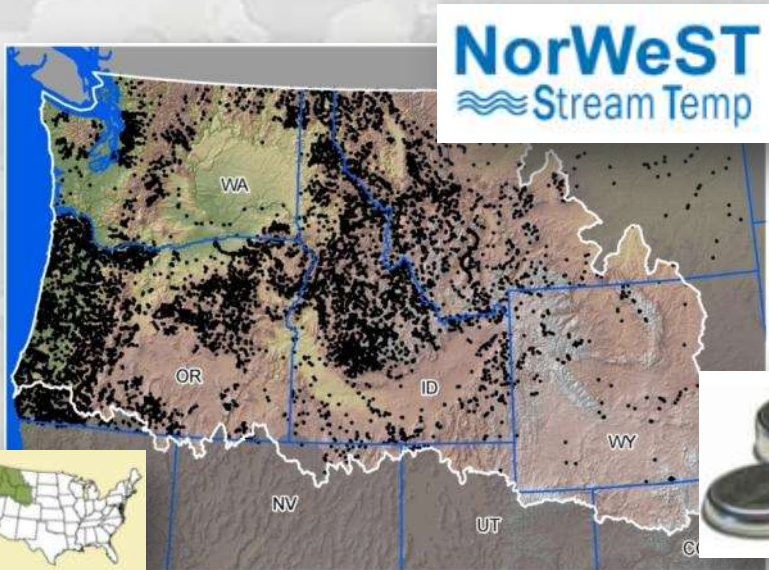
Lots of things we can do...

- Maintaining/restoring flow...
- Maintaining/restoring riparian...
- Restoring channel form/function...
- Prescribed burns limit wildfire risks...
- Non-native species control...
- Improve/impede fish passage...



**...but
where to
do them?**

Existing Data Can be Mined to Create Massive Amounts of Useful Information



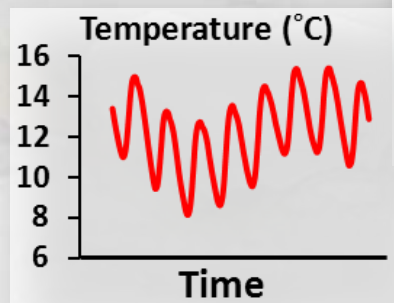
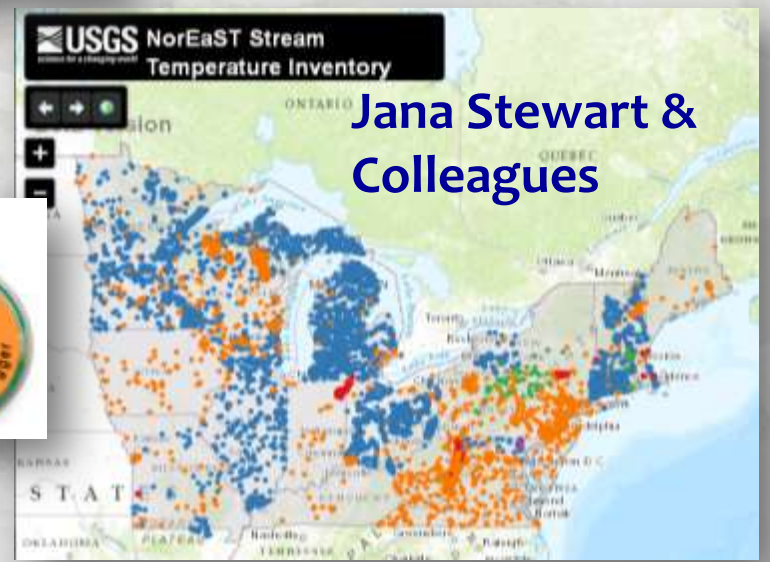
Free



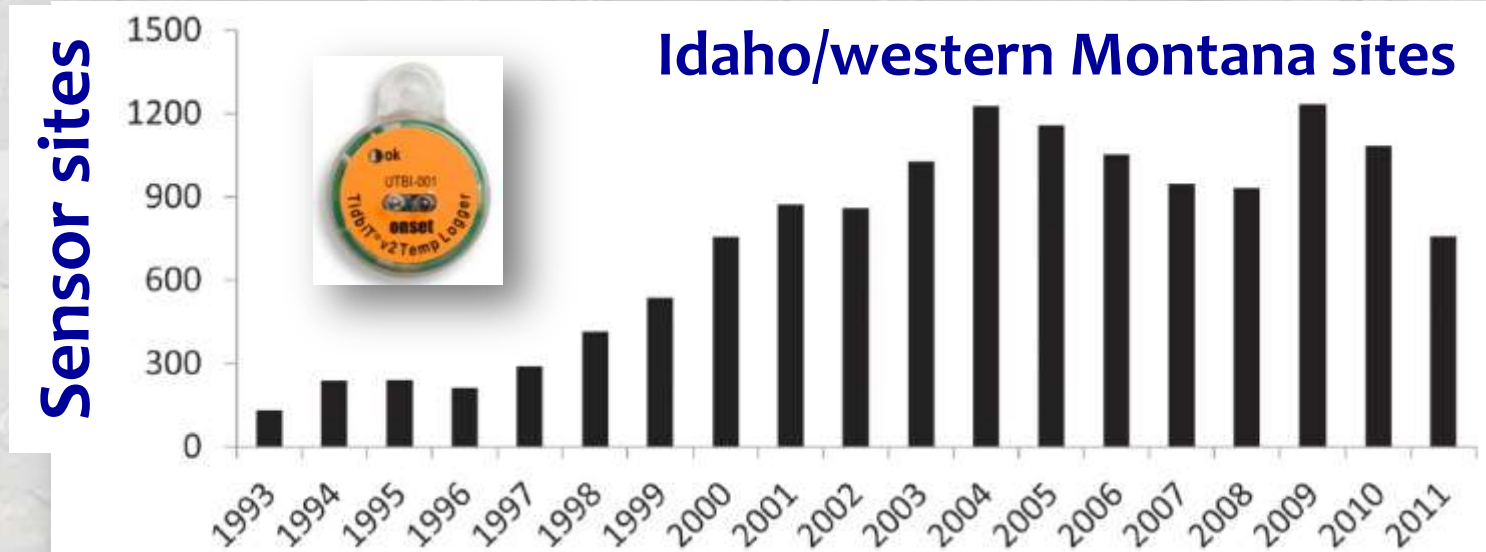
millions!



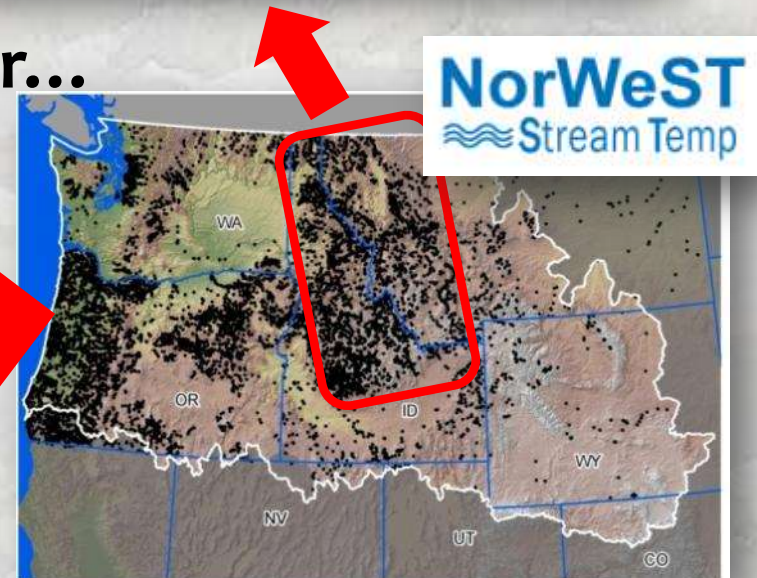
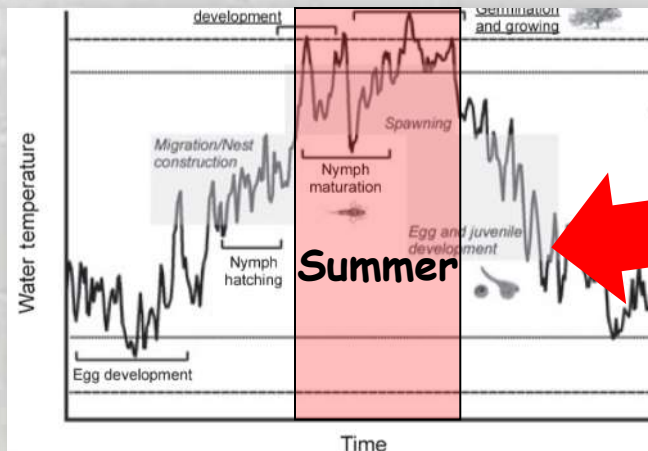
- >60 agencies
- >45,000,000 hourly records
- >15,000 unique sites



How Do We Monitor? Many sites, but...

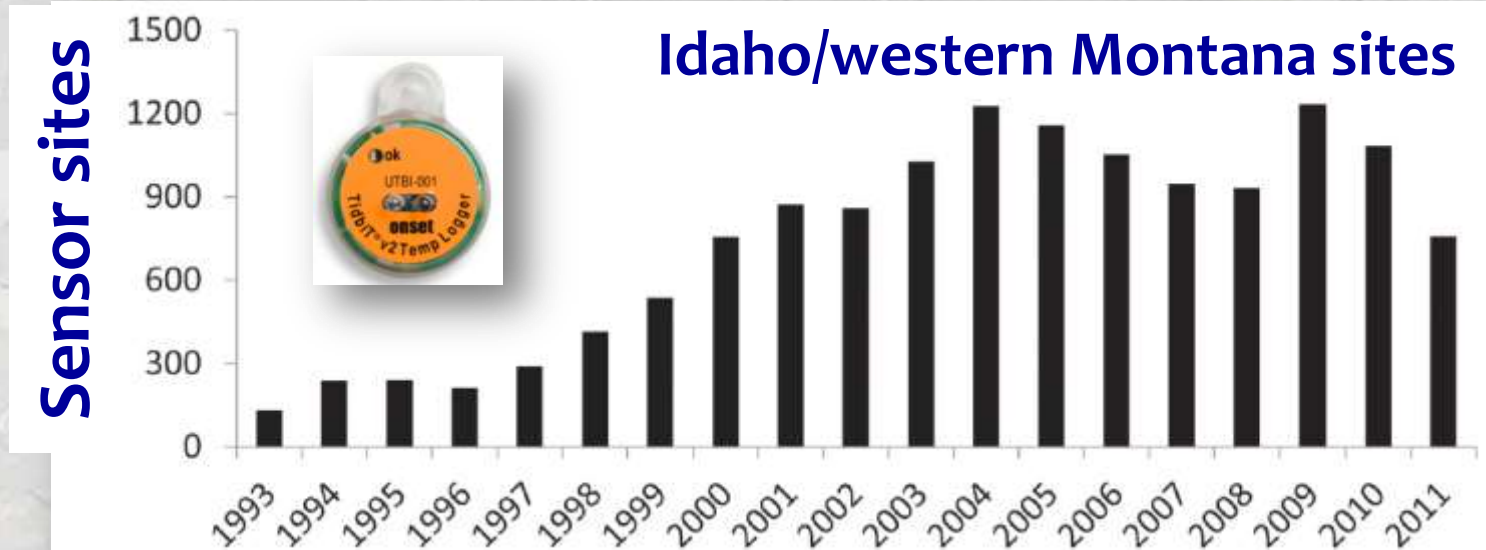


usually only in the summer...

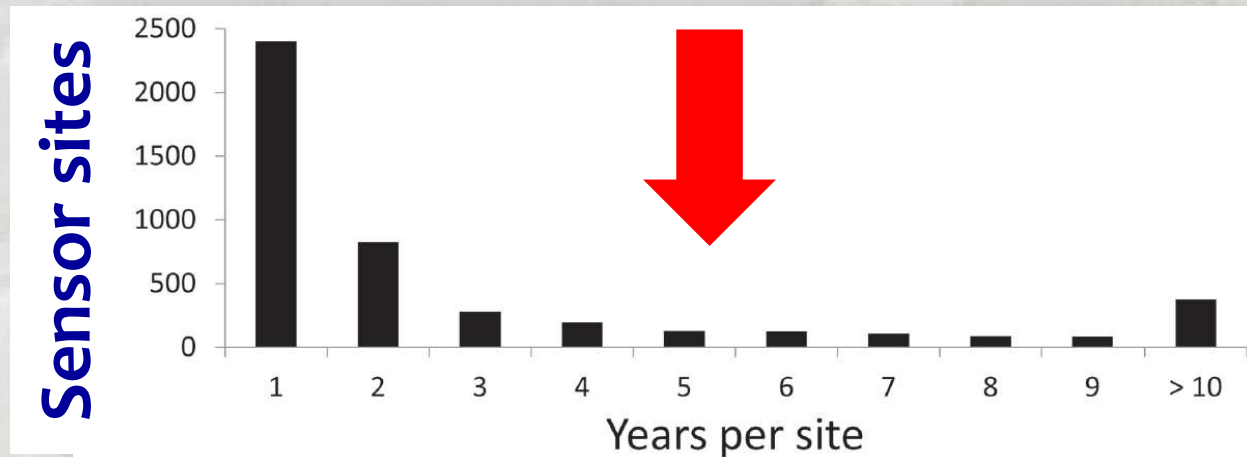


Isaak et al. 2013. [A simple protocol using underwater epoxy to install annual temperature monitoring sites in rivers and streams.](#) USFS General Technical Report, 314.

How Do We Monitor? Many sites, but...



& not for very long

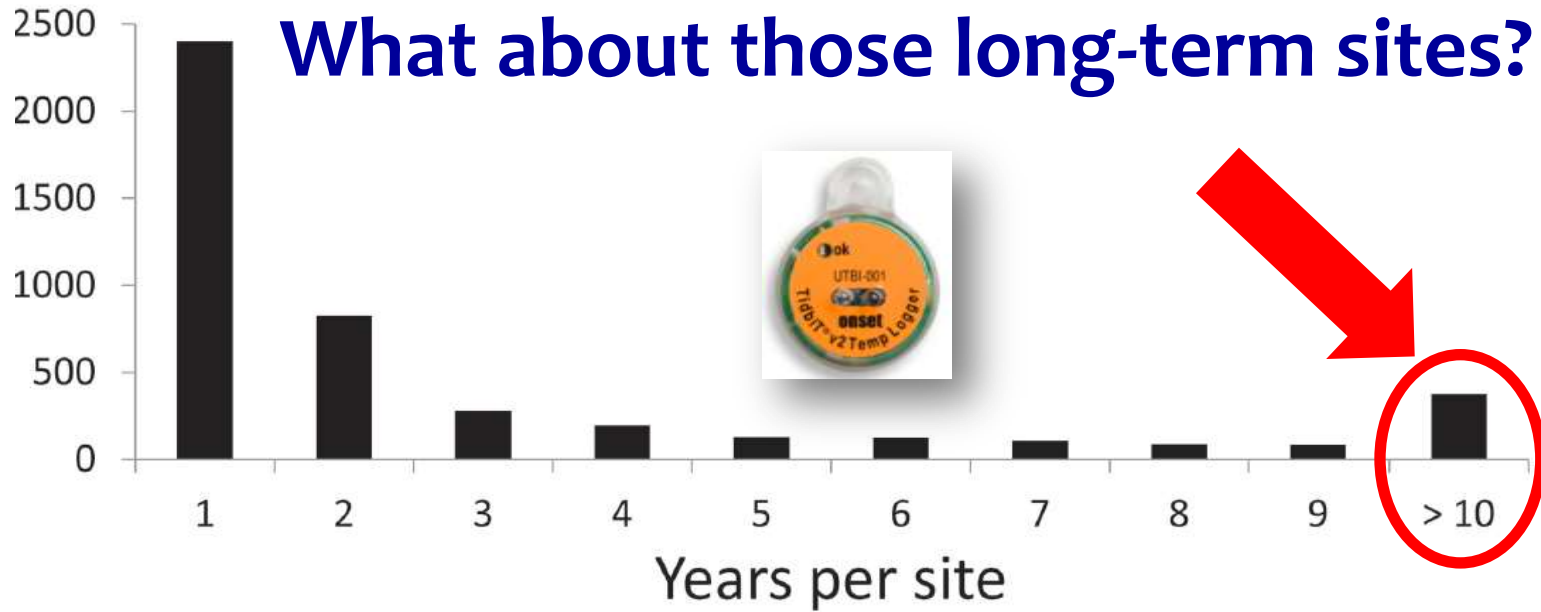


Isaak et al. 2013. [A simple protocol using underwater epoxy to install annual temperature monitoring sites in rivers and streams](#). USFS General Technical Report, 314.

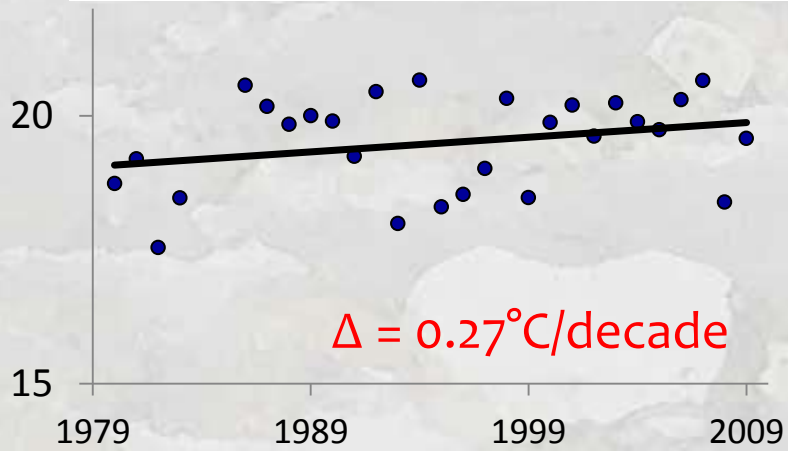


Sensor sites

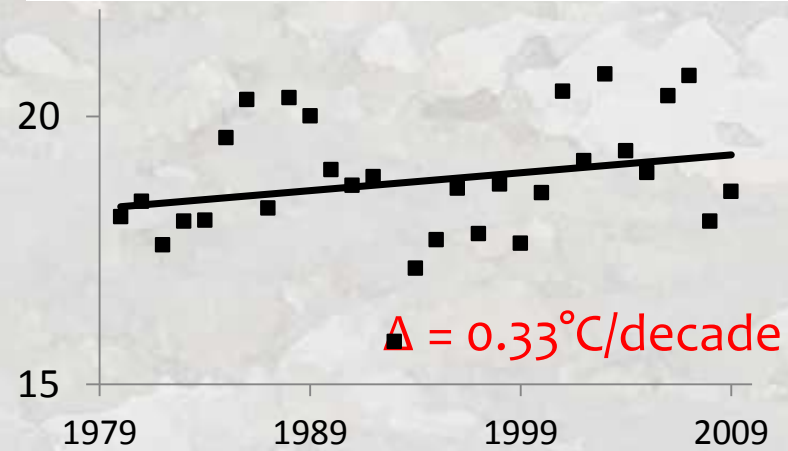
What about those long-term sites?



Snake River, ID - Summer



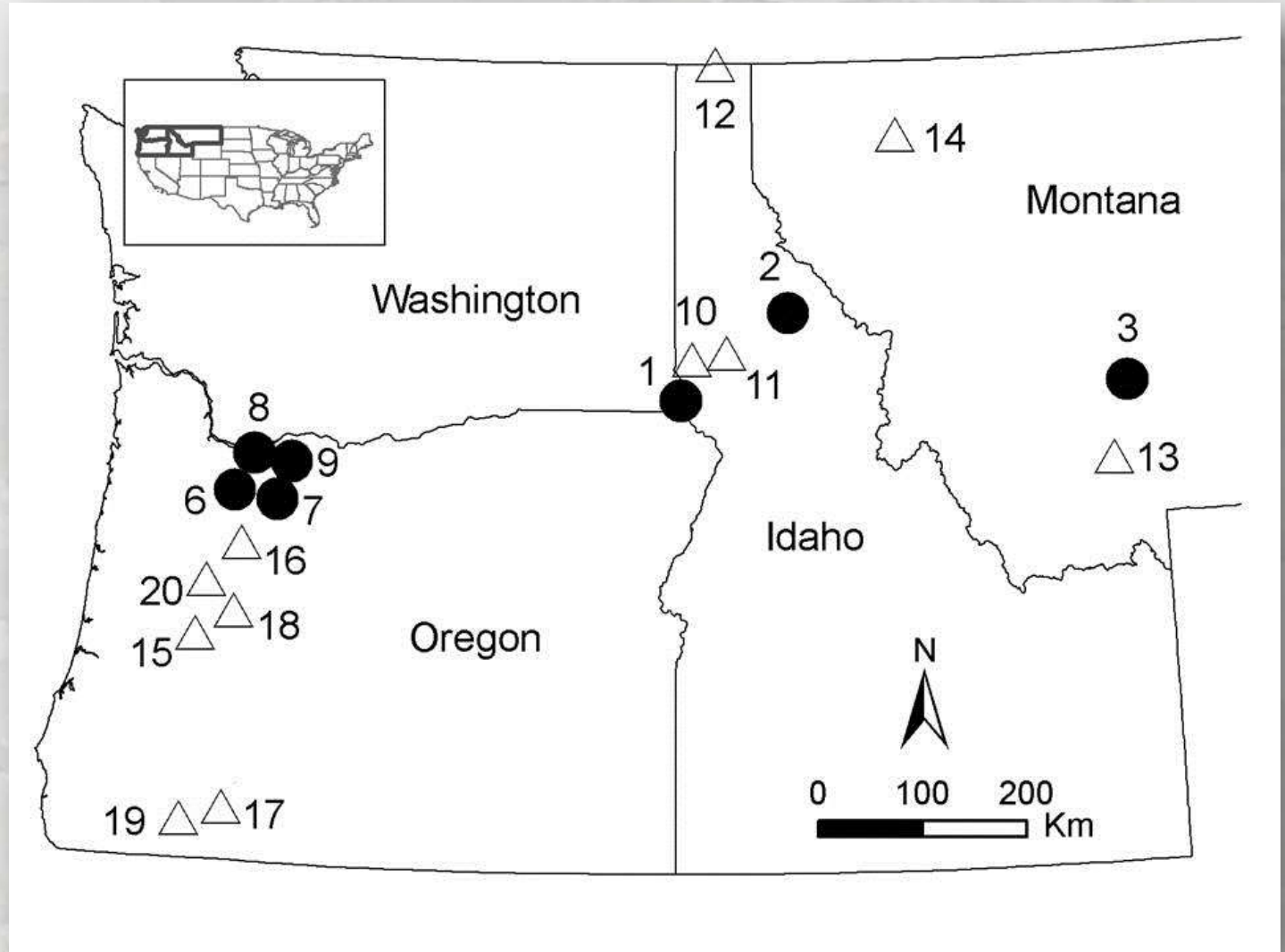
Missouri River, MT - Summer



Unregulated Sites With >25 Years Data

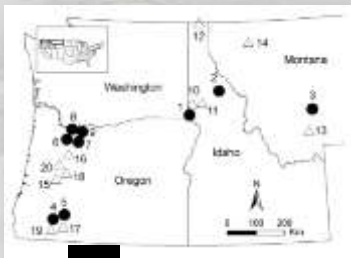
△ = regulated (11)

● = unregulated (7)

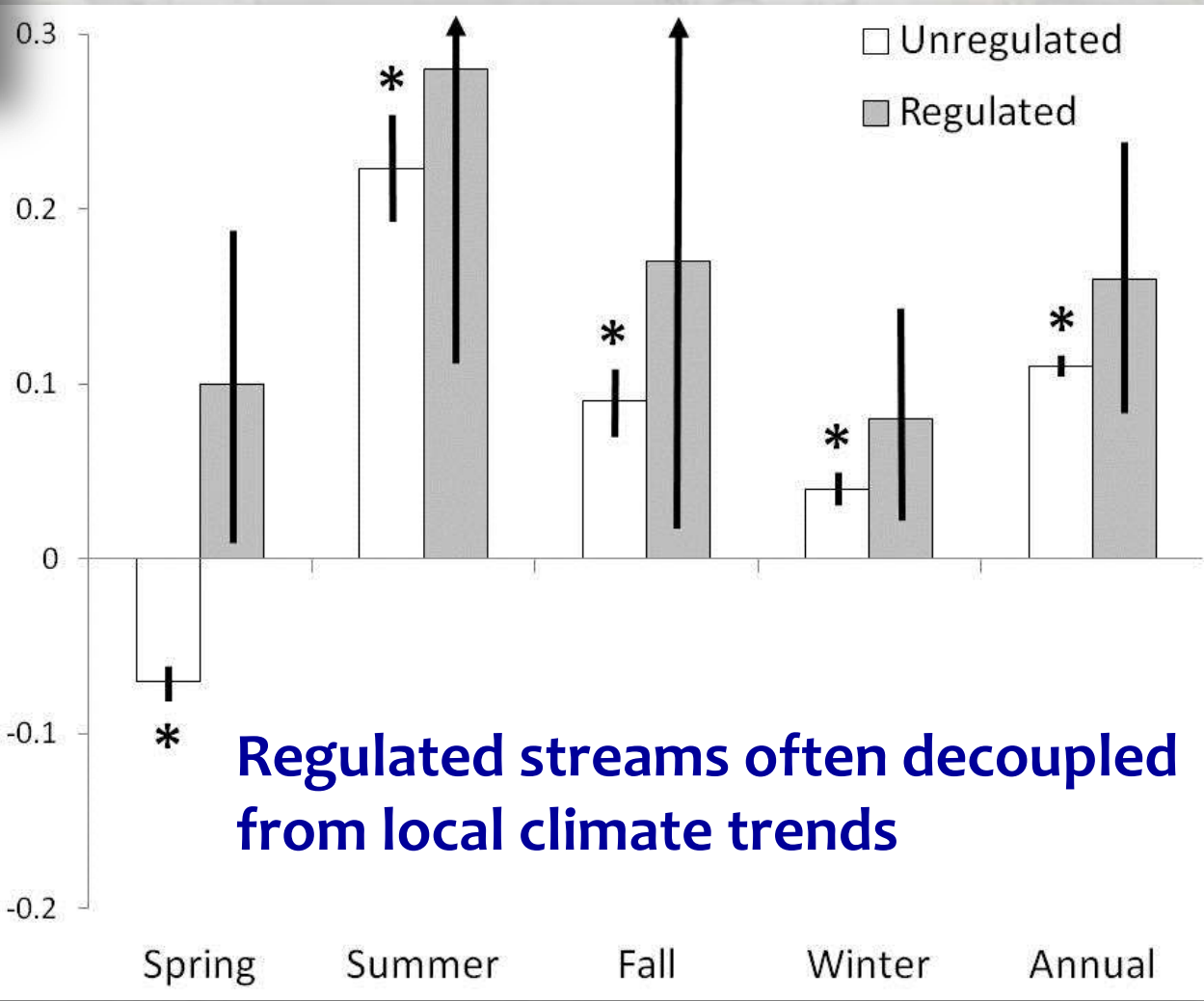


Data Source: USGS NWIS

Seasonal Trends In Stream Temperatures (1980-2009)



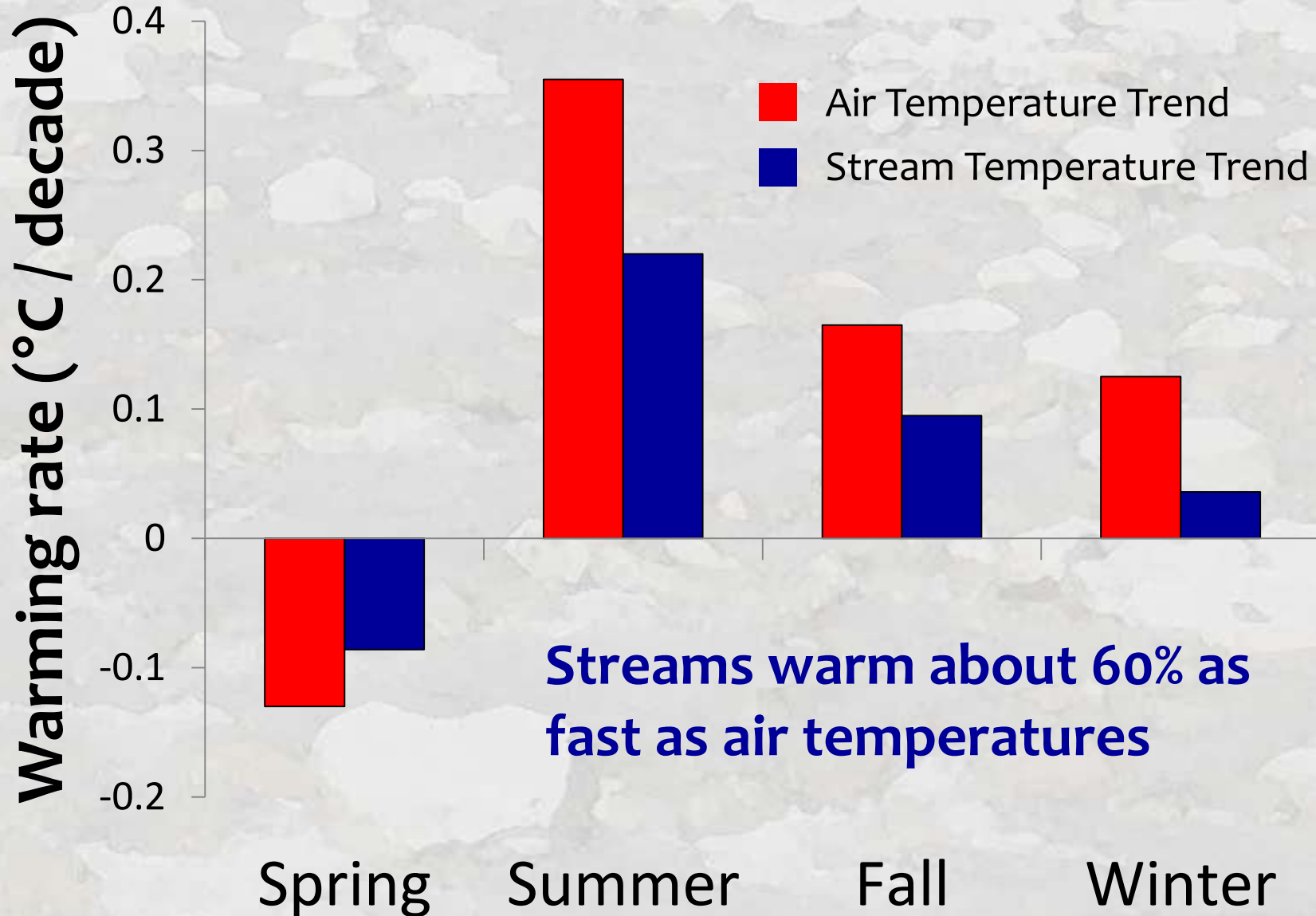
Warming rate ($^{\circ}\text{C} / \text{decade}$)



Regulated streams often decoupled from local climate trends

Stream Temperatures Track Air Temps

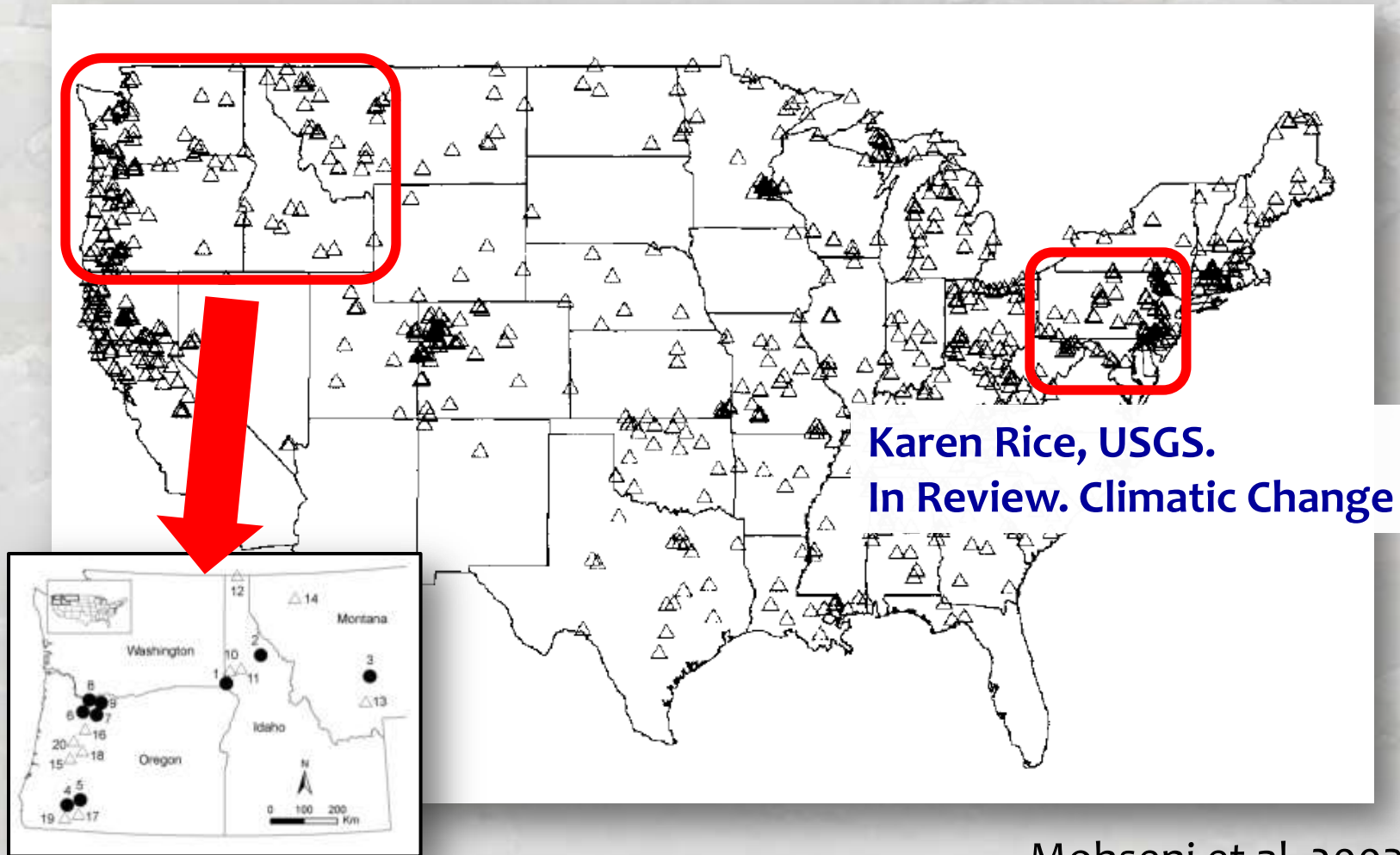
Trends at 7 Unregulated Sites



Sites with Long-term Monitoring Data?

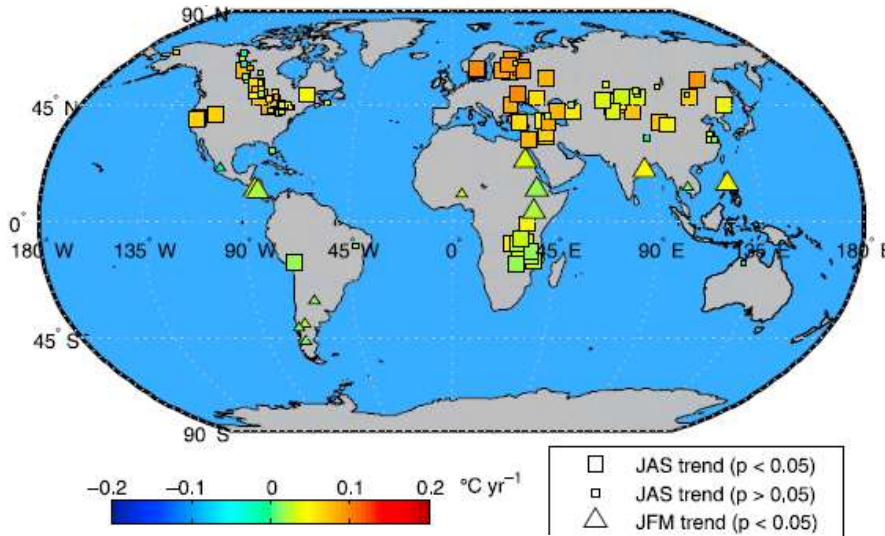
764 gage sites have some temperature data

USGS NWIS Database (<http://waterdata.usgs.gov/nwis>)

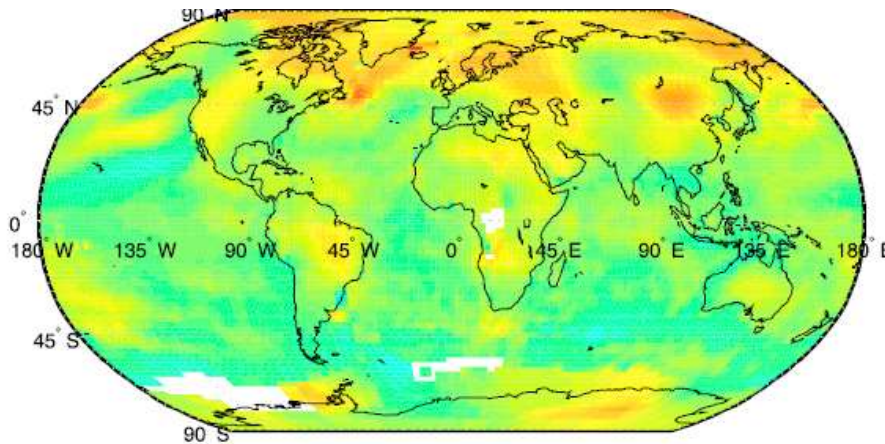


Global Lake Temperatures Increasing also...

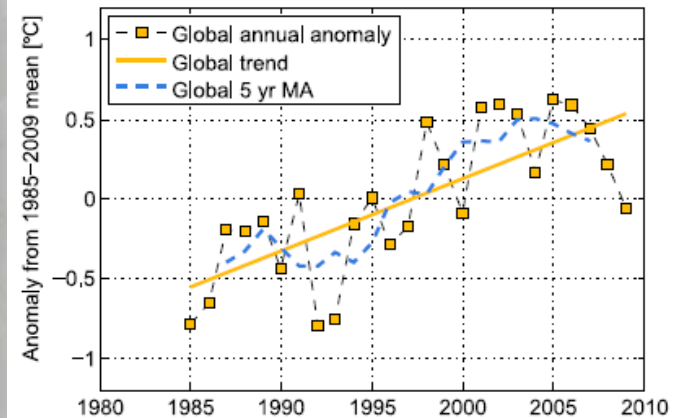
Individual Lake Temperature Trends



Concurrent Air Temperature Trends



Global Lake Temperature Trend



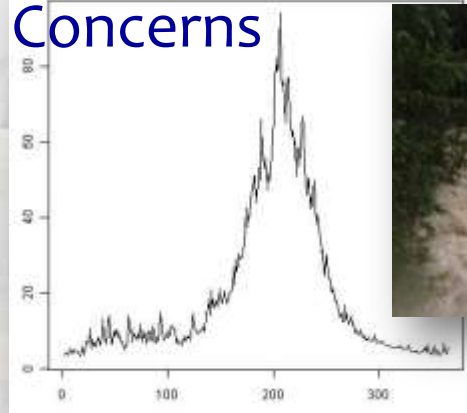
**+0.45°C/decade
from 1985-2009**

More Longterm, Annual Monitoring Needed

Inexpensive, reliable “epoxy protocol”

Annual Flooding

Concerns



Underwater epoxy cement



\$130 = 5 years of data

Data retrieved
from underwater



Sensors glued to large
boulders & bridges



Isaak et al. 2013. USFS Report;
Isaak & Horan 2011. *NAJFM* 31:134-137

Small Sensors & Immobile Objects



Small Sensors & Immobile Objects

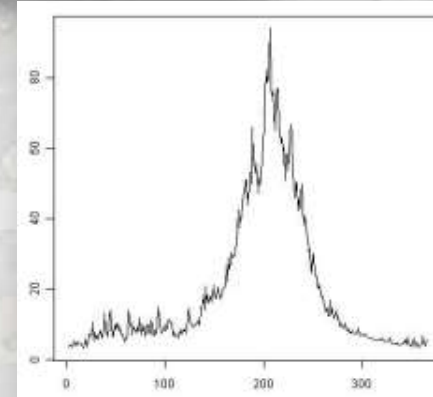
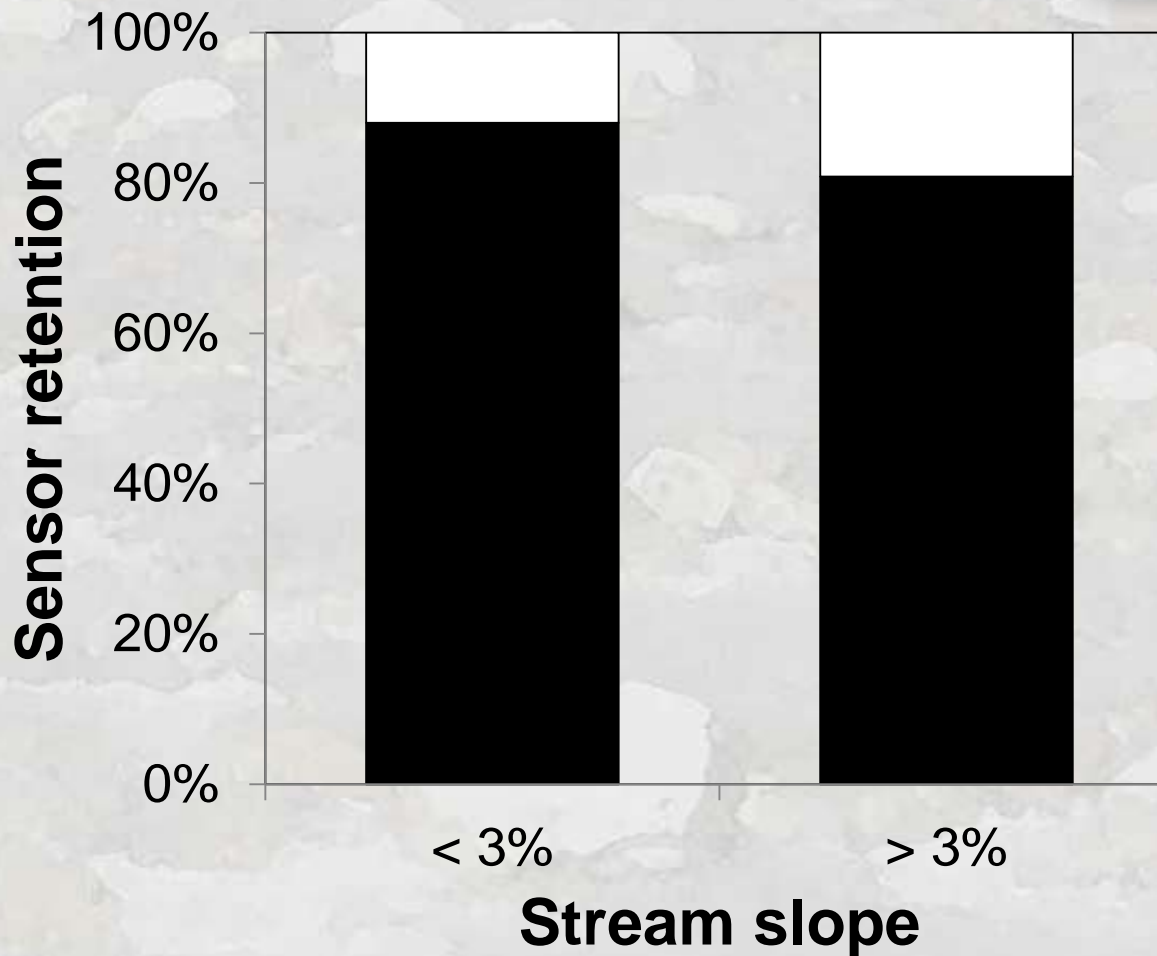


Does it Work?

Retention success at...

1 Year (n=72)

■ Retained □ Lost

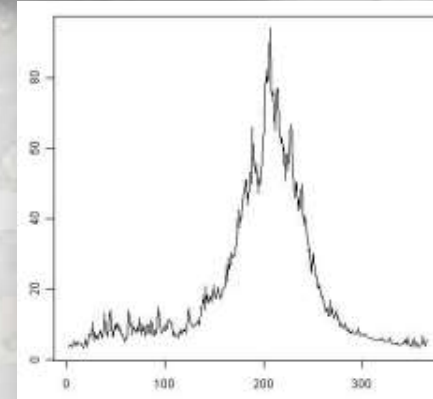
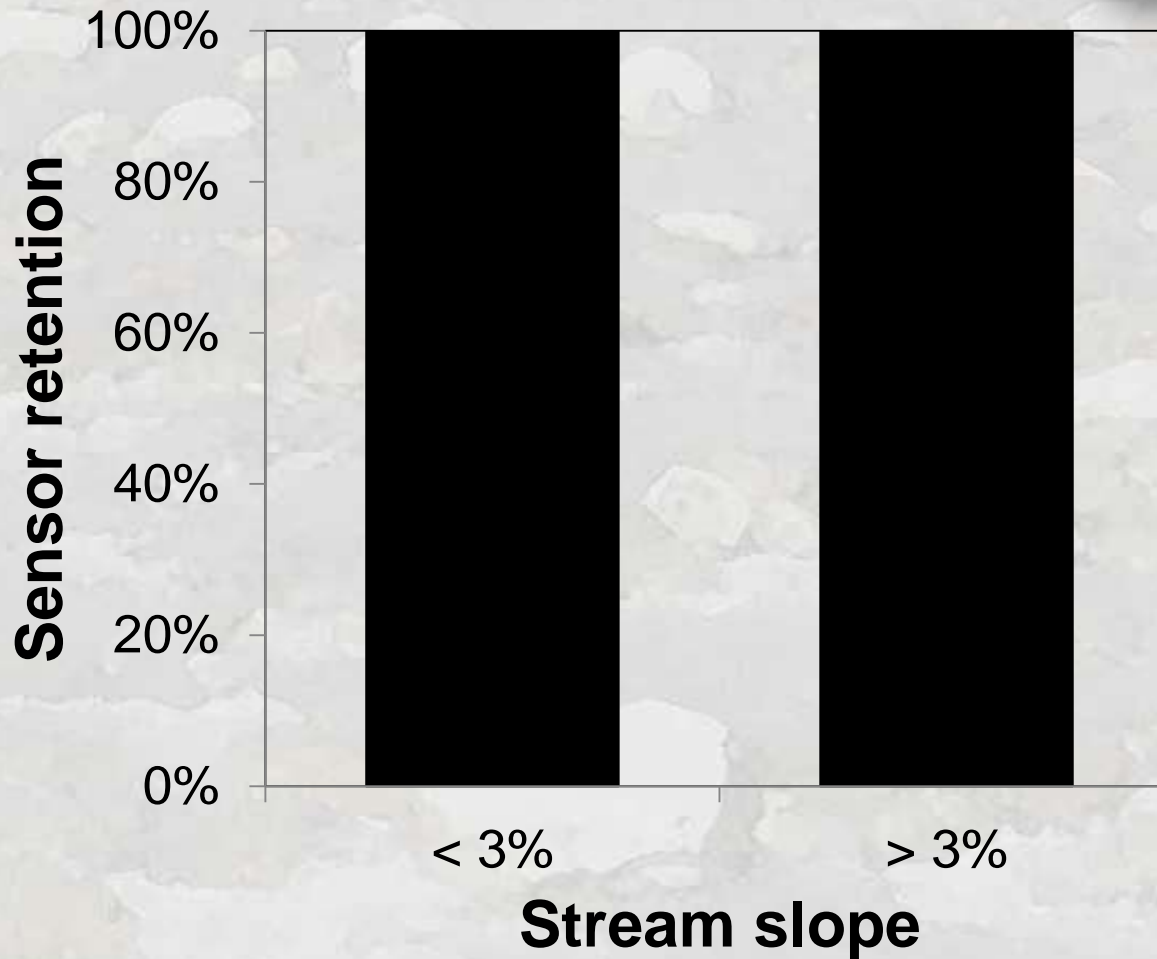


Does it Work?

Retention success at...

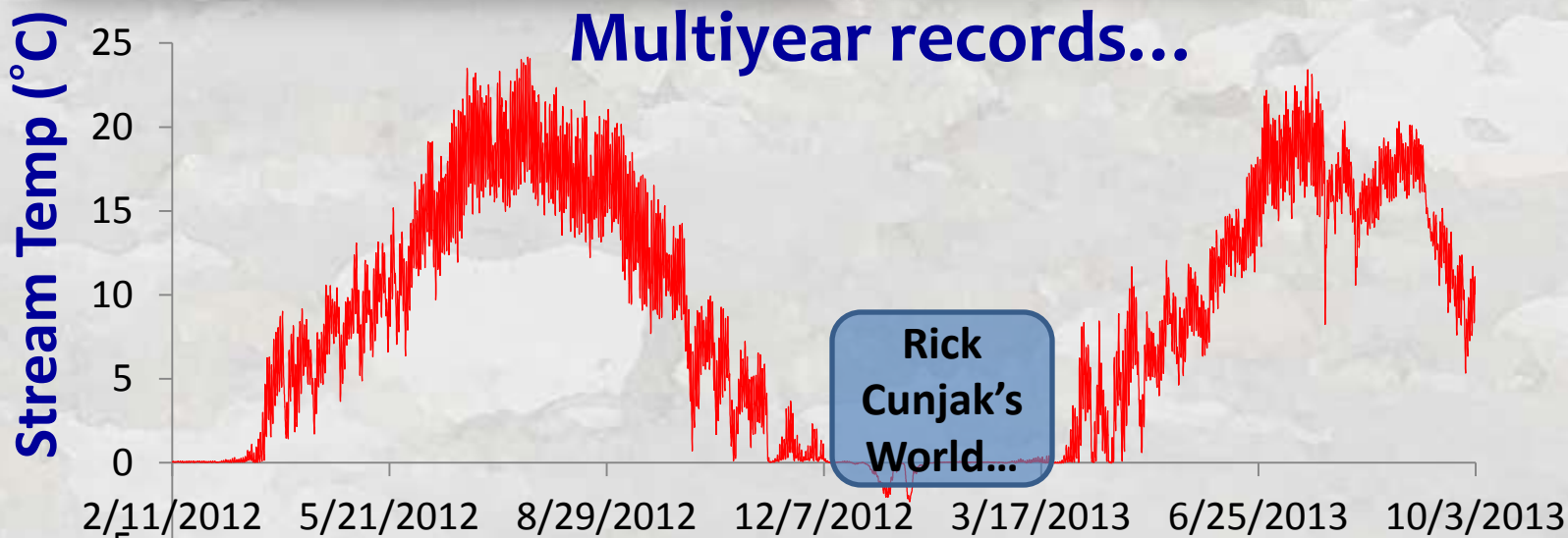
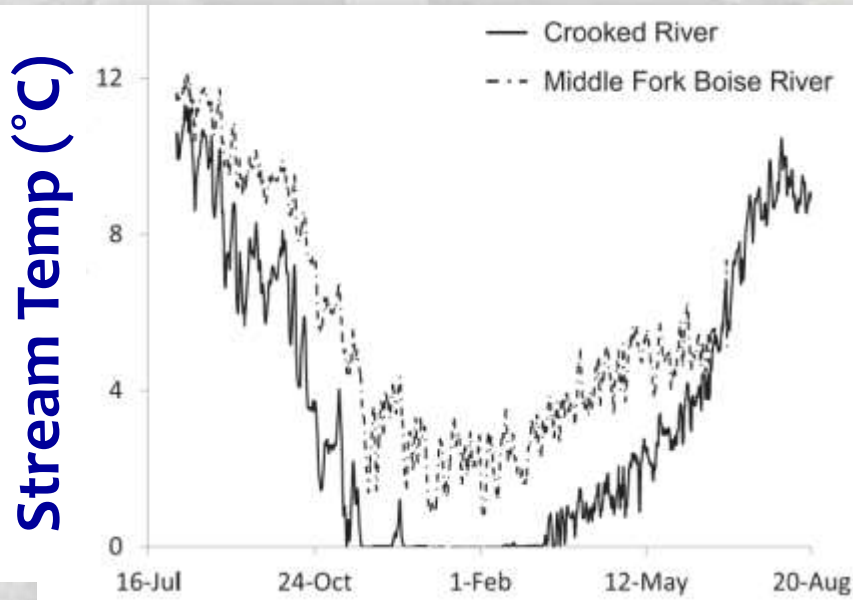
2 Year (n=35)

■ Retained □ Lost



It's a Win-Win

More data, more hunting!



Flexible Protocol Works with Miniature Sensors

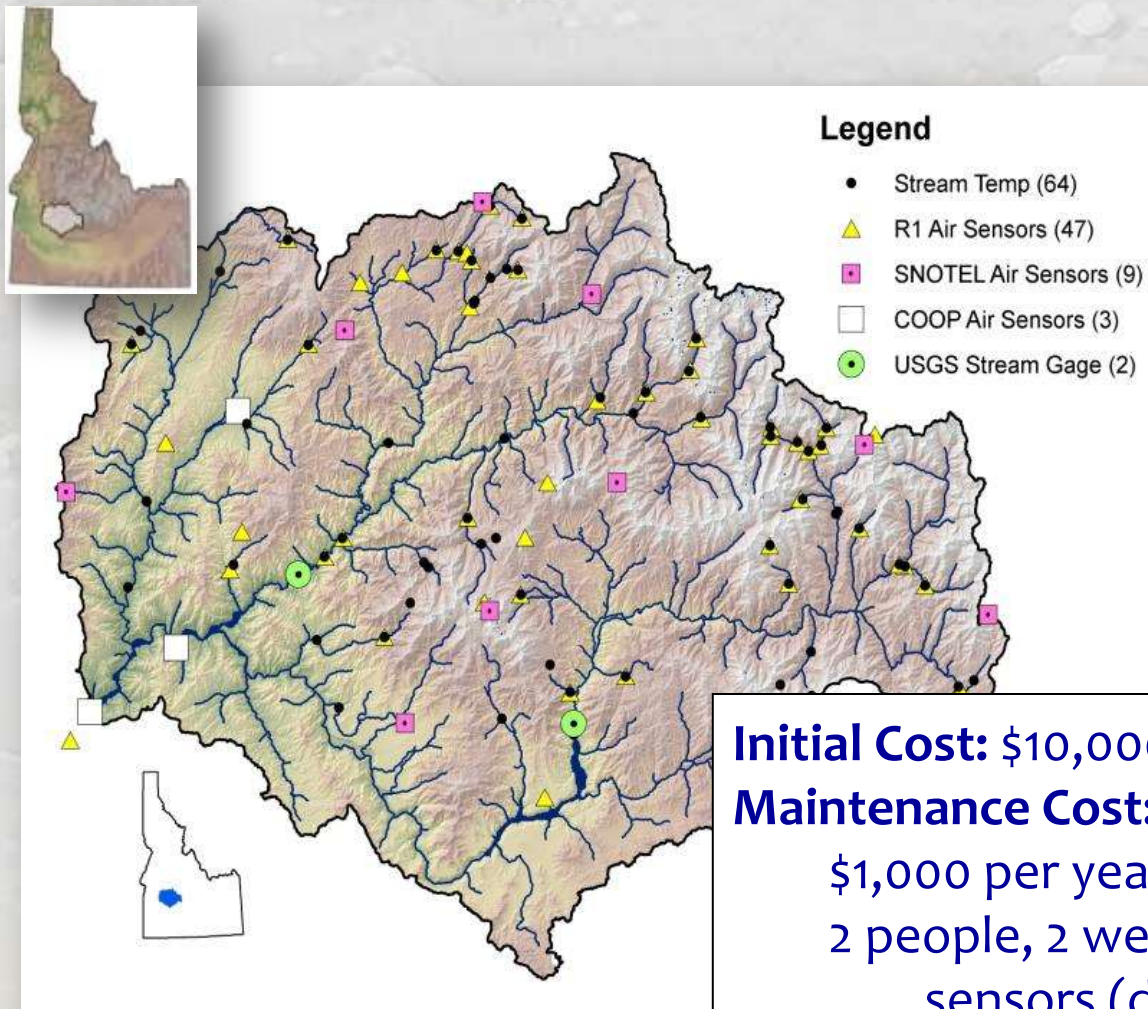


Sensor model	Accuracy	Battery life & memory	Cost
Hobo Pro v2	+/-0.2°C	6 years	\$123
Tidbit v2	+/-0.2°C	5 years	\$133
iButton	+/-0.5°C	1 year	\$20 – 40
Tinytag Aquatic 2	+/-0.5°C	1 year	\$170

Example Annual Monitoring Networks...

Dense sensor arrays for landscape analysis

Boise River Basin – 7,000 hectares, 2,500 stream kilometers



Stream sensors



Air sensors

Initial Cost: \$10,000

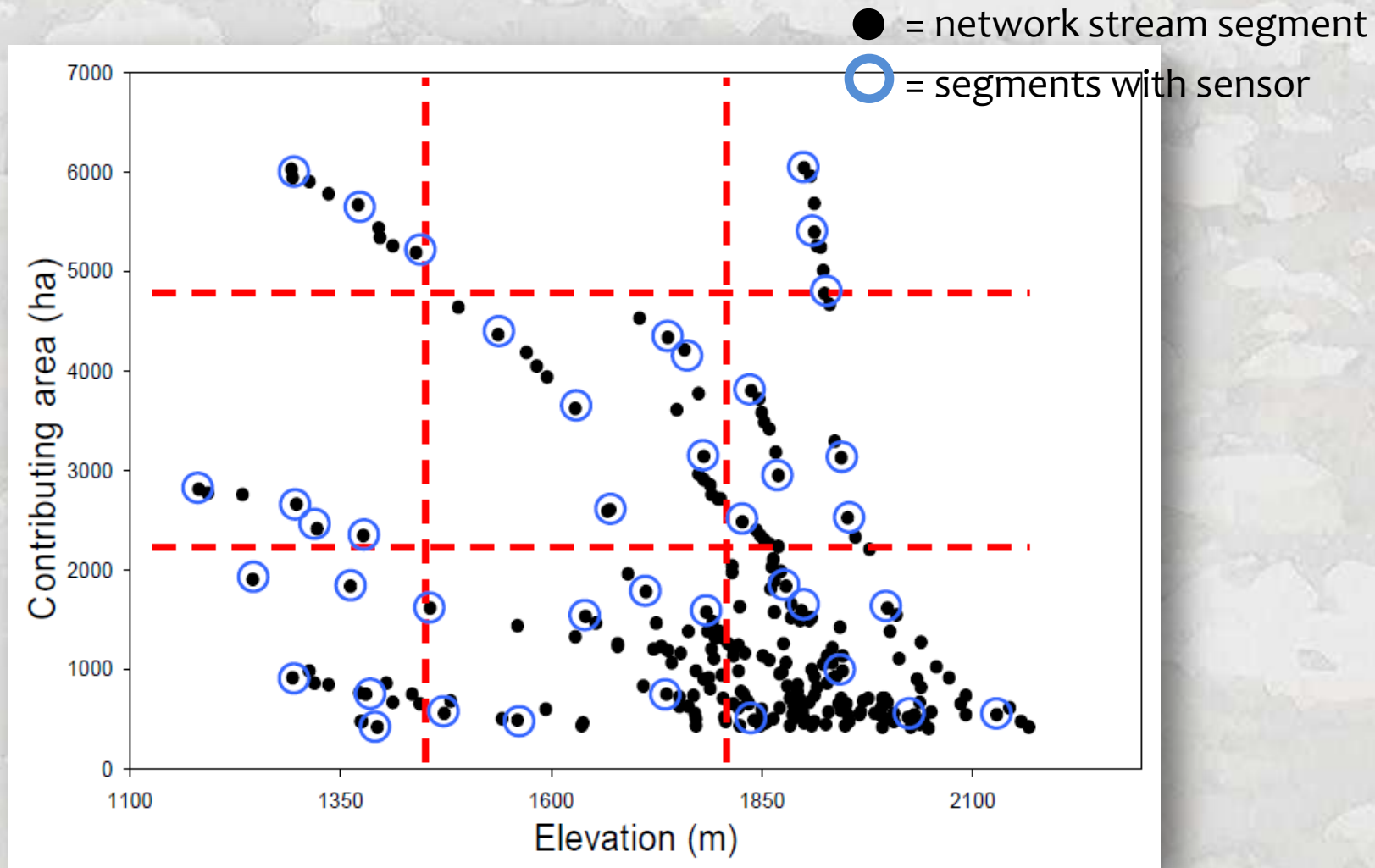
Maintenance Cost:

\$1,000 per year

2 people, 2 weeks to visit

sensors (download & replace)

Sample Sites Representative of Full Network Gradients



Plots easily developed from reach descriptors already linked to NHDPlus hydrography layer

“Bracket” Important Local Features

Sensors above & below measure the effect

Lakes/Reservoirs/Bogs



Hot Springs



Degraded Riparian Areas



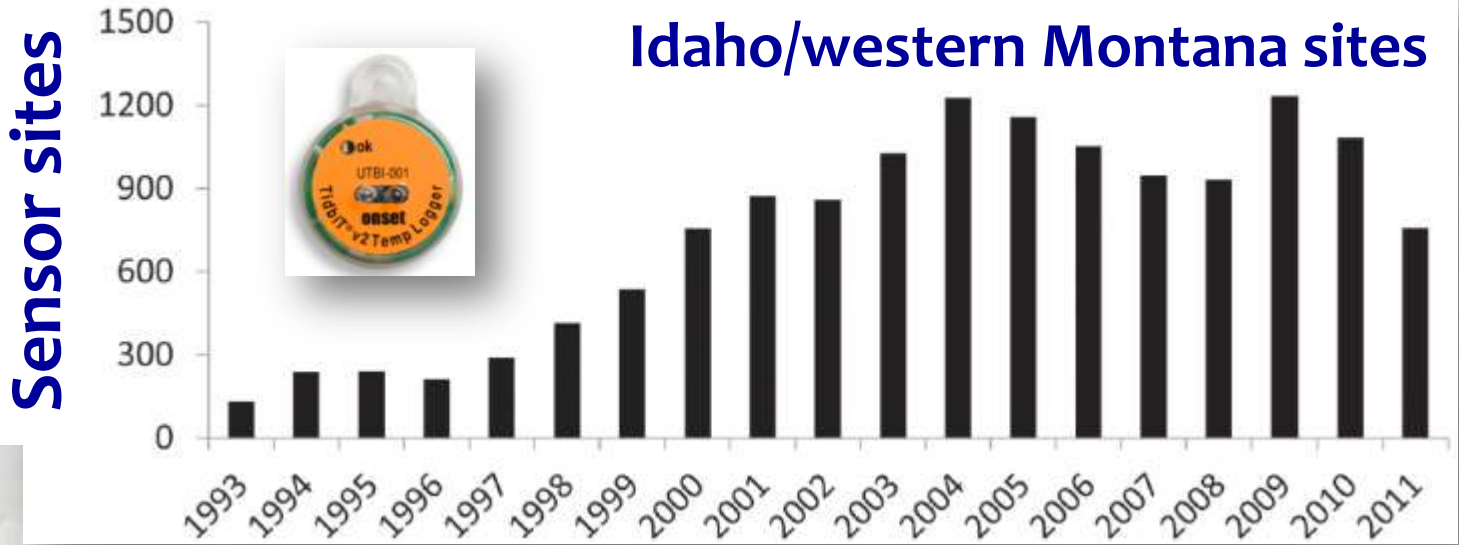
Clearcuts



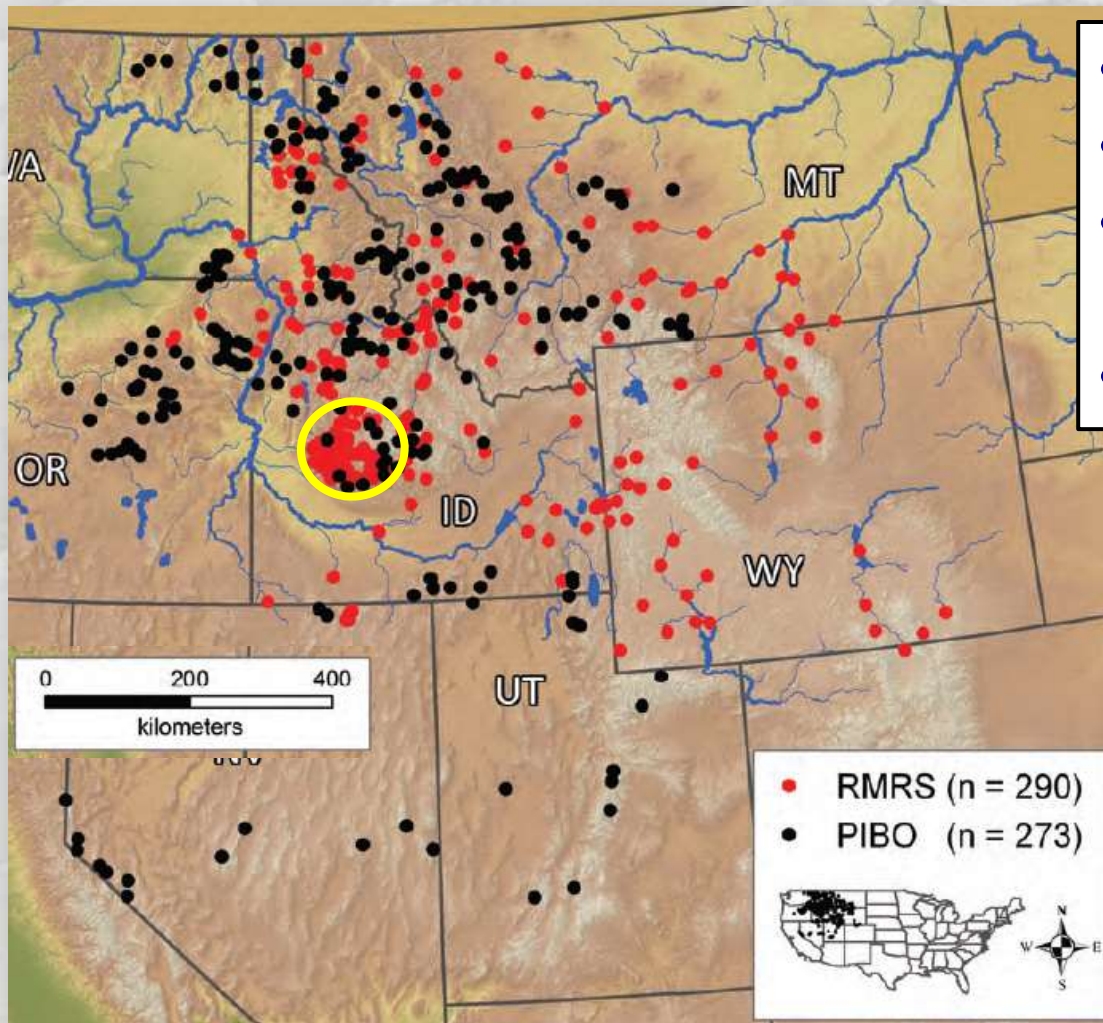
Wildfires



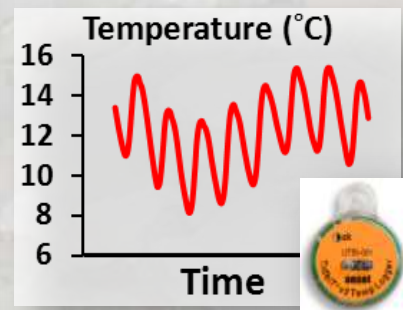
Monitoring GAP = unregulated rivers with important fisheries



NoRRTN: Northern Rockies River Temperature Network



- n = 563 sites;
- Cost = \$100,000;
- 3 months time for 2 technicians;
- 2,500 years data



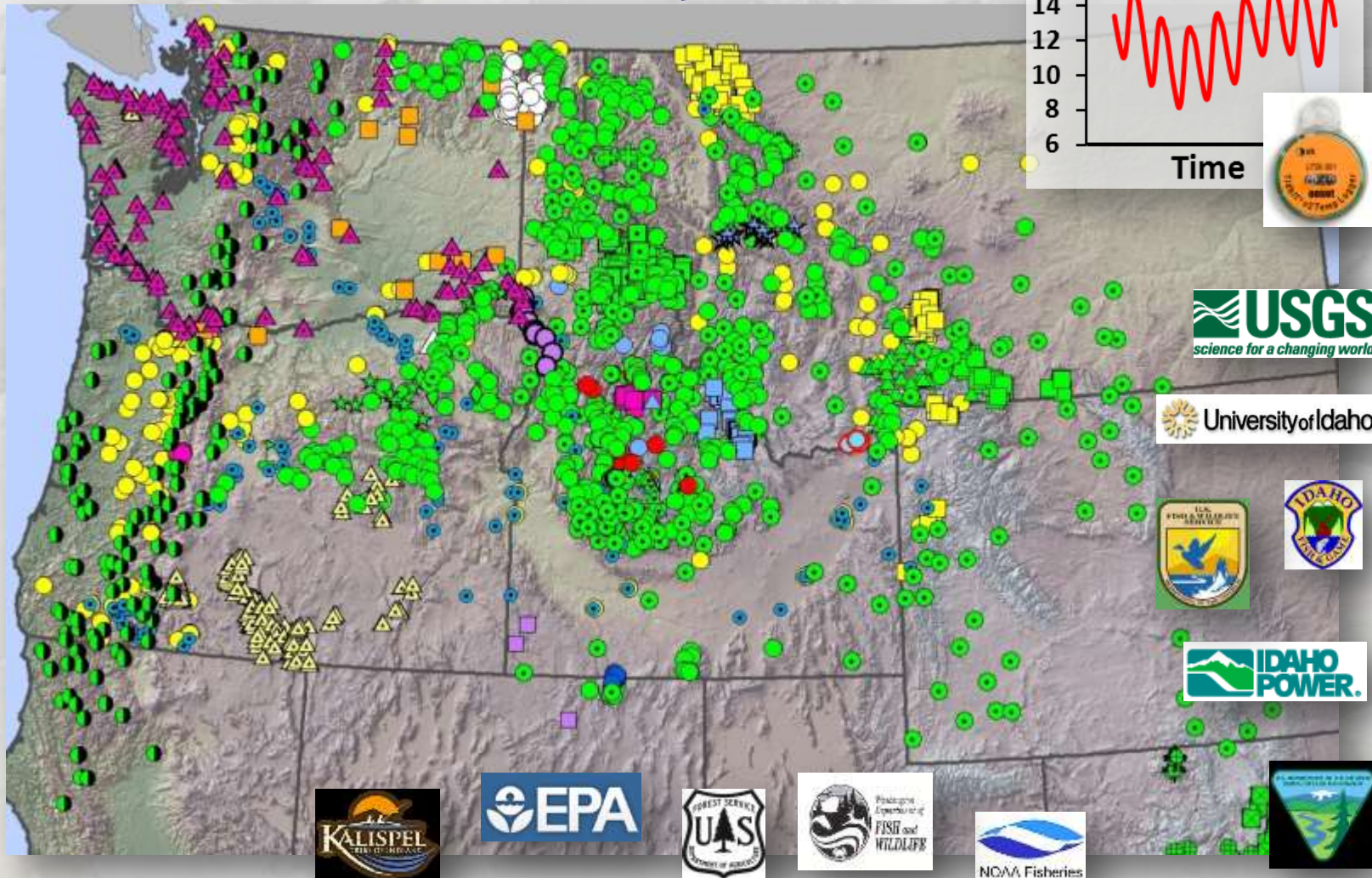
During today's meeting, NoRRTN recorded 3,378 stream temperatures (that's 3,698,910 annually...)



Annual Temperature Monitoring is Increasing

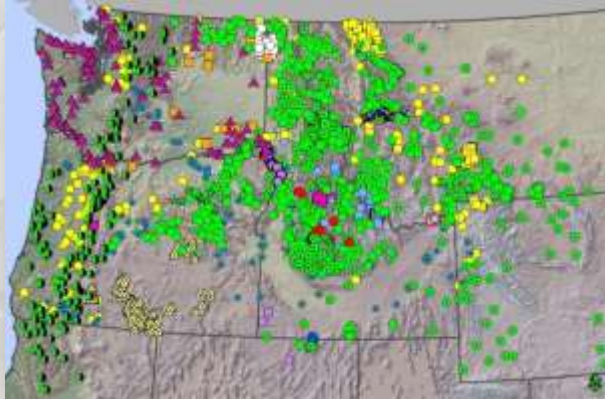
>3,000 sites in Pacific Northwest

>300 new sites last year



A GoogleMap Tool for Dynamic Queries of Temperature Monitoring Sites

Regional Sensor Network



Site Information

- Stream name
- Data steward contact information
- Agency
- Site Initiation Date



Query Individual Sites

Montana Annual Stream Temperature Points available
www.fs.fed.us/m/boise/AWAE/projects/temperature.shtml
Stream Temperature Points available by Agency
2/02/2011
52 views - Public
Created on Feb 2 - Updated 13 hours ago
By
Rate this map - Write a comment

- **Adair Creek**
Thermograph Location: Adair Creek Contact: Clint Muhfeld - cmuhfeld@usgs.gov (406-988-7926)
USGS, NOROCK
- **Agassiz Creek**
Thermograph Location: Agassiz Creek Contact: Clint Muhfeld - cmuhfeld@usgs.gov (406-988-7926)
USGS, NOROCK
- **Akonala Creek**
Thermograph Location: Akonala Creek Contact: Clint Muhfeld - cmuhfeld@usgs.gov (406-988-7926)
USGS, NOROCK

Cottonwood-Clyde Park- Creek
Updated 2 days ago
Thermograph Location: Cottonwood-Clyde Park- Creek
Contact: Robert Al-Chokhachy - ral-chokhachy@usgs.gov (406-994-7842)
USGS, NOROCK
Directions Search nearby more
1 of 2 nearby results Next

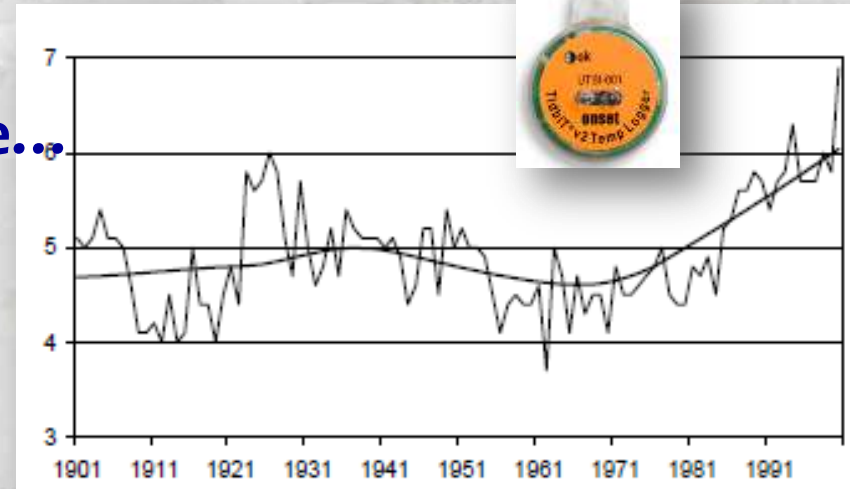
GoogleMap Tool at “Stream Temperature Monitoring and Modeling” website



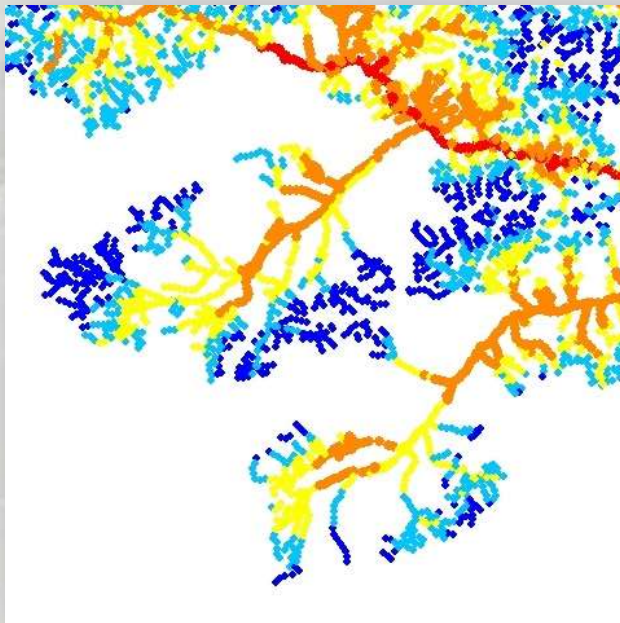
How Long Should Temperatures be Monitored?

Long-term records are rare...

So some sites should be monitored indefinitely



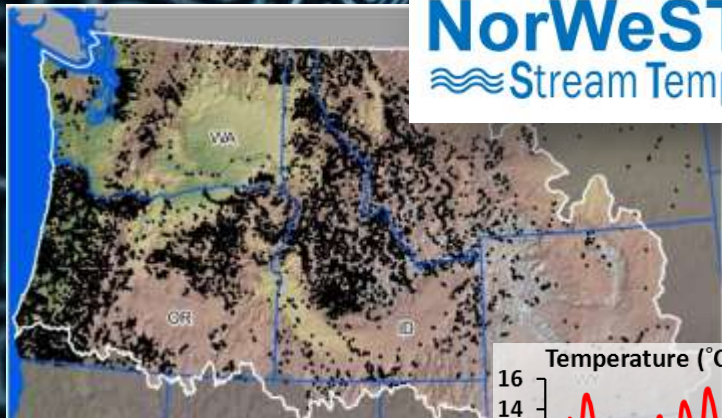
Webb and Nobilus 2007



... but spatial variation among sites contains most “information” about thermal regimes

So some sites could be monitored for short periods (2 – 3 years) & sensors rotated to new sites

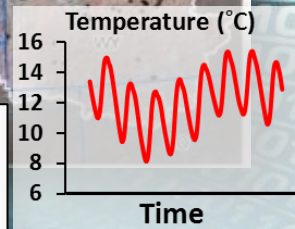
So What About All That Summer Data?



NorWeST
Stream Temp



**~45,000,000
hourly records**



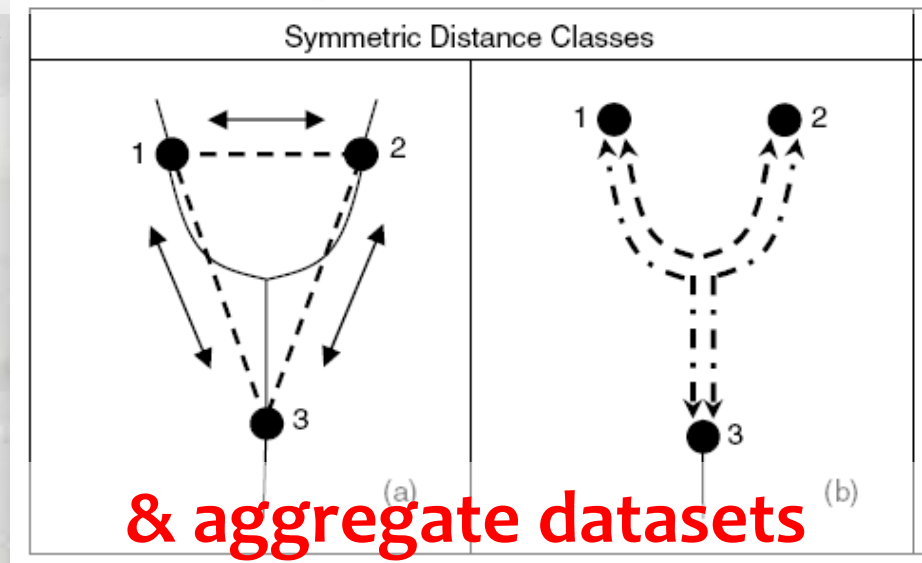
BIG DATA = BIG INFORMATION?

BIG DATA are often Autocorrelated

Spatial Statistical Network Models



Valid interpolation on networks

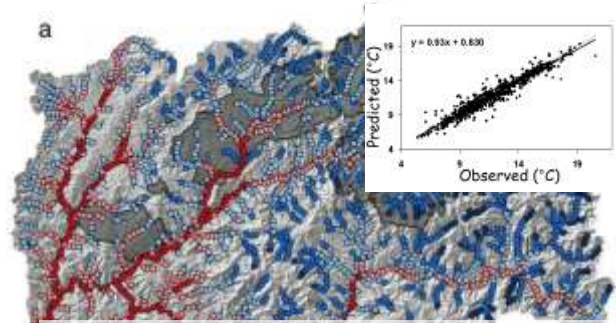
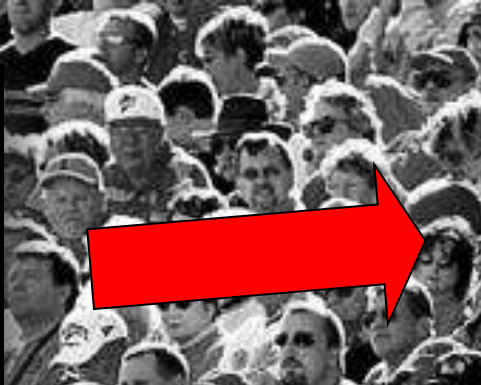
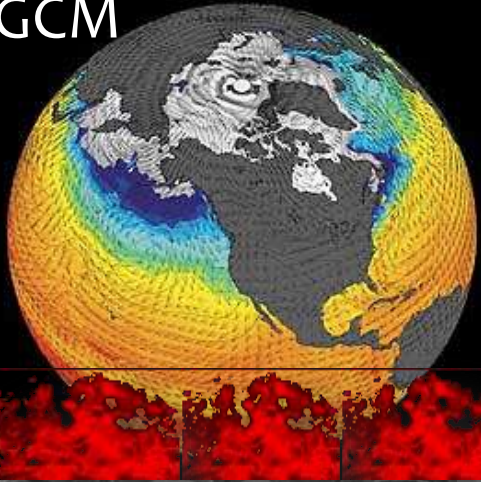


Advantages:

- flexible & valid autocovariance structures that accommodate network topology & non-independence among observations
- improved predictive ability & parameter estimates relative to non-spatial models

Spatial Models Enable “Crowd-Sourcing” so Everyone’s Data is Used

GCM



Data Collected by Local Bios & Hydros

Coordinated Management Responses?



Management Decisions



The NorWeST Stream Temperature Database, Model, & Climate Scenarios

Dan Isaak, Seth Wenger¹, Erin Peterson², Jay Ver Hoef³ Charlie Luce, Steve Hostetler⁴, Jason Dunham⁴, Jeff Kershner⁴, Brett Roper, Dave Nagel, Dona Horan, Gwynne Chandler, Sharon Parkes, Sherry Wollrab, Colete Breshares, Neal Bernklau

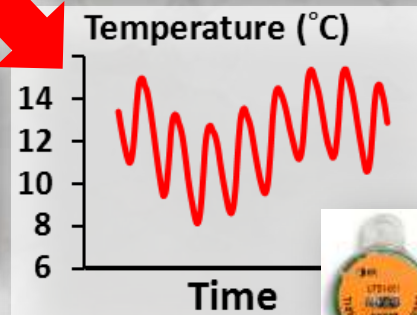
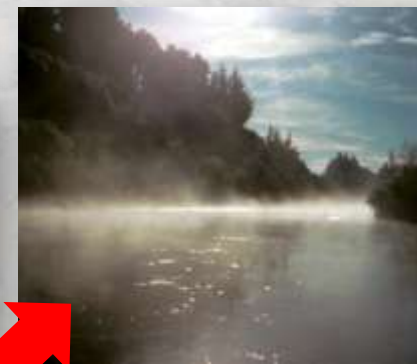
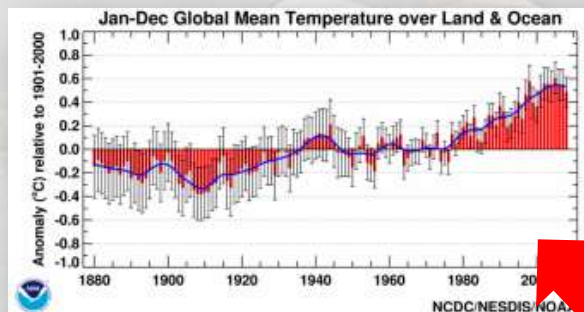
U.S. Forest Service

¹Trout Unlimited

²CSIRO

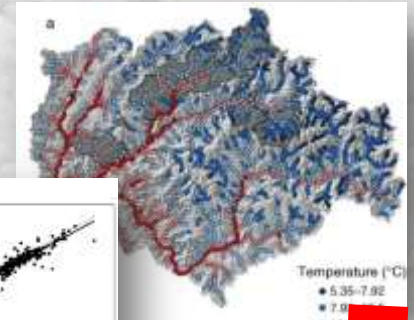
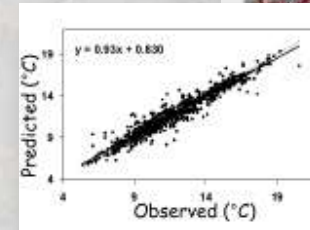
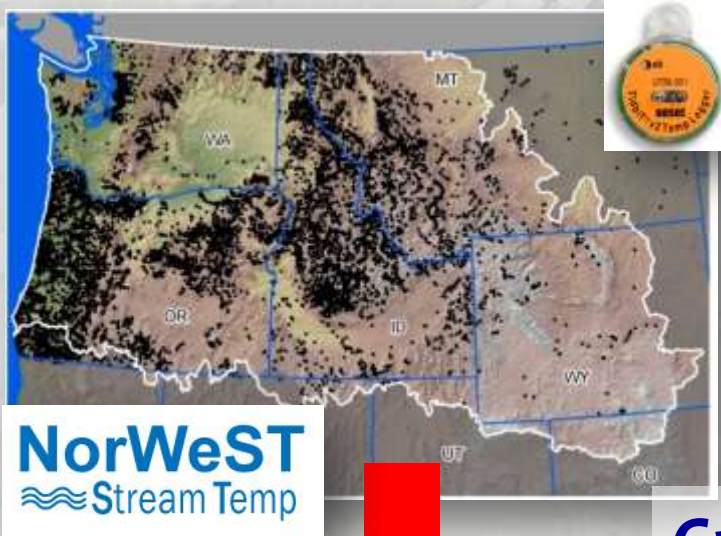
³NOAA

⁴USGS



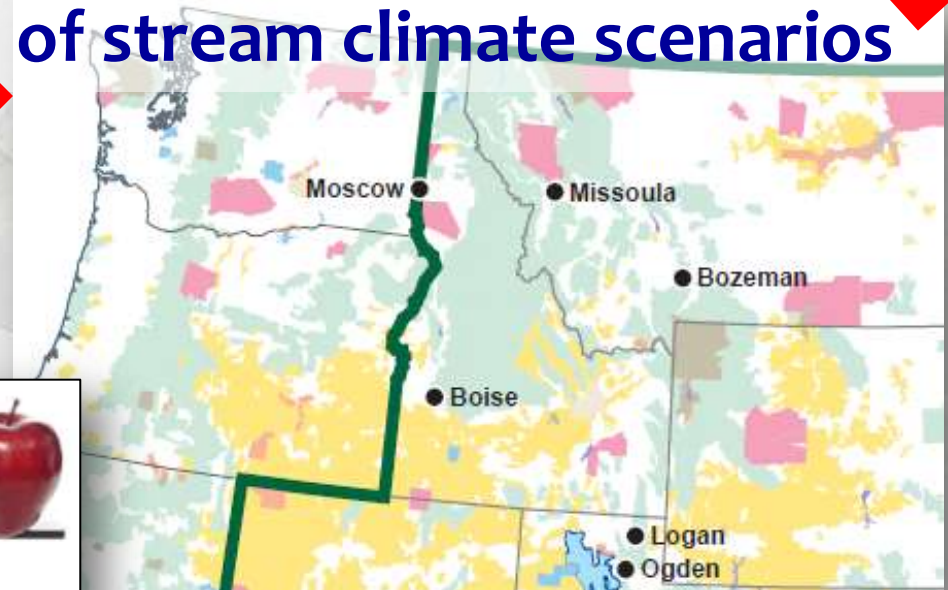
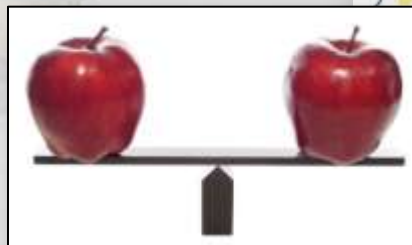
Regional Temperature Model

Accurate stream temp model

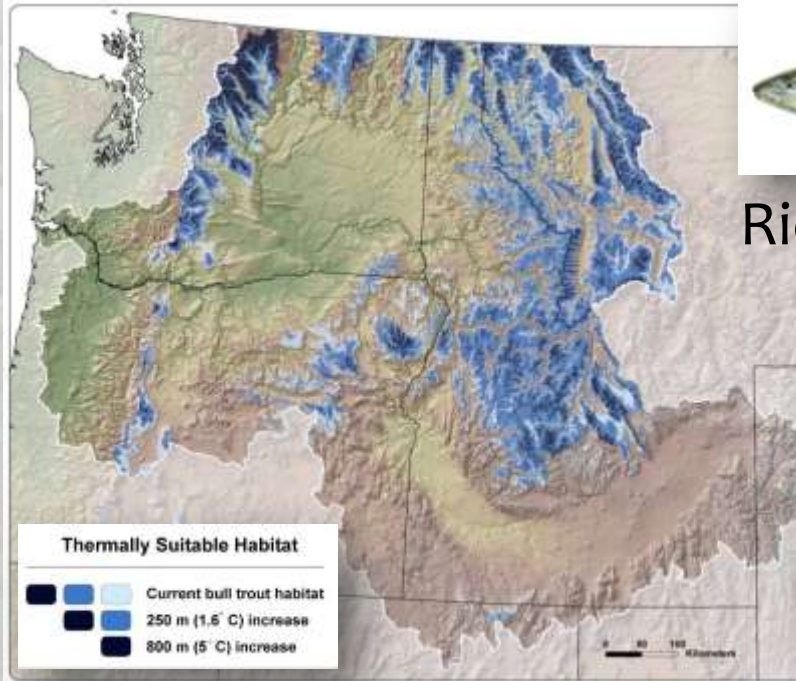


Cross-jurisdictional “maps” of stream climate scenarios

Consistent datum for strategic planning across 500,000 stream kilometers



Improve Resolution of Climate Vulnerability Models



Rieman et al. 2007



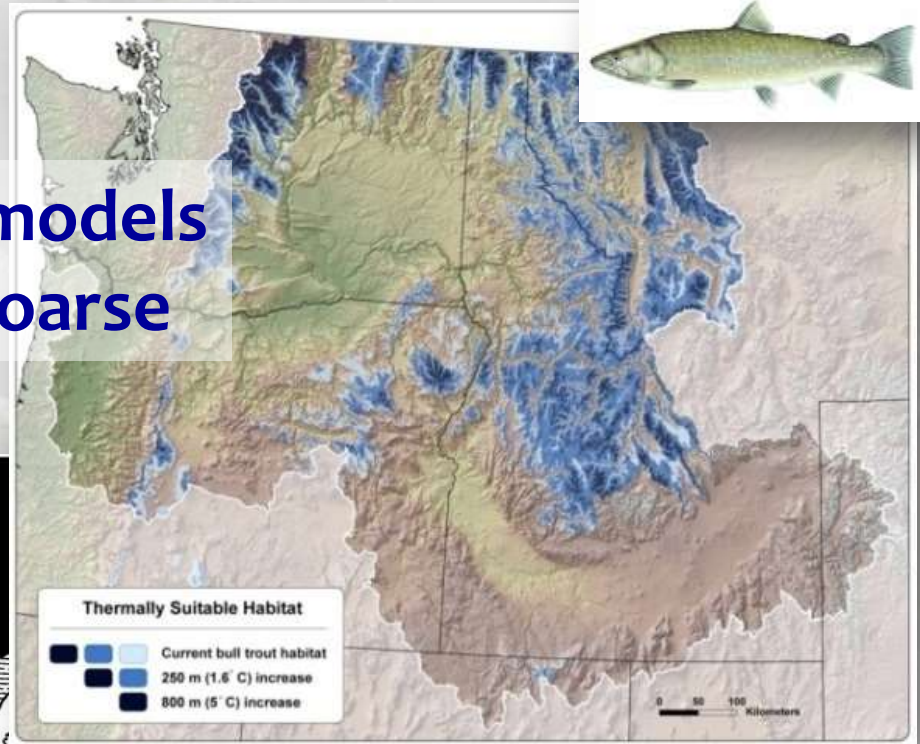
Create “actionable intelligence”



Meisner 1990

Precise Information Needed to Facilitate Strategic Decision Making & Empower Local Decision Makers

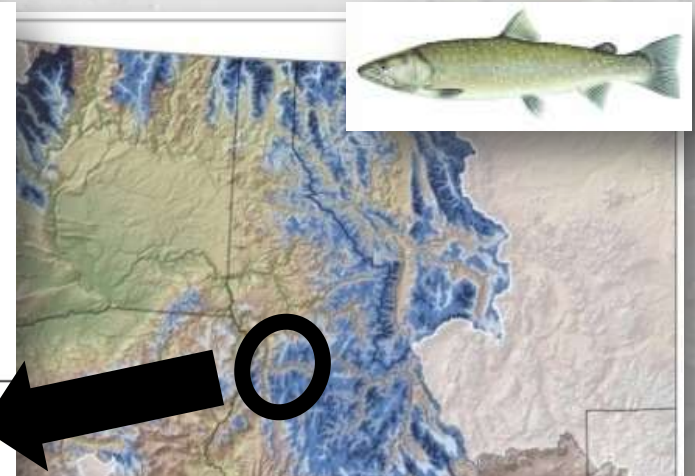
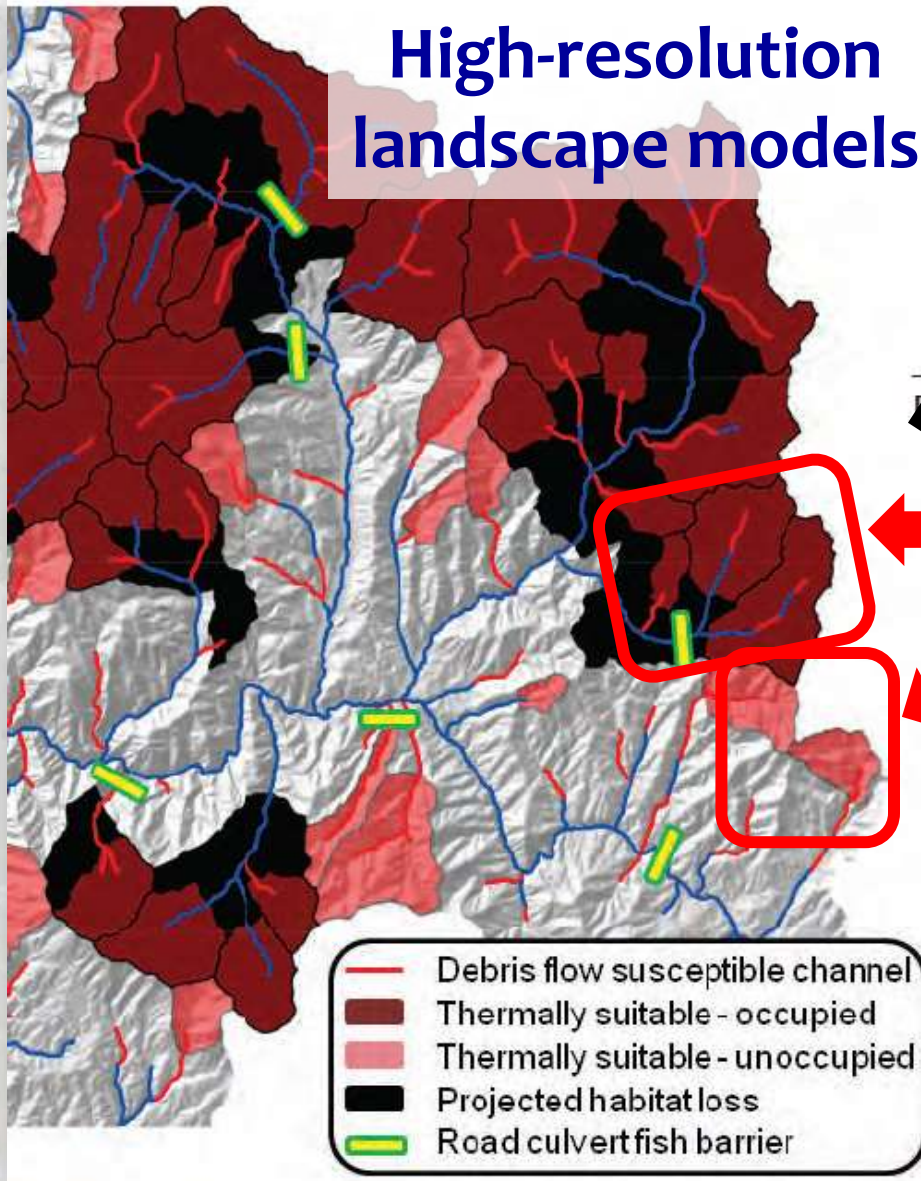
Regional models are too coarse



38°
36°
34°



Precise Information Needed to Facilitate Strategic Decision Making & Empower Local

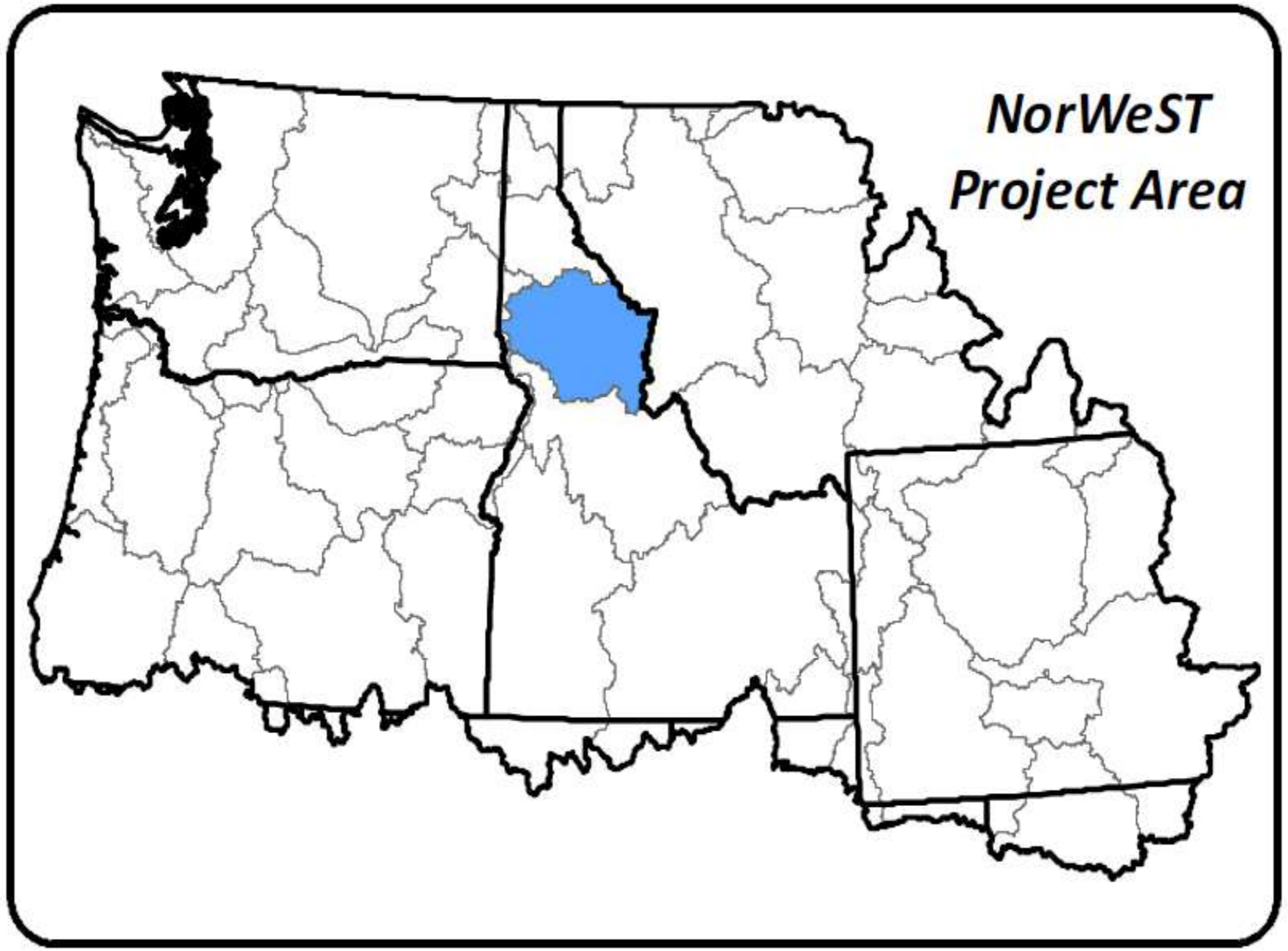


I'm going to invest here...

... instead of here



Example: Clearwater River Basin

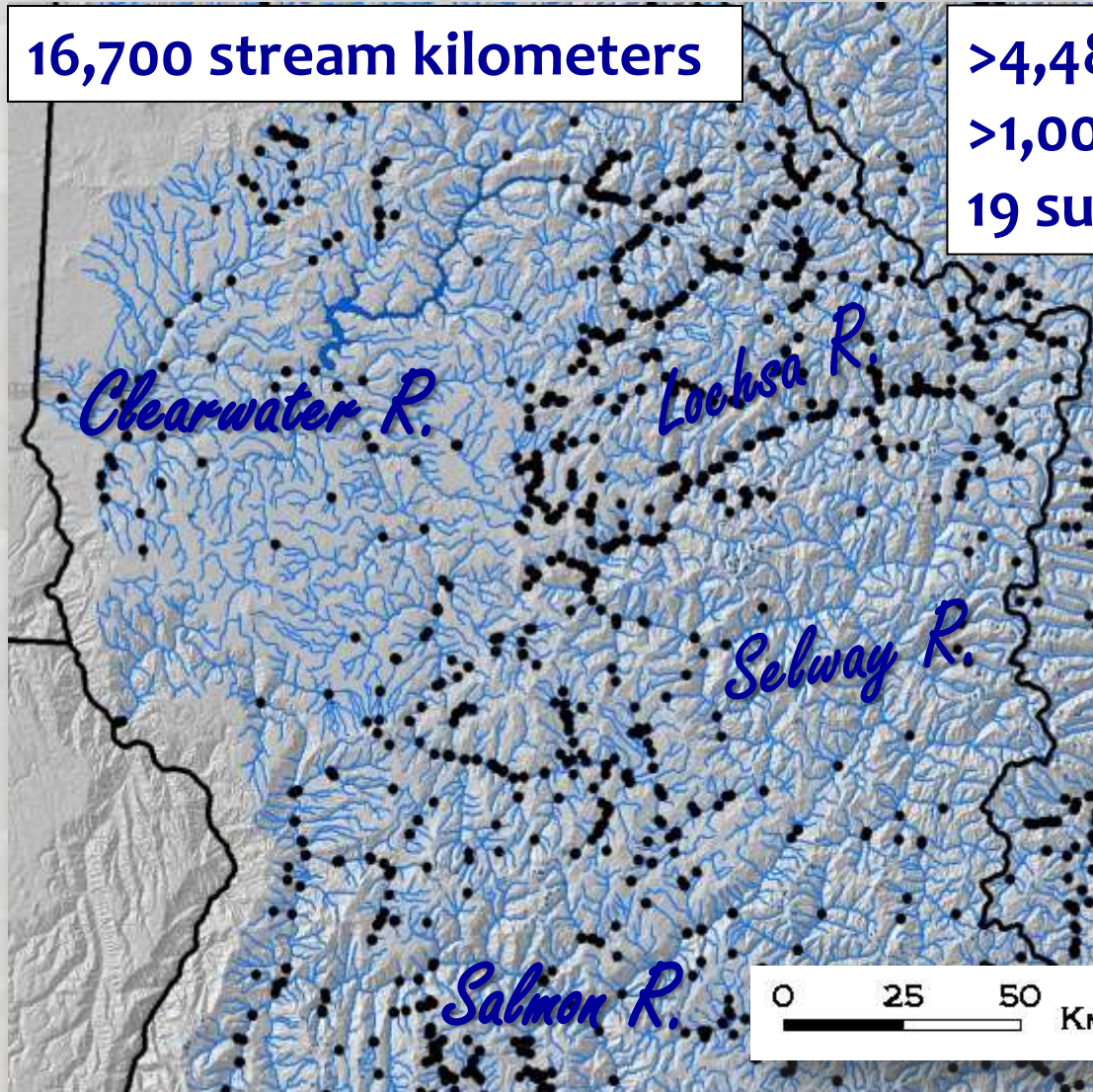


Example: Clearwater River Basin

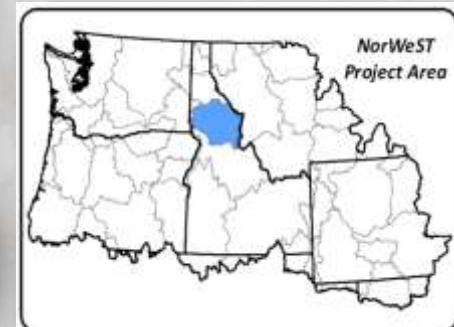
Data extracted from NorWeST

16,700 stream kilometers

>4,487 August means
>1,000 stream sites
19 summers (1993-2011)

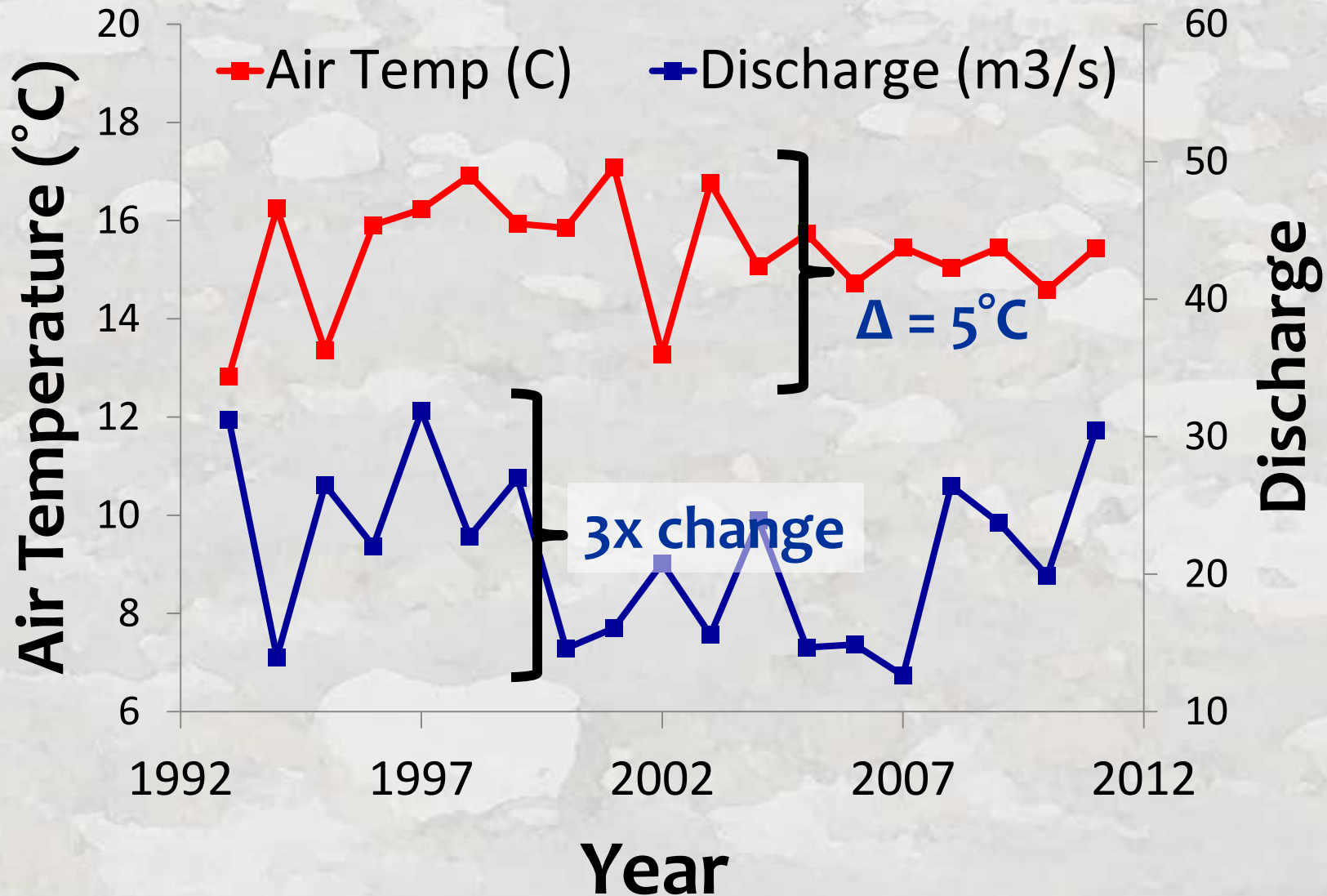


•Temperature site



Climatic Variability in Historical Record

Extreme years include mid-21st-Century “averages”



Clearwater River Temp Model

n = 4,487

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 (km²)

9. Discharge (m³/s)

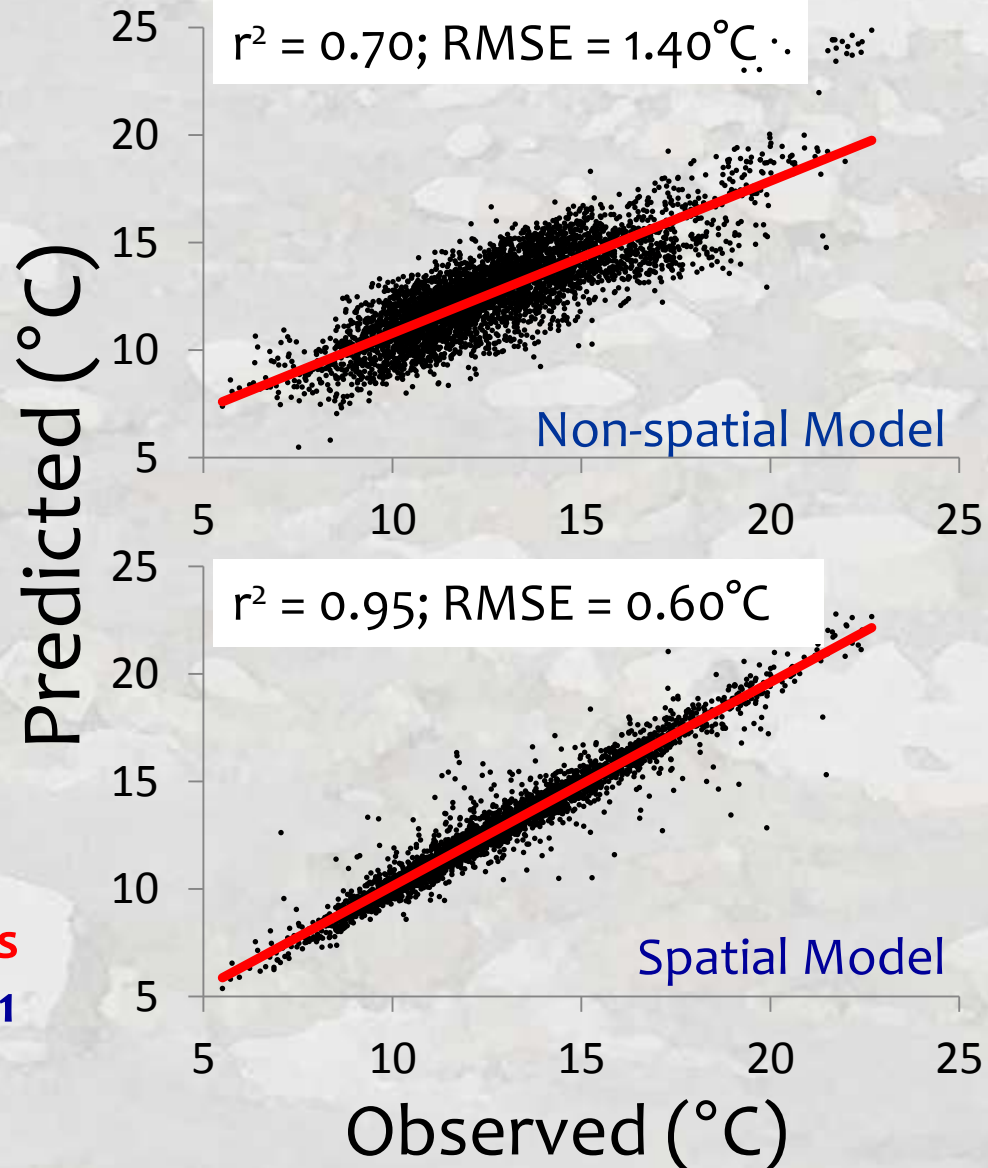
USGS gage data

10. Air Temperature (°C)

RegCM3 NCEP reanalysis

Hostetler et al. 2011

Mean August Temperature



Clearwater River Temp Model

n = 4,487

Covariate Predictors

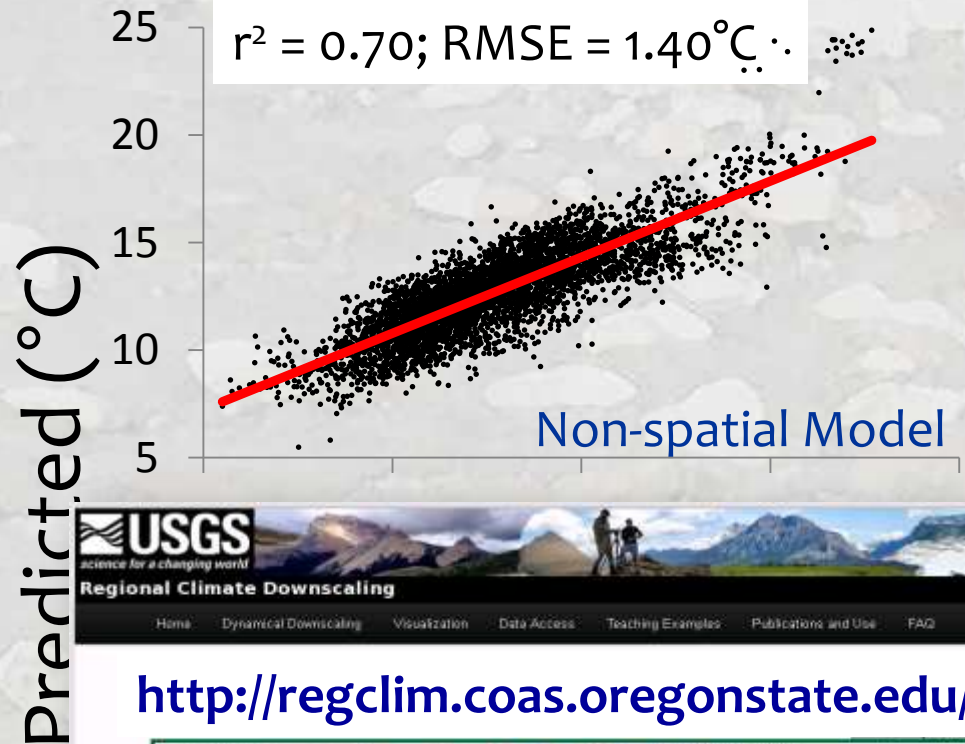
1. Elevation (m)
2. Canopy (%)
3. Stream slope (%)
4. Ave Precipitation (mm)
5. Latitude (km)
6. Lakes upstream (%)
7. Baseflow Index
8. Watershed size (km²)
9. Discharge (m³/s)
10. Air Temperature (°C)

USGS gage data

RegCM3 NCEP reanalysis

Hostetler et al.

Mean August Temperature



Why August Mean Temperature?

- 95% of temperature data are summer only
- All summer metrics are strongly correlated
- Monthly mean is easily linked to regional climate model

MWAT ~ Maximum ~ Minimum

MDAT ~ AWAT ~ Degree-days ~ Mean

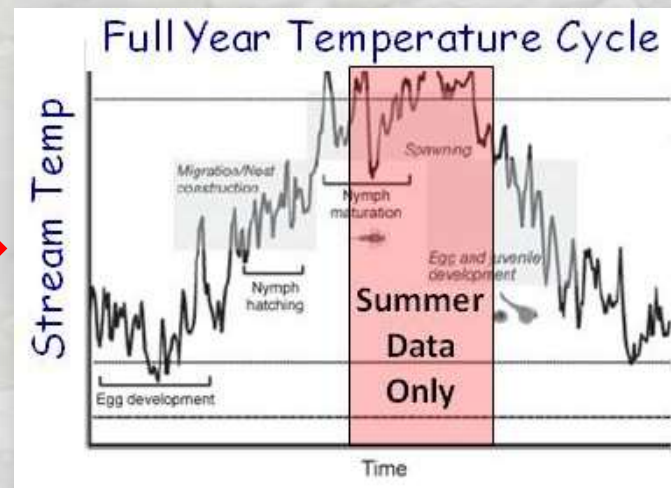
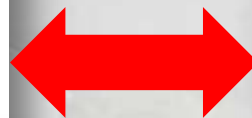
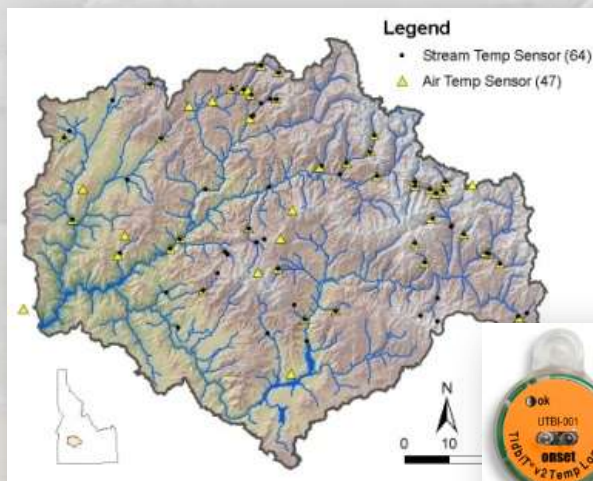
	Summer_mn	Mwmt	Mwat	awat_mn	awmt_mn	August Mean
Summer_mn						
Mwmt	0.93					
Mwat	0.98	0.94				
awat_mn	1.00	0.93	0.97			
awmt_mn	0.96	0.98	0.94	0.96		
August Mean	0.99	0.92	0.96	0.99	0.95	
August MWMT	0.92	0.99	0.92	0.92	0.98	0.92

*Modeling each additional metric doubles computational time

*Conversion factors can facilitate metric translation

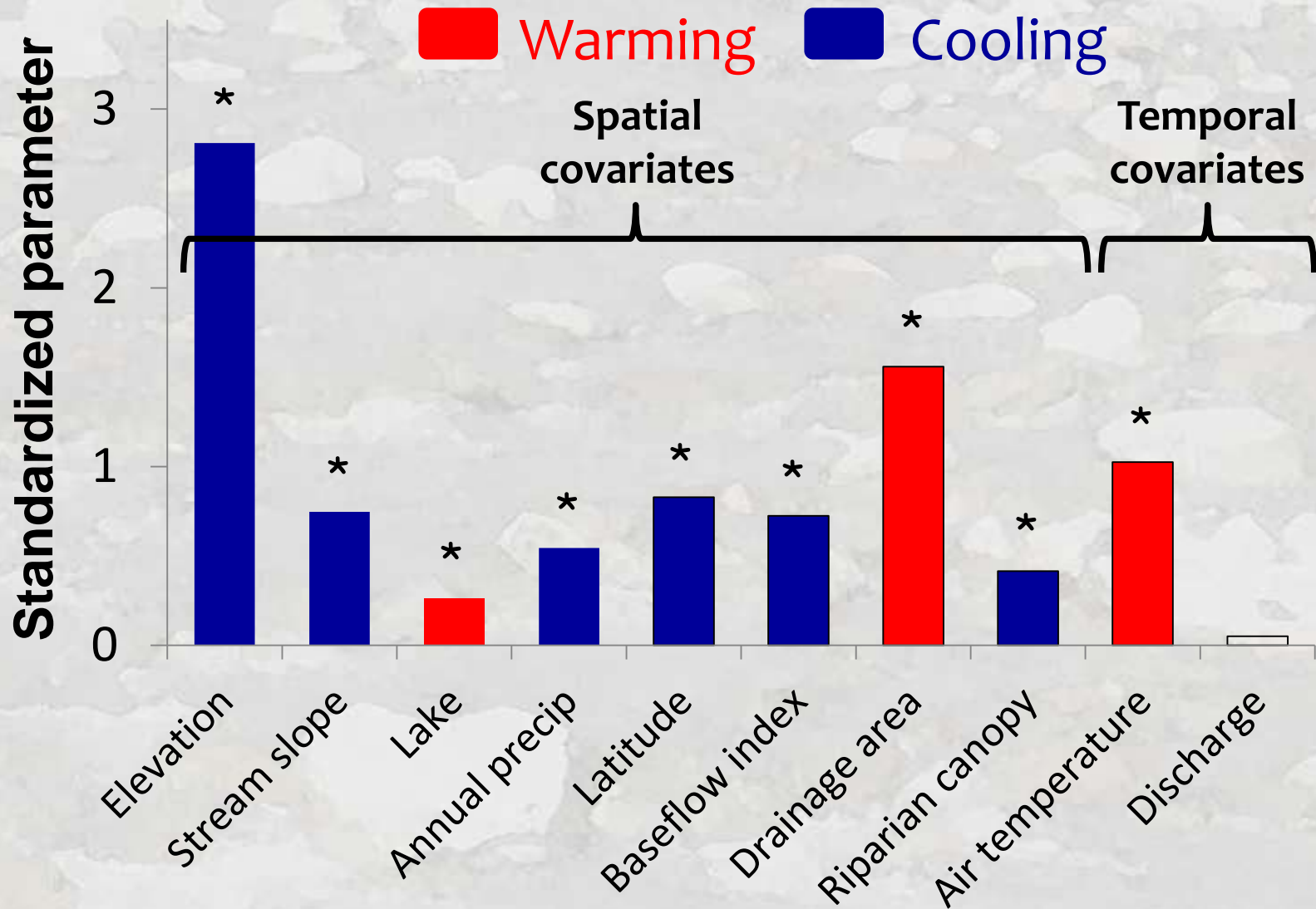
Summer Temperatures ~ Other Seasons

	Fall mean	Fall SD	Winter Mean	Winter SD	Spring mean	Spring SD	Summer Mean
Fall SD	0.87	---					
Winter Mean	0.50	0.02	---				
Winter SD	0.70	0.35	0.83	---			
Spring mean	0.95	0.76	0.51	0.78	---		
Spring SD	0.69	0.77	-0.05	0.29	0.74	---	
Summer Mean	0.91	0.92	0.23	0.45	0.88	0.87	---
Summer SD	0.62	0.77	-0.02	0.15	0.48	0.49	0.65



Relative Effects of Predictors

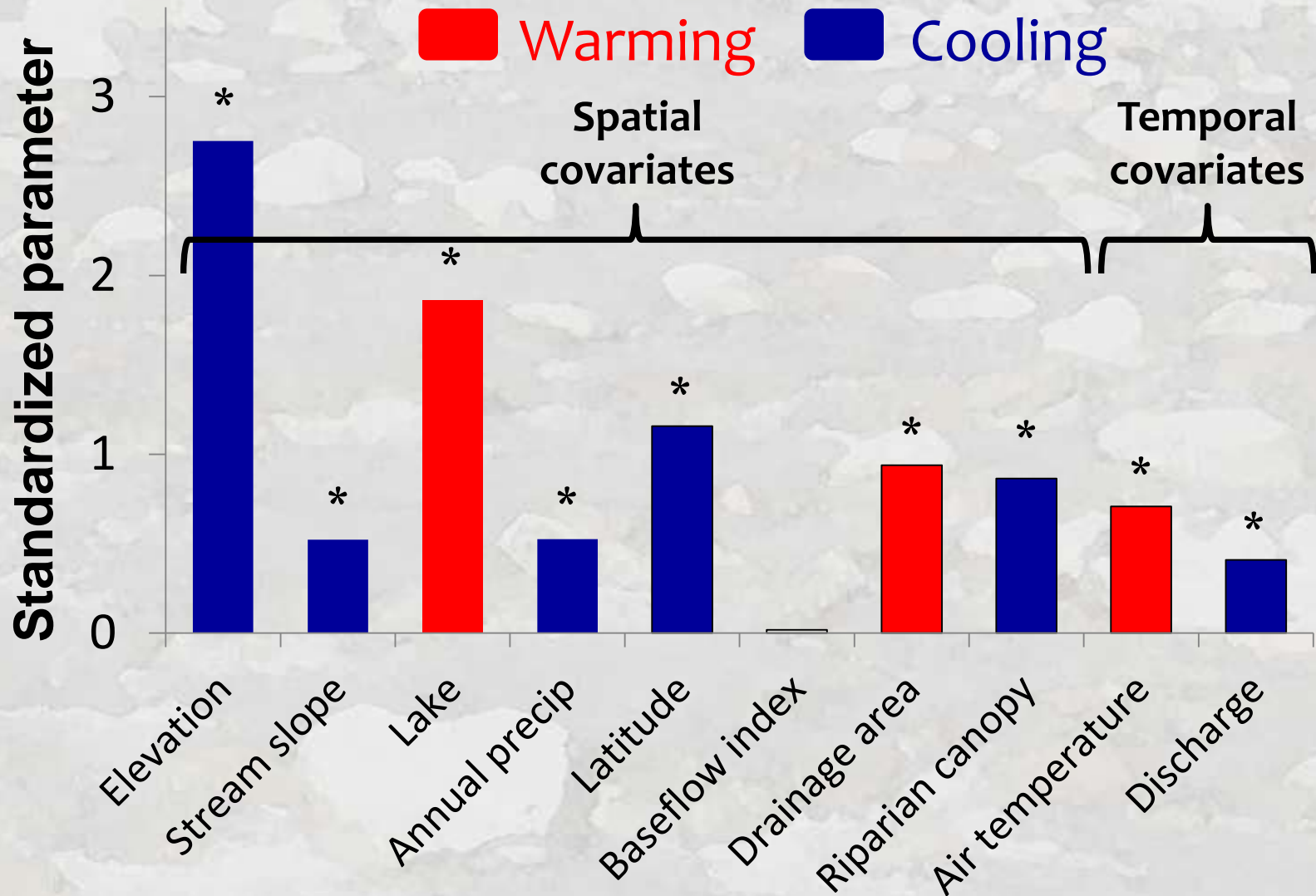
Clearwater Temperature Model



* = statistically significant at $p < 0.01$

Relative Effects of Predictors

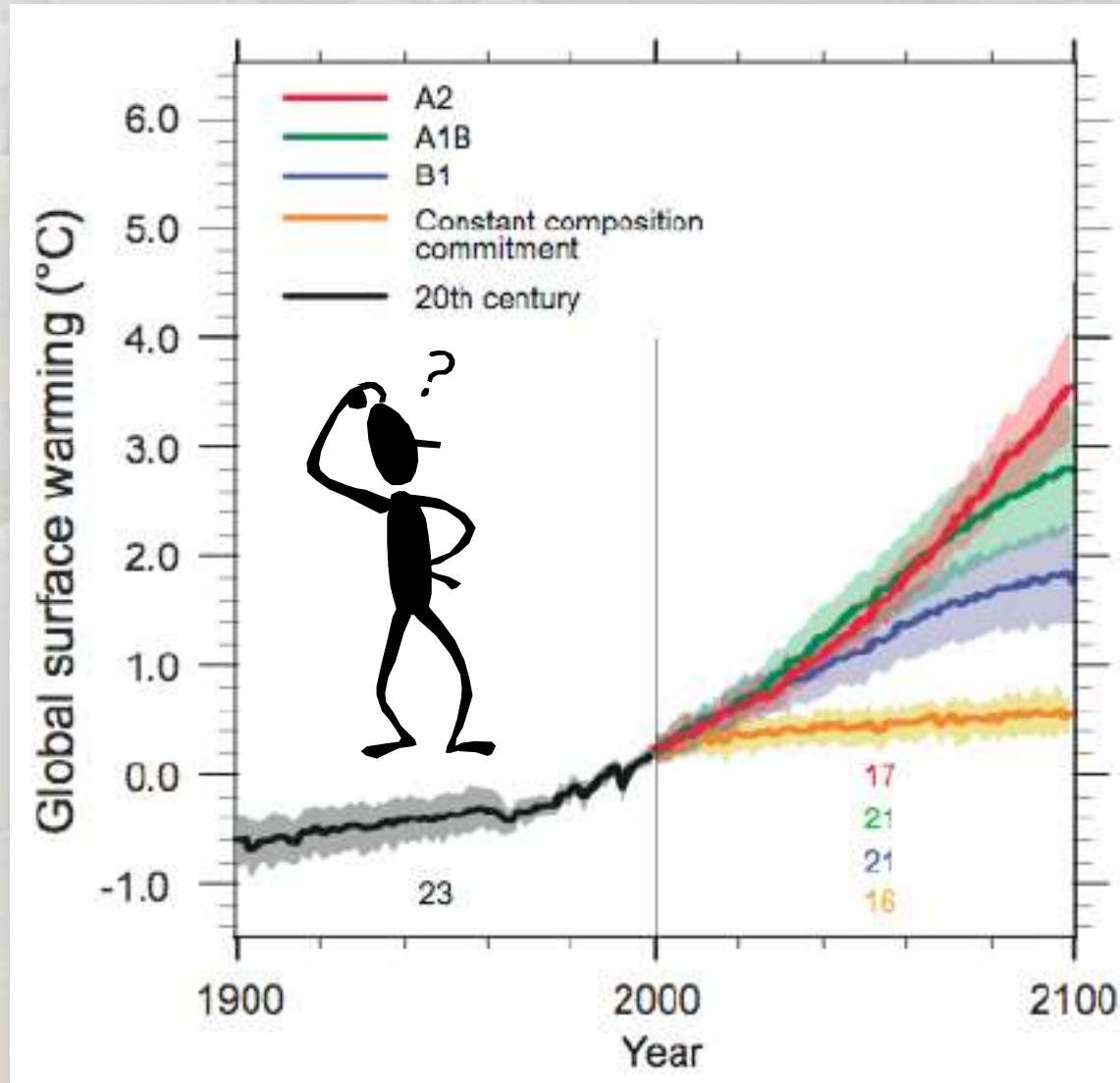
SpoKoot Temperature Model



* = statistically significant at $p < 0.01$

Models Enable Climate Scenario Maps

Many possibilities exist...



Adjust...

- Air
- Discharge
- %Canopy

... values to
create scenarios

NorWeST Scenario Descriptions

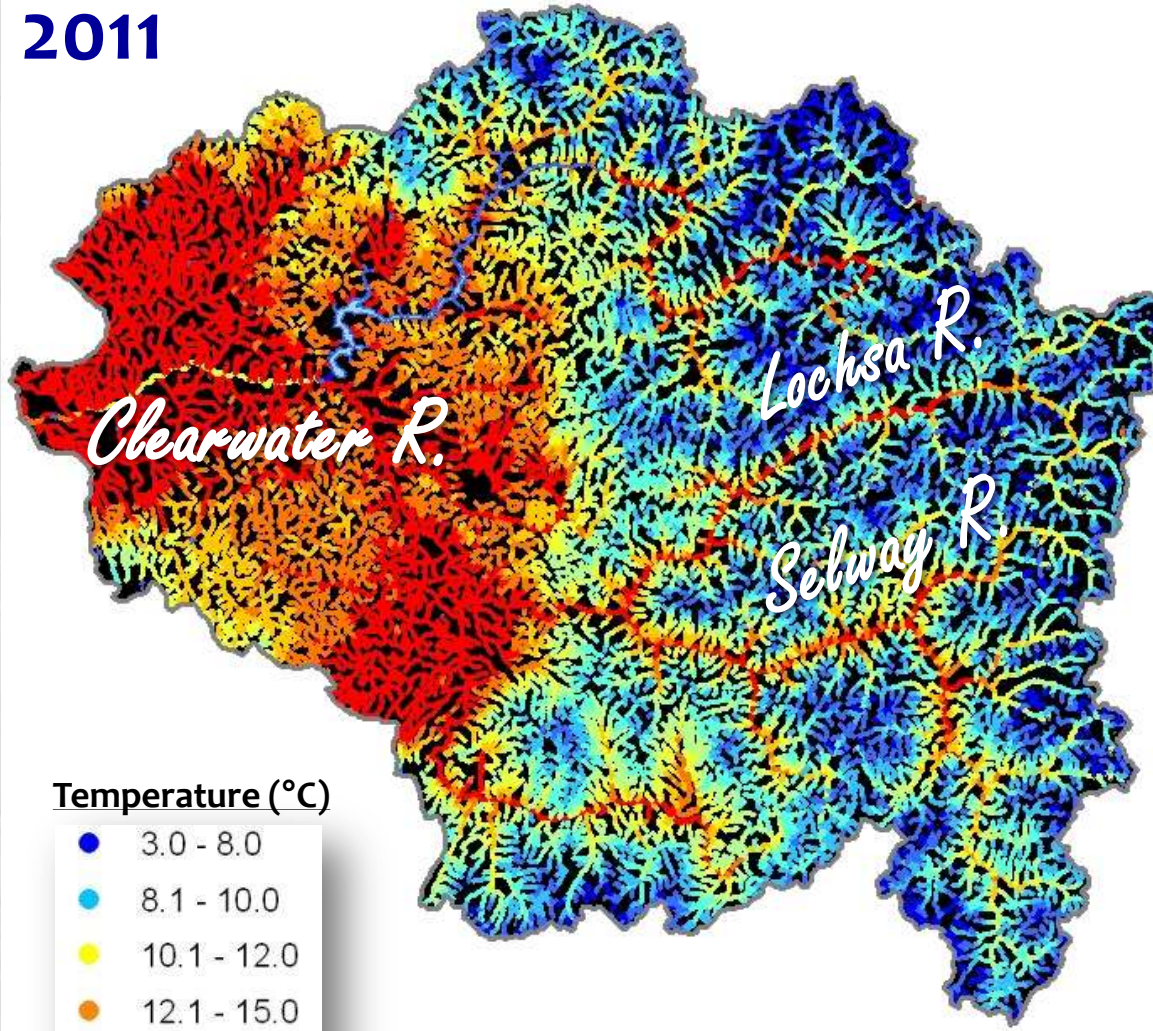
Scenario	Description
S1_93_11	Historical scenario representing 19 year average August mean stream temperatures for 1993-2011
S2_02_11	Historical scenario representing 10 year average August mean stream temperatures for 2002-2011
S3_1993	Historical scenario representing August mean stream temperatures for 1993
S4_1994	Historical scenario representing August mean stream temperatures for 1994
Etc...	
S22+...	Futures: 1) A1B scenarios for 2040s and 2080s; 2) “scenario free (e.g., +1°C, +2C, etc.)



Historical Scenarios (1993-2011)

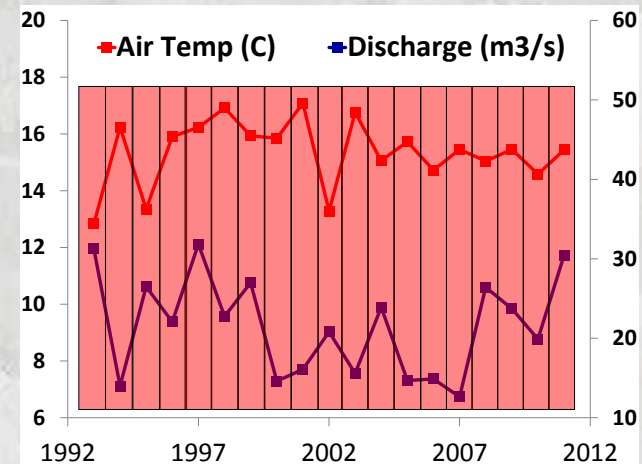
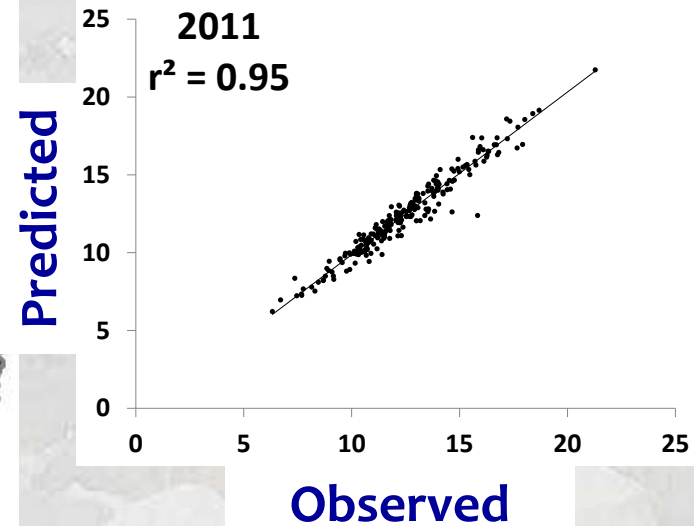
Mean August Temperature - Clearwater Basin

2011



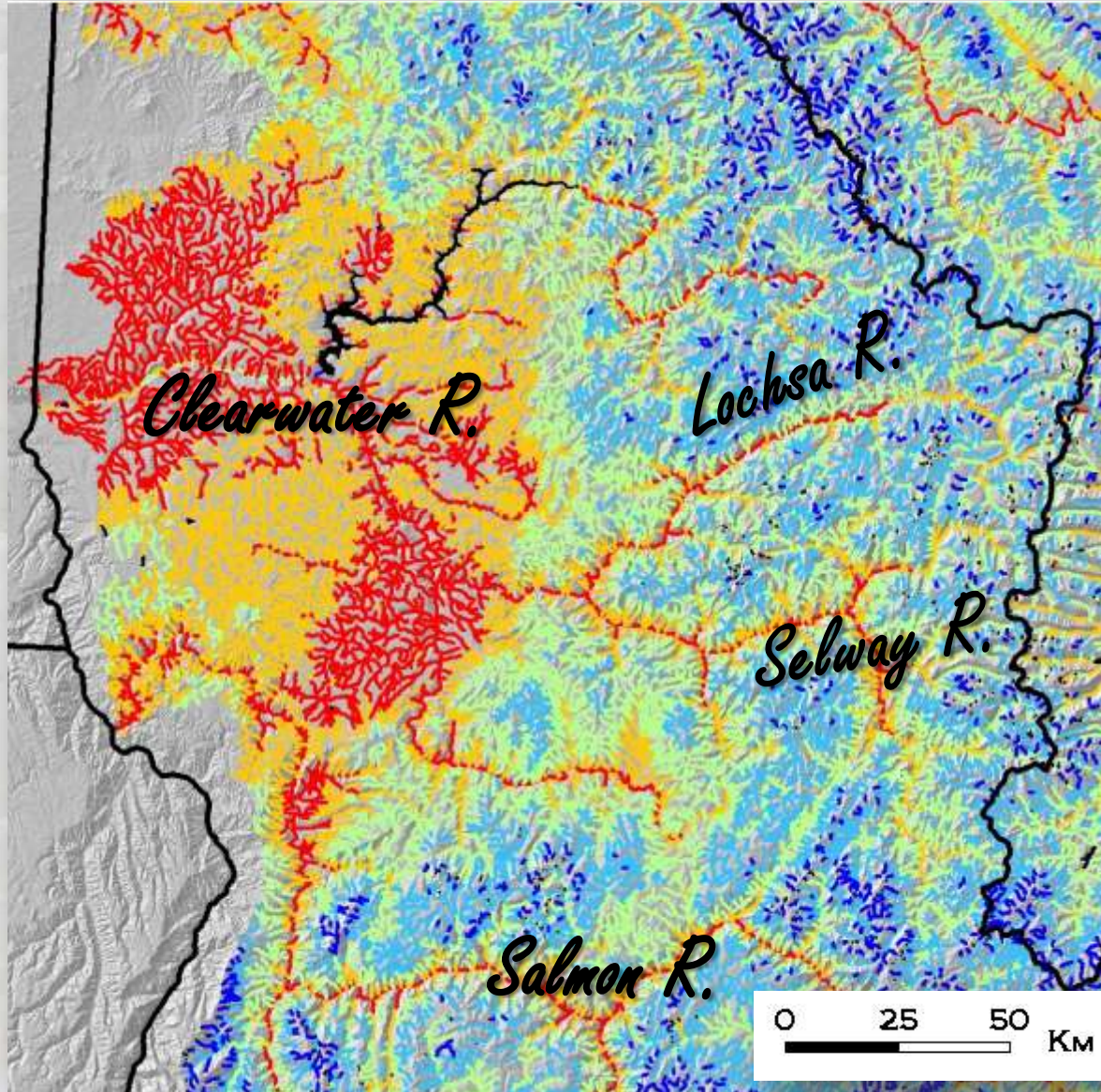
Temperature (°C)

- 3.0 - 8.0
- 8.1 - 10.0
- 10.1 - 12.0
- 12.1 - 15.0
- 15.1 - 27.0

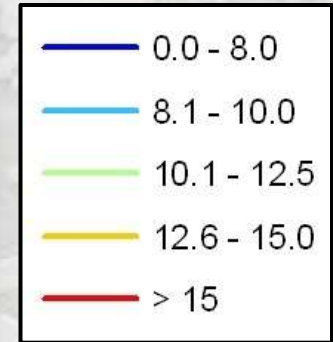


Clearwater Stream Temperature Scenario

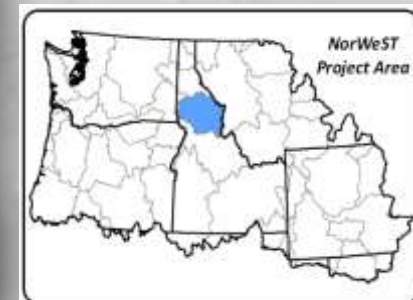
Historic (1993-2011 Average August)



Temperature (°C)

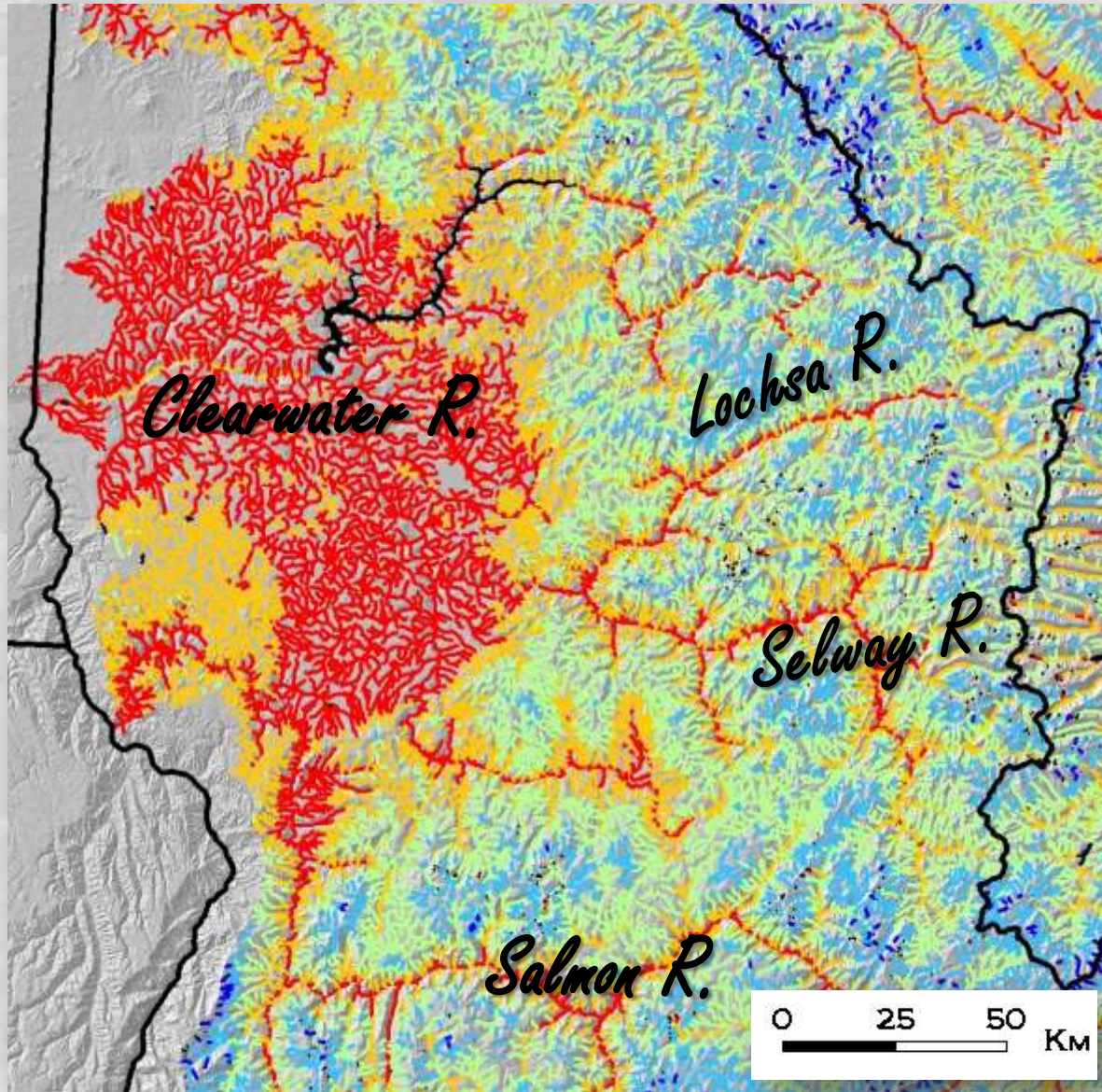


**1 kilometer
resolution**

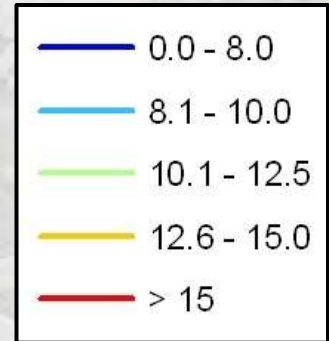


Clearwater Stream Temperature Scenario

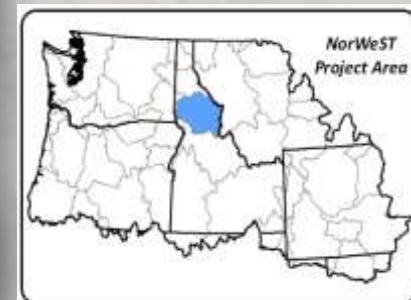
+1.50°C Stream Temp (A1B, 2040s)



Temperature (°C)

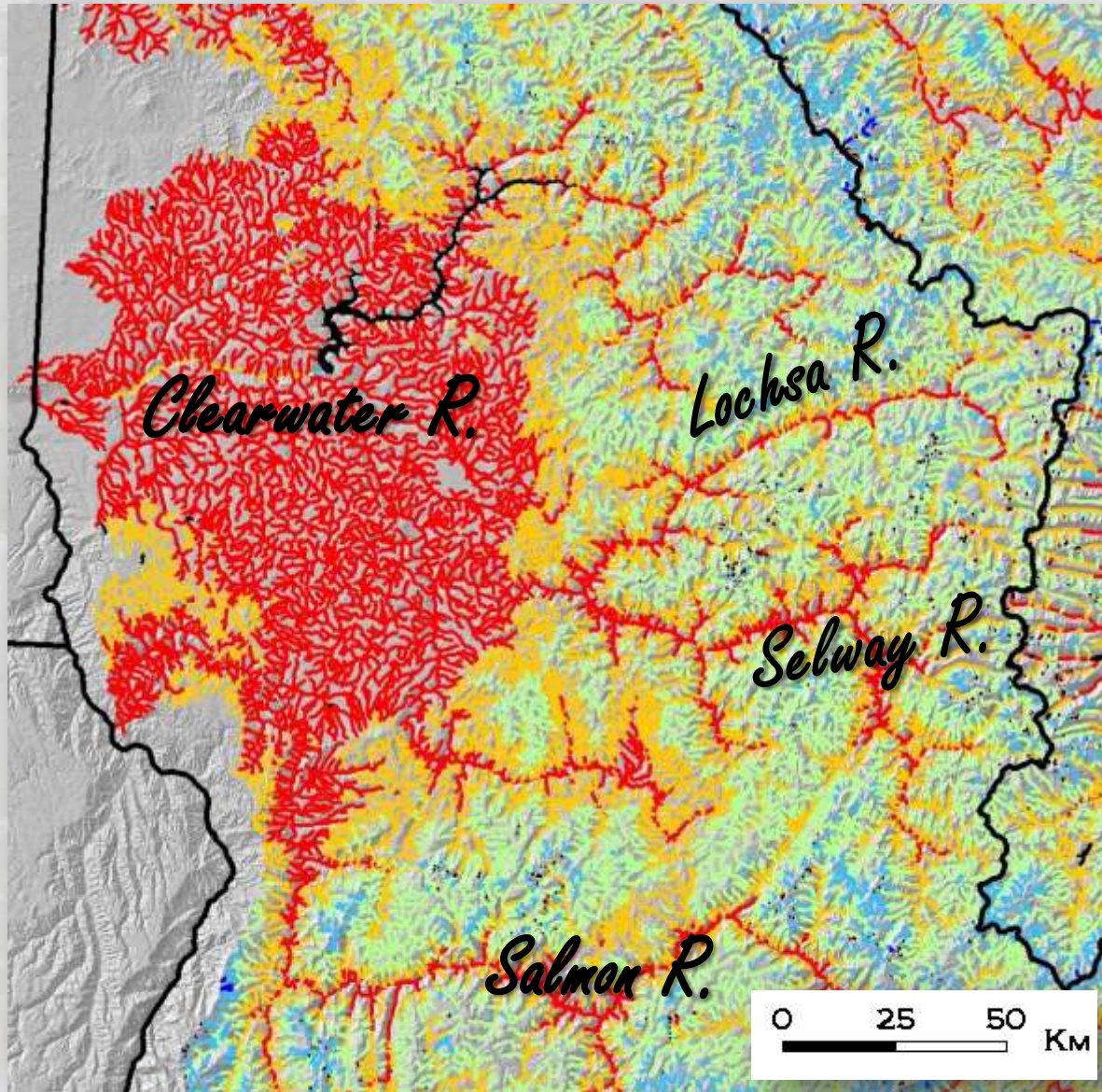


1 kilometer
resolution

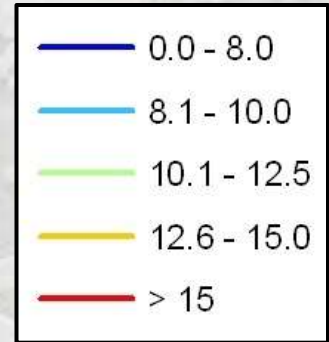


Clearwater Stream Temperature Scenario

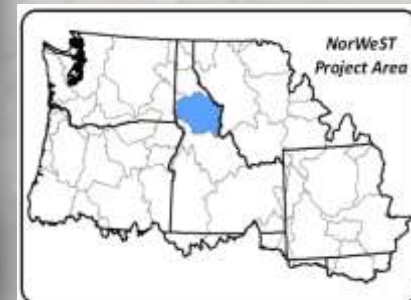
+3.00°C Stream Temp (A1B, 2080s)



Temperature (°C)

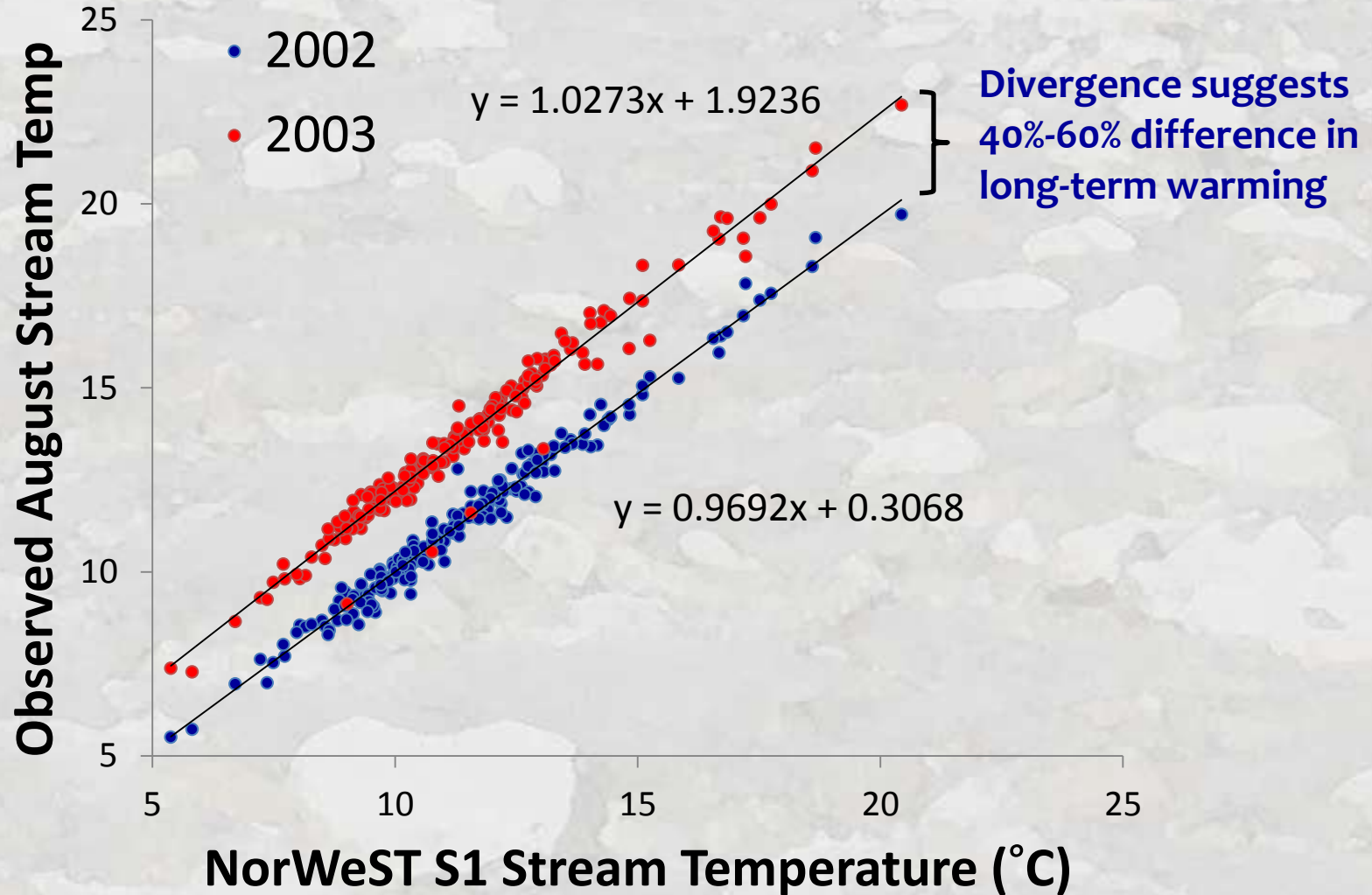


1 kilometer
resolution

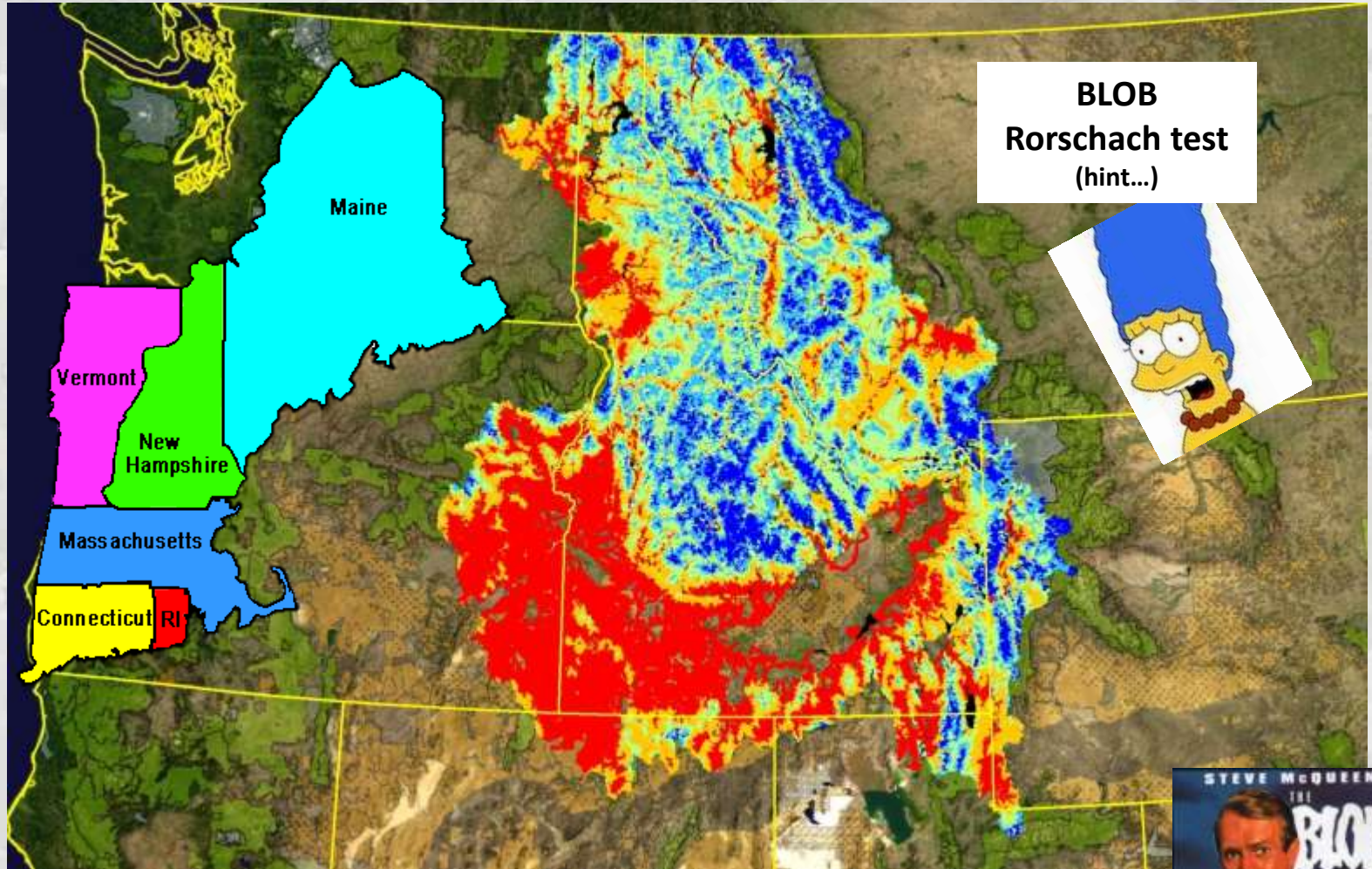


Future Scenarios Include Intrabasin Differential Sensitivity

Warm streams warm more than cold streams



Stream Thermalscape so Far...

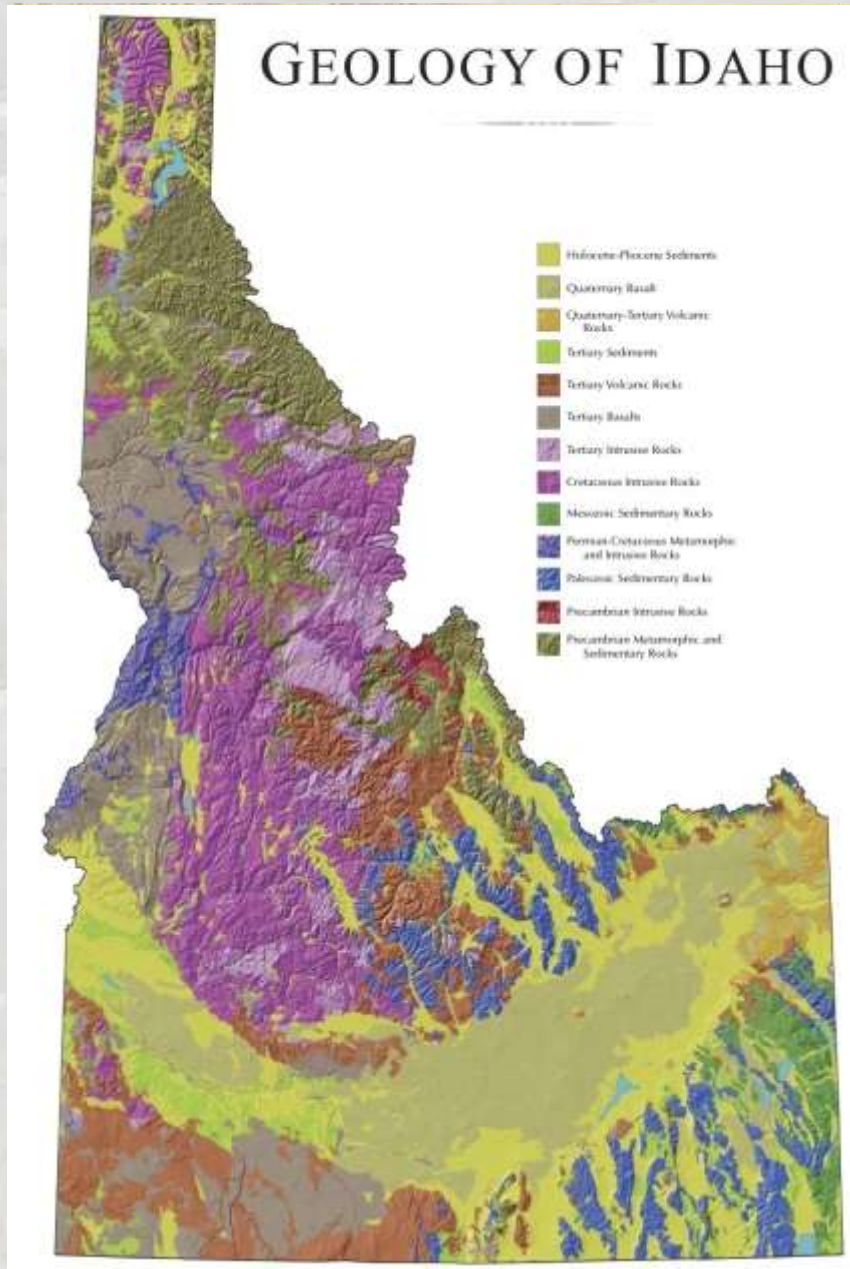


The BLOB... it just keeps growing...

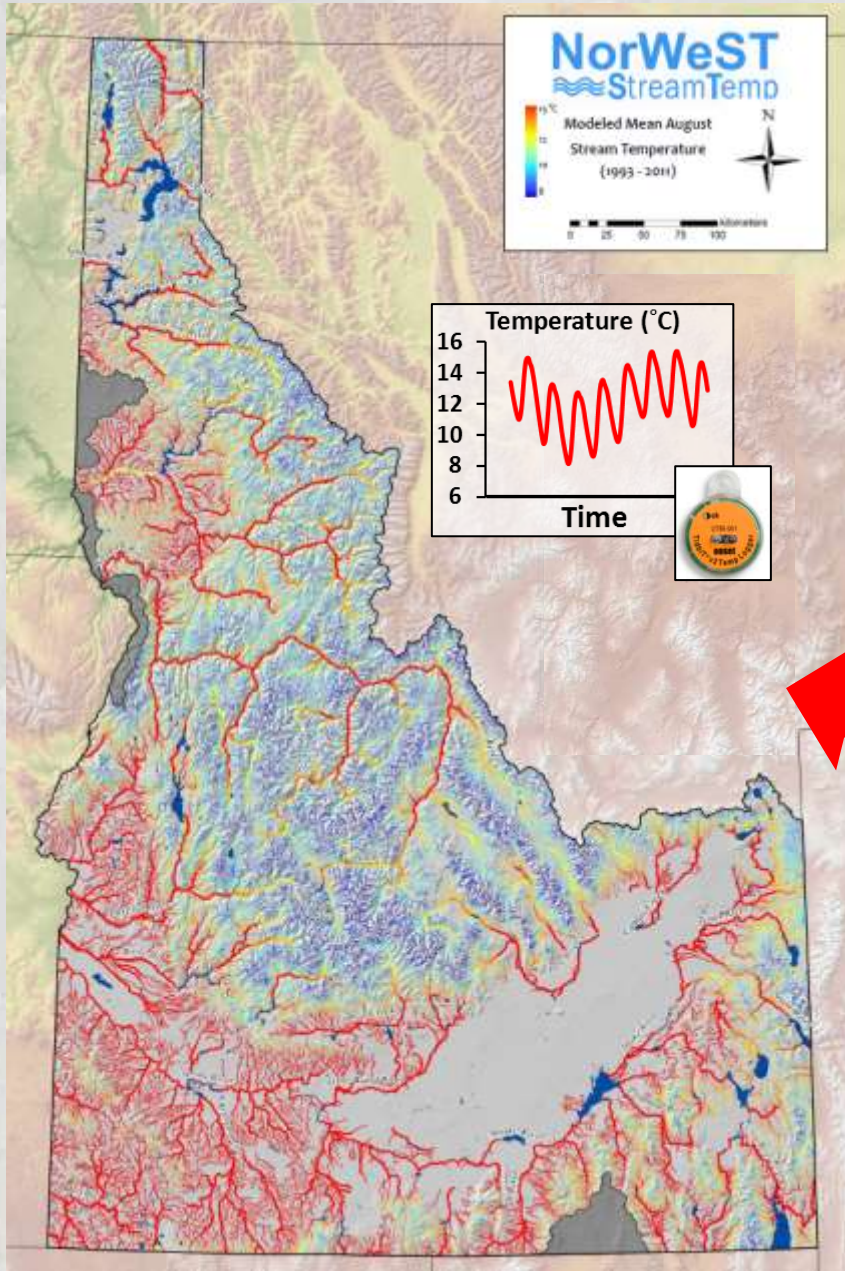
- 234,000 stream kilometers of thermal ooze
- 20,072 summers of data swallowed



We have State Geologic Maps...



Why not Stream Thermalscape Maps?

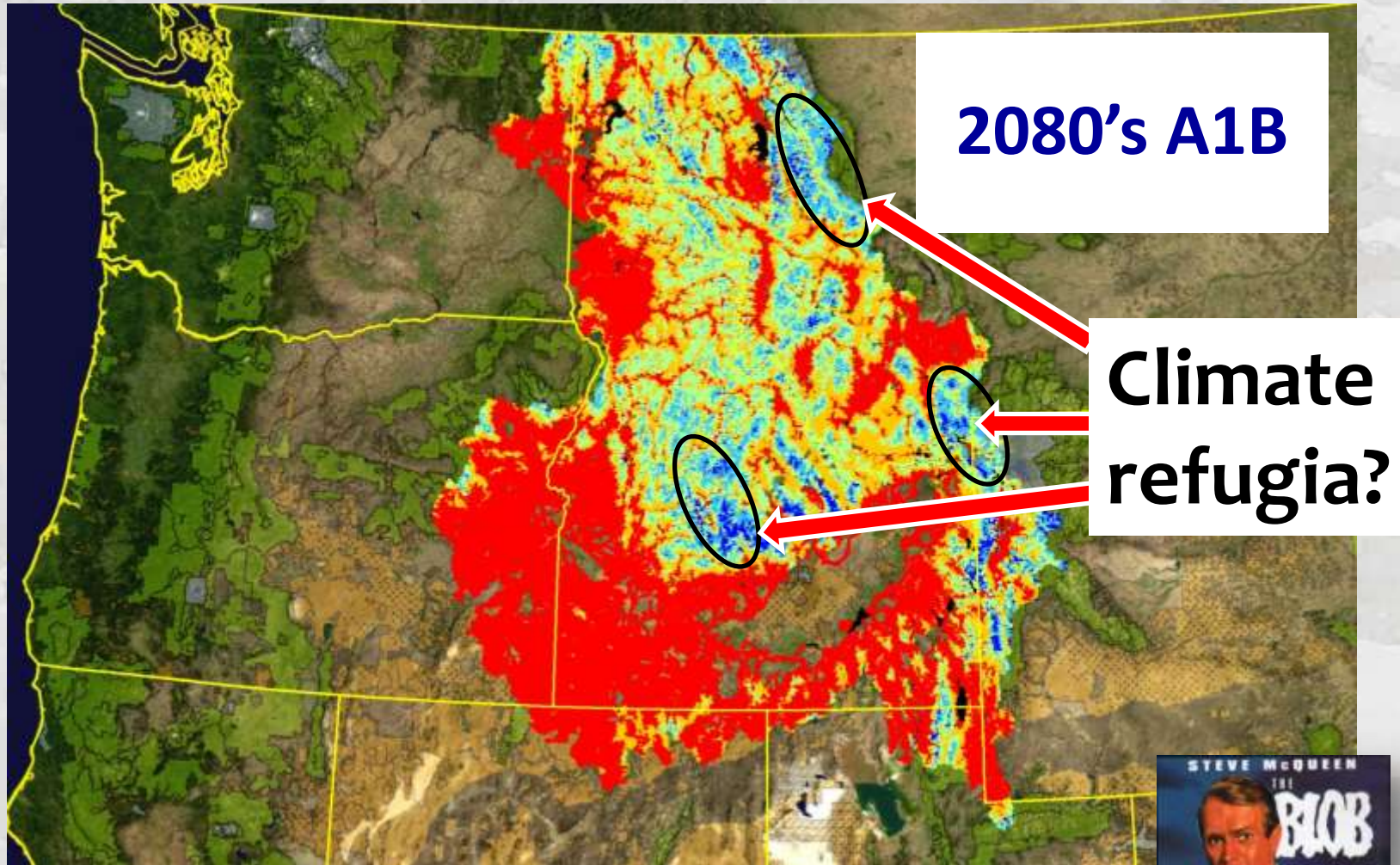


Built From...

- 4,888 stream sites
- 12,755 summers of data
- Dozens of contributing individuals
- all agencies



BLOB Space, but BLOB time too...



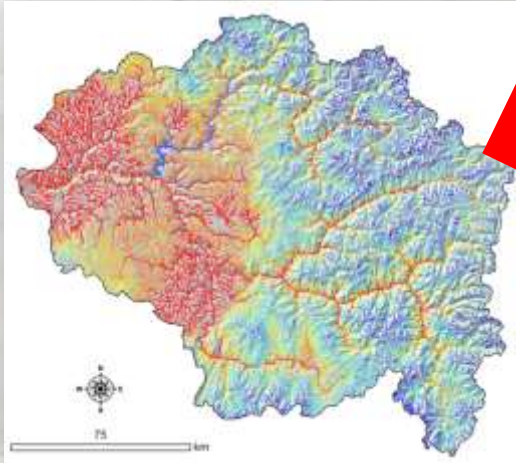
The BLOB... it just keeps growing...

- 234,000 stream kilometers of thermal ooze
- 20,072 summers of data swallowed

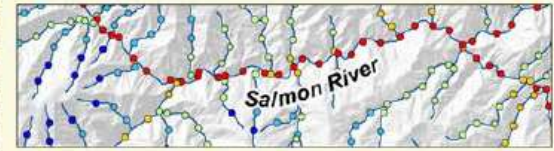


Website Distributes BLOB Scenarios & Temperature Data as GIS Layers

1) GIS shapefiles of stream temperature scenarios

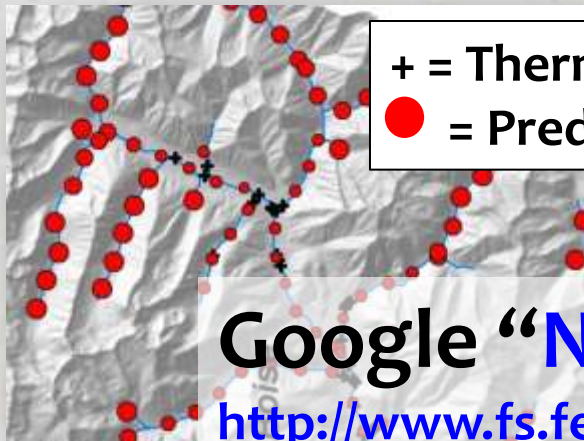


NorWeST
Stream Temp



Regional Database and Modeled Stream Temperatures

2) GIS shapefiles of stream temperature model prediction precision



+ = Thermograph
● = Prediction SE

3) Temperature data summaries

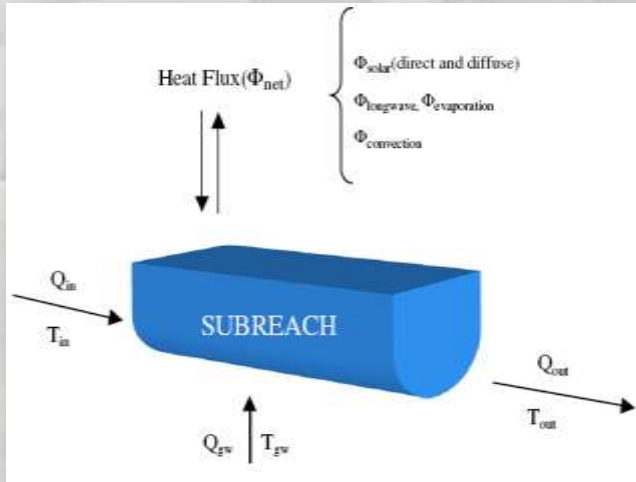


Google **NorWeST** or go here...

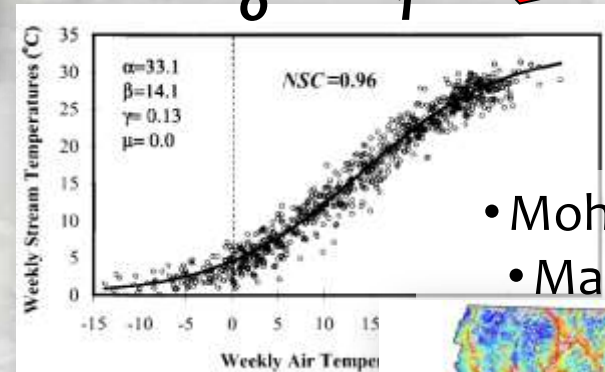
<http://www.fs.fed.us/rm/boise/AWAE/projects/NorWeST.shtml>

Empirical Data feeds All Models...

Mechanistic & Statistical



$$Y = b_0 + b_1 X$$



Site

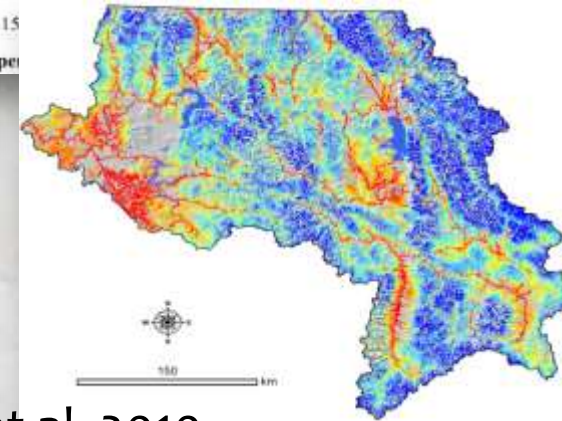
- Mohseni et al. 1998
- Mantua et al. 2010

For example...

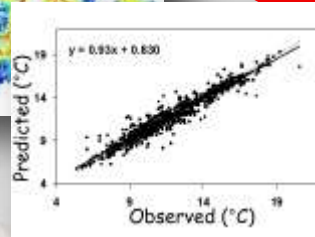
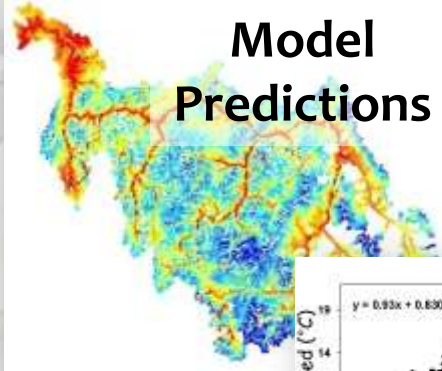
- QUAL2Kw
- SSTEMP/SNTEMP
- BasinTemp
- Heat Source
- WET-Temp

Network

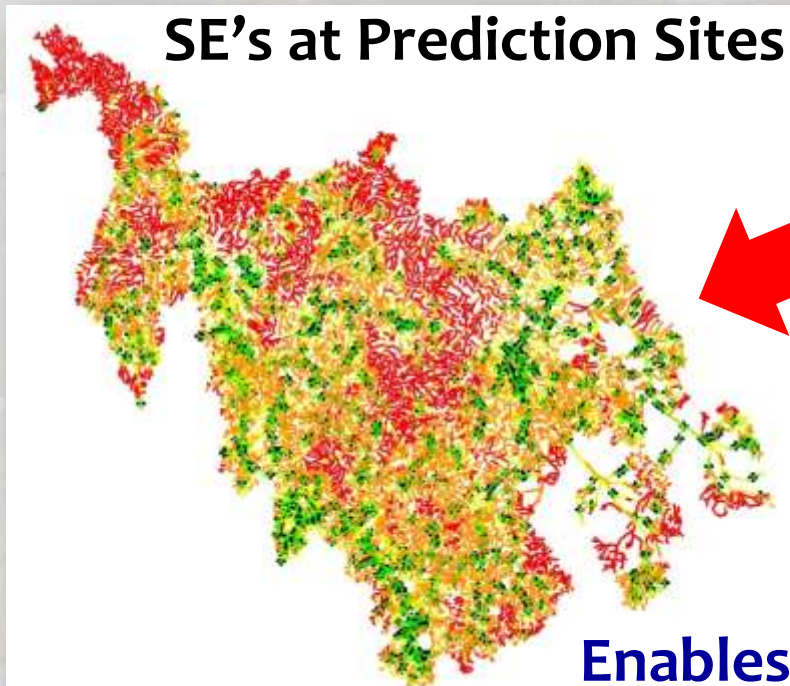
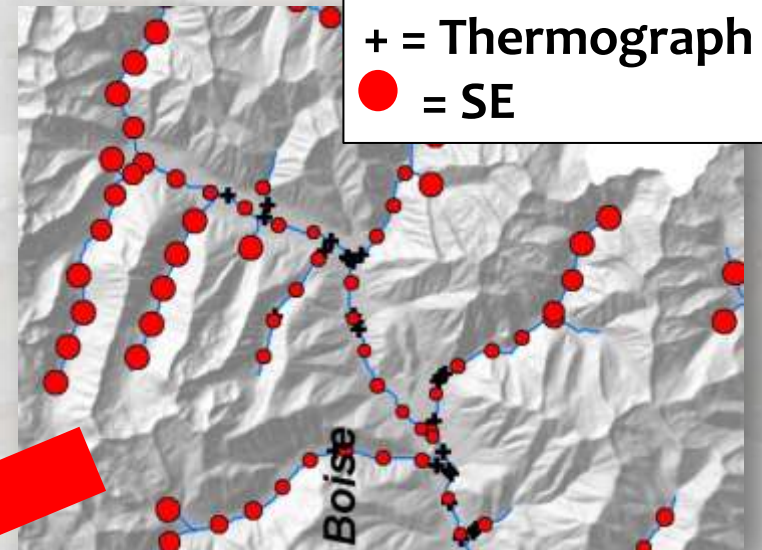
Isaak et al. 2010



S34_PredSE = Spatially Explicit Maps of Model Prediction Uncertainty



Temperature Prediction SE's



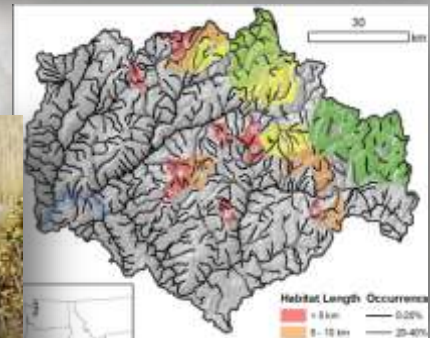
SE's are small near sites with temperature measurements

Enables efficient monitoring designs



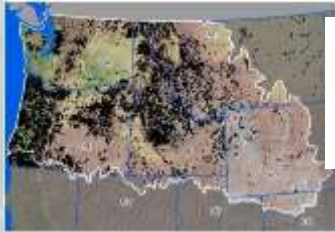
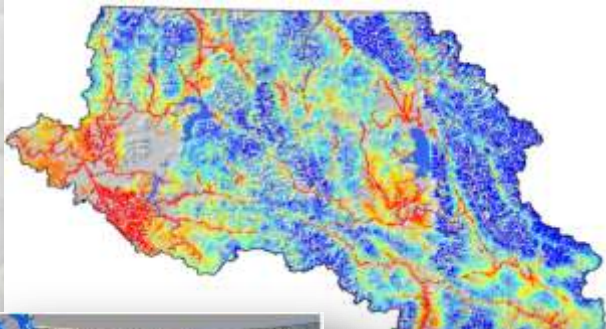
Good Stream Temperature Information Creates Many Synergies...

- Efficient temperature monitoring
- Better understand thermal ecology of aquatic species
- Precise bioclimatic models & vulnerability assessments
- Consistent application of climate decision support tools
- Regionally consistent thermal criteria using BIG FISH data



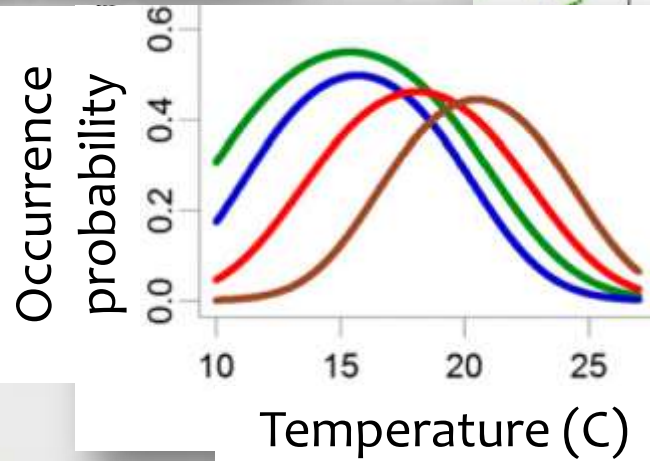
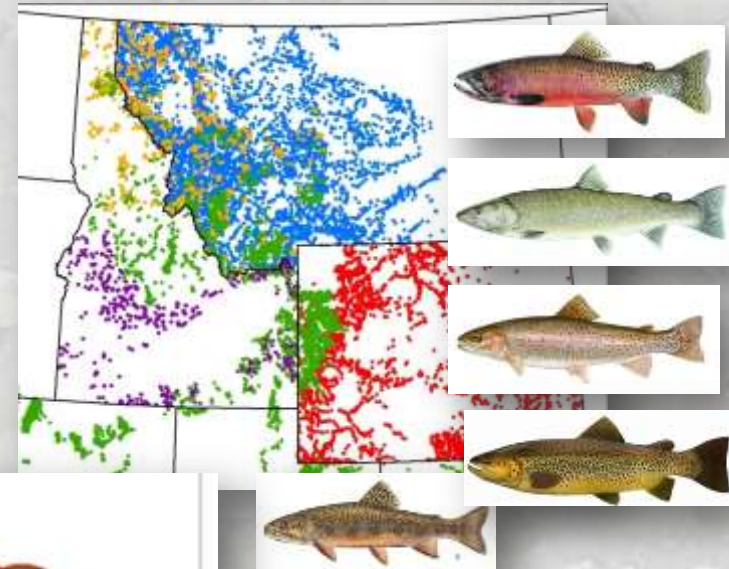
Regionally Consistent Thermal Criteria

Stream temperature maps



NorWeST
Stream Temp

Regional fish survey
databases (n ~ 20,000)

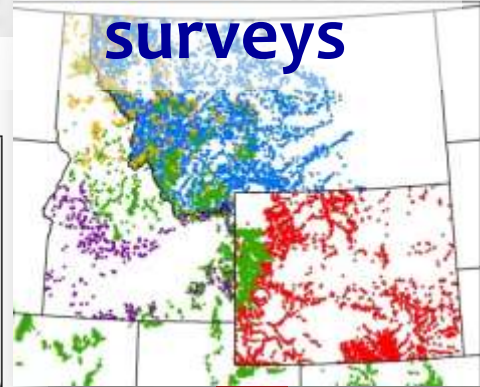


Wenger et al. 2011a. *PNAS* **108**:14175-14180

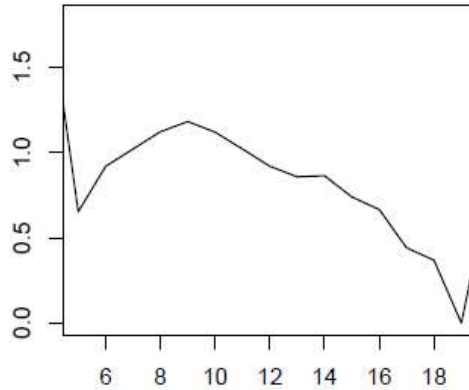
Wenger et al. 2011b. *CJFAS* **68**:988-1008; Wenger et al., *In Preparation*

Trout...

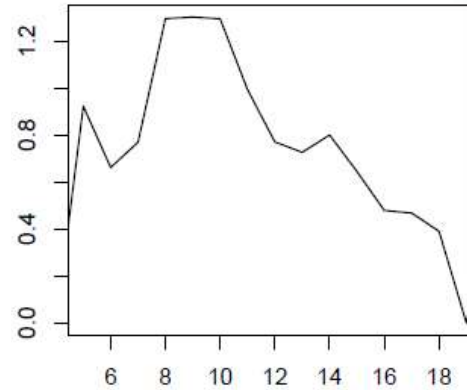
~20,000 fish surveys



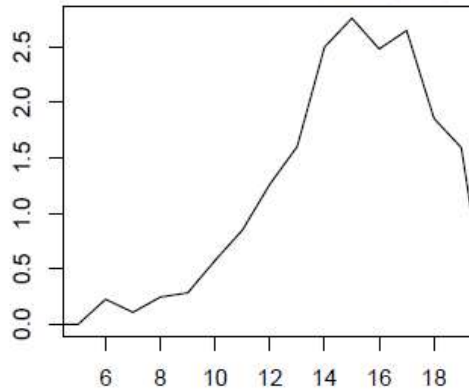
Cutthroat 



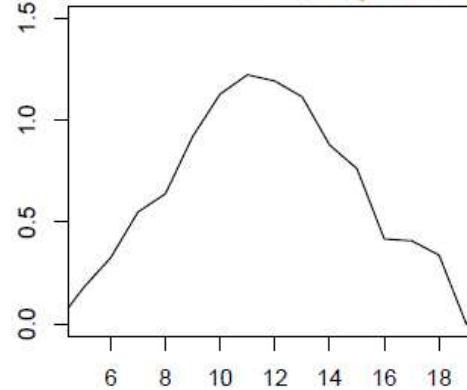
Bull 



Rainbow 



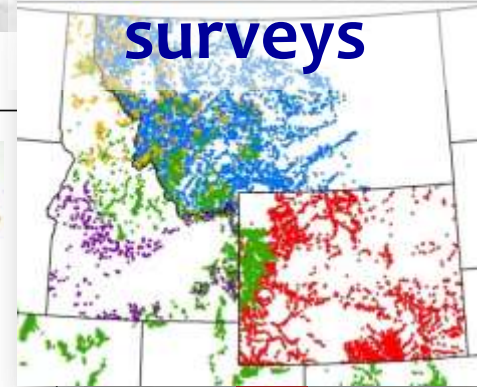
Brook 



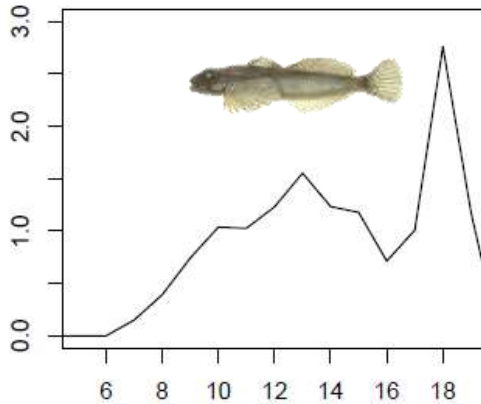
NorWeST Stream Temperature (S1)

Other Critters...

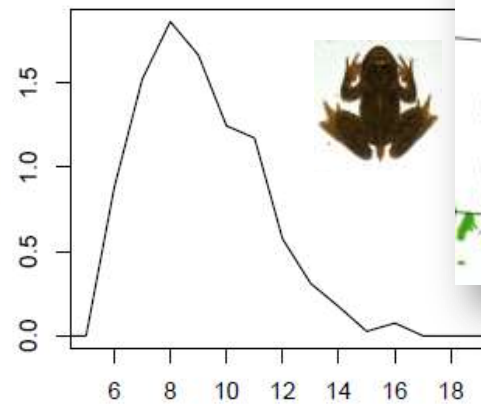
~20,000 fish surveys



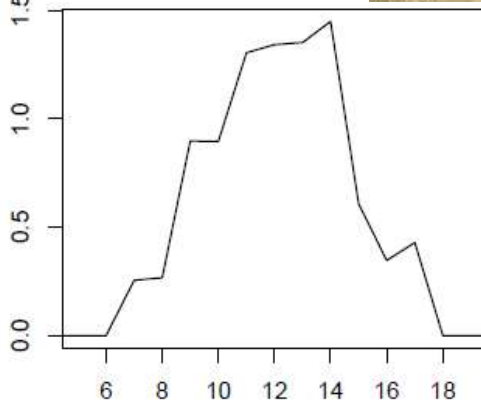
Sculpin spp.



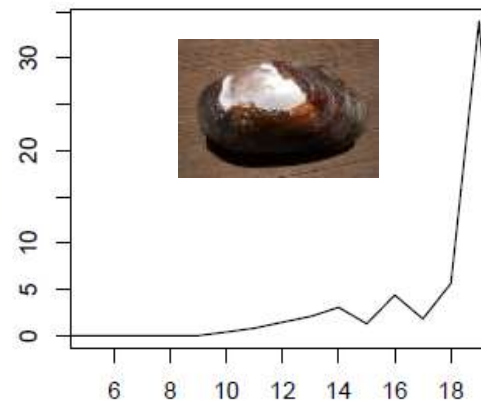
Tailed frog



Spotted frog



Pearlshell mussell

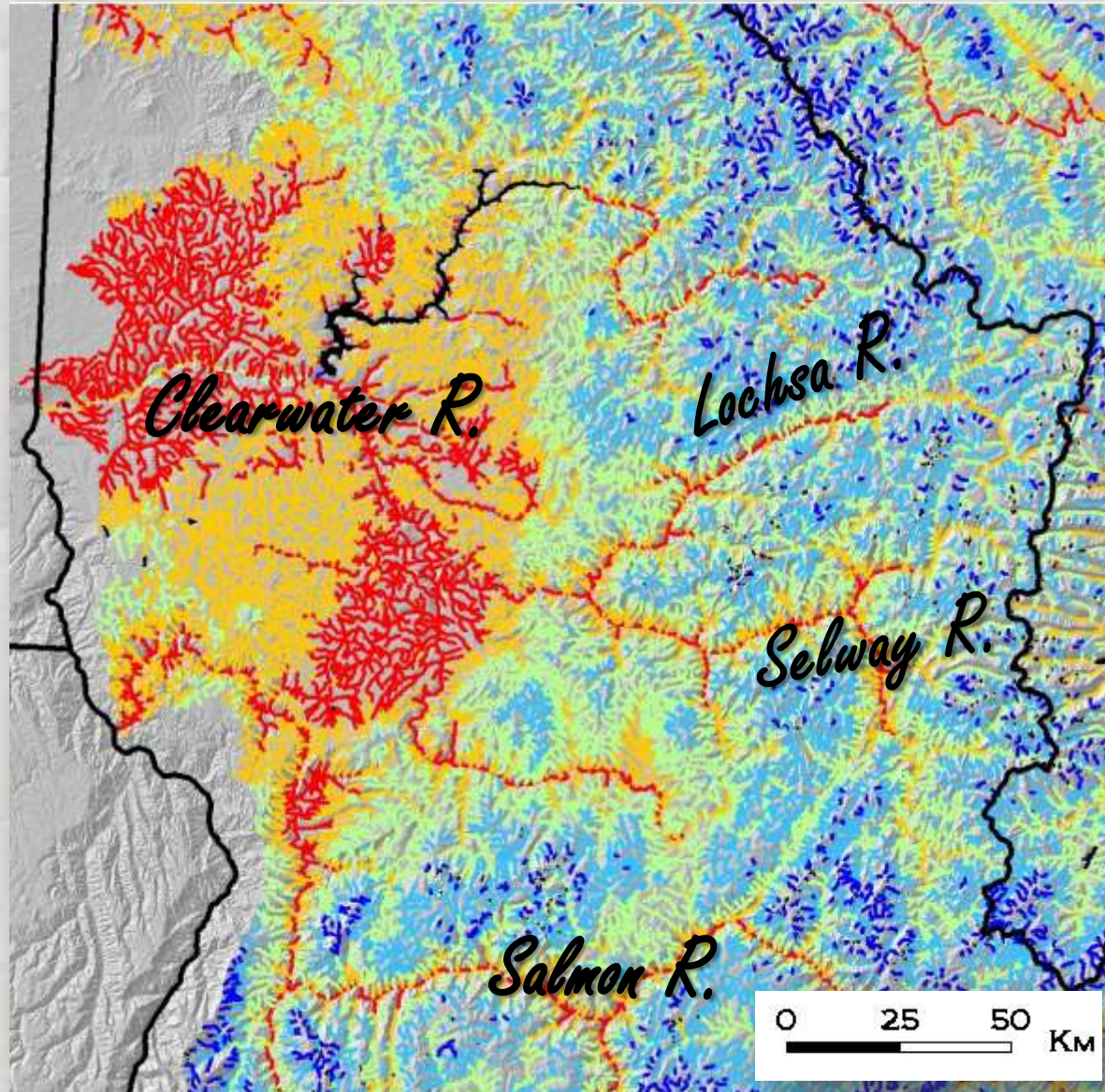


Frequency of Occurrence

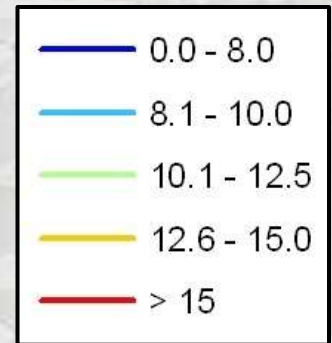
NorWeST Stream Temperature (S1)

Clearwater Stream Temperature Scenario

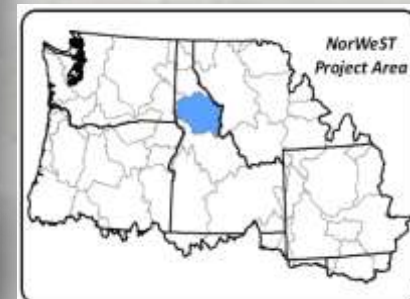
Historic (1993-2011 Average August)



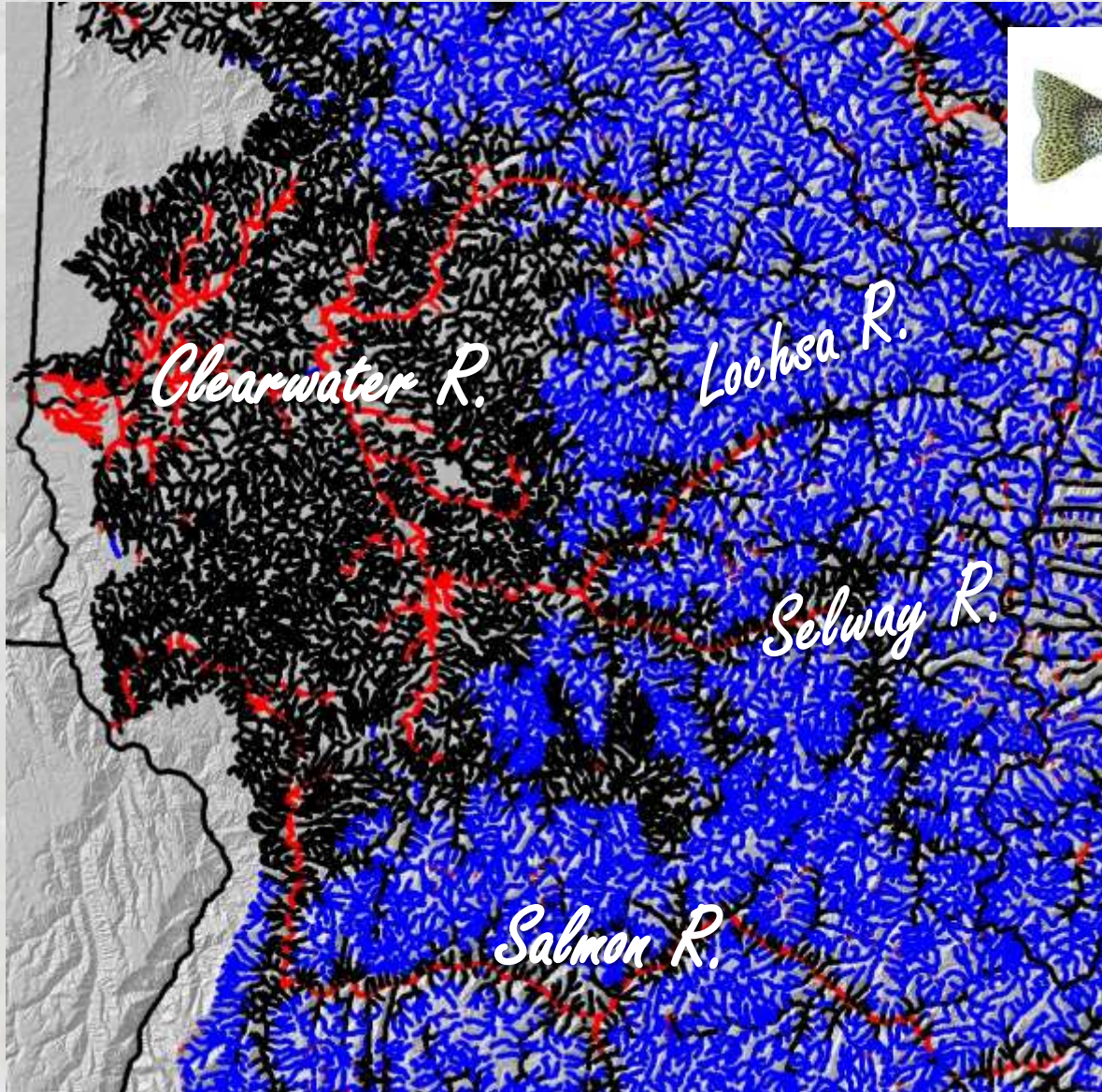
Temperature (°C)






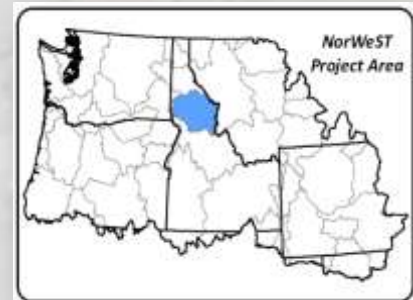
**1 kilometer
resolution**



Climate Effects on Cutthroat Thermal Habitat Historic (1993-2011 Average August)

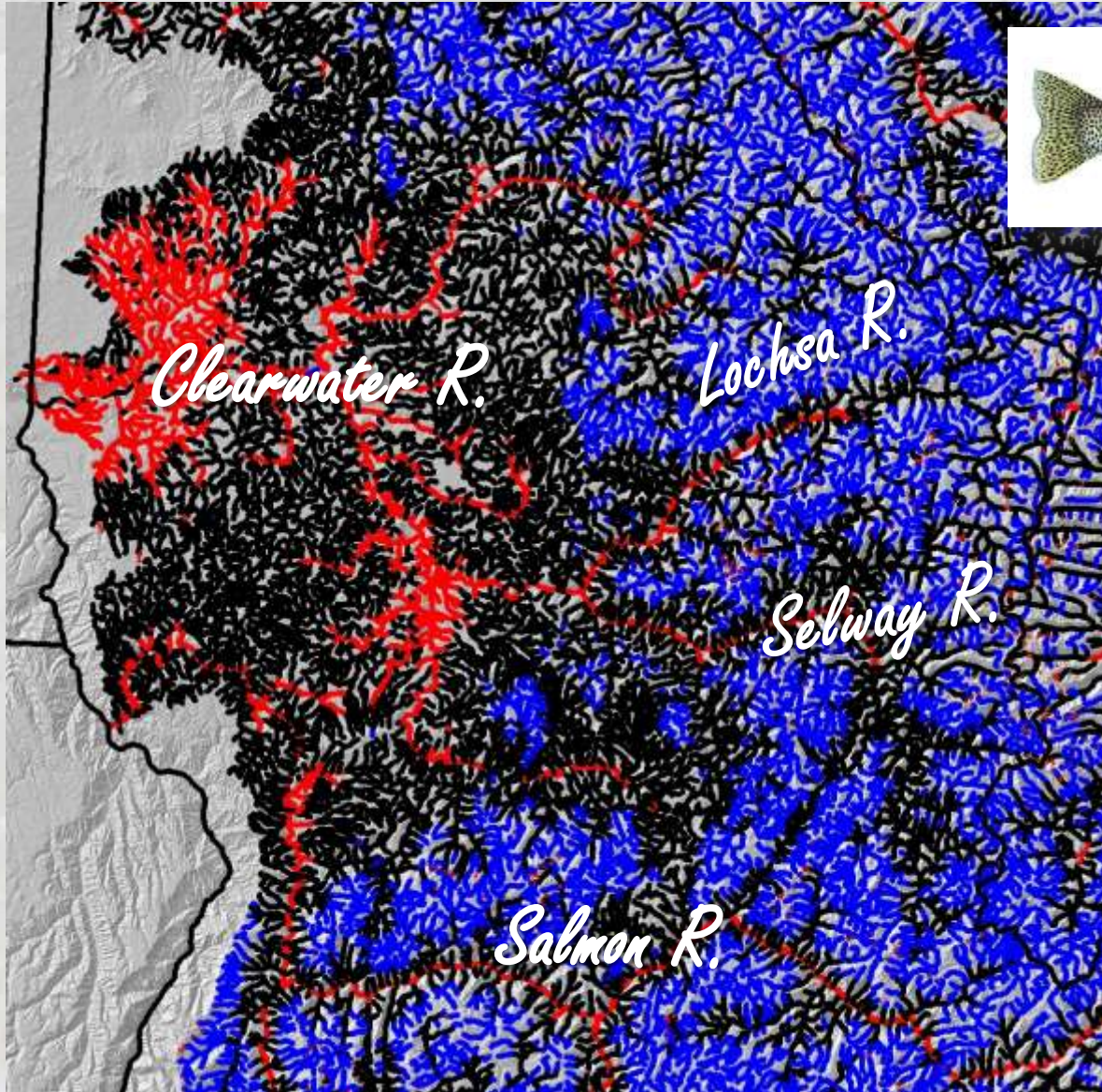





-  Suitable
 -  Too Hot
 -  Too Cold
- $<17.0^{\circ}\text{C}$ & $>11.0^{\circ}\text{C}$

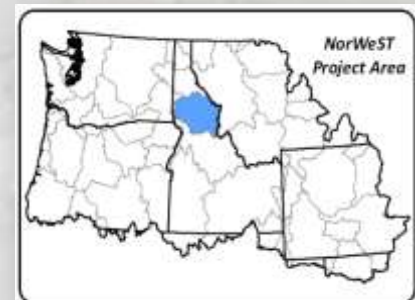


Climate Effects on Cutthroat Thermal Habitat

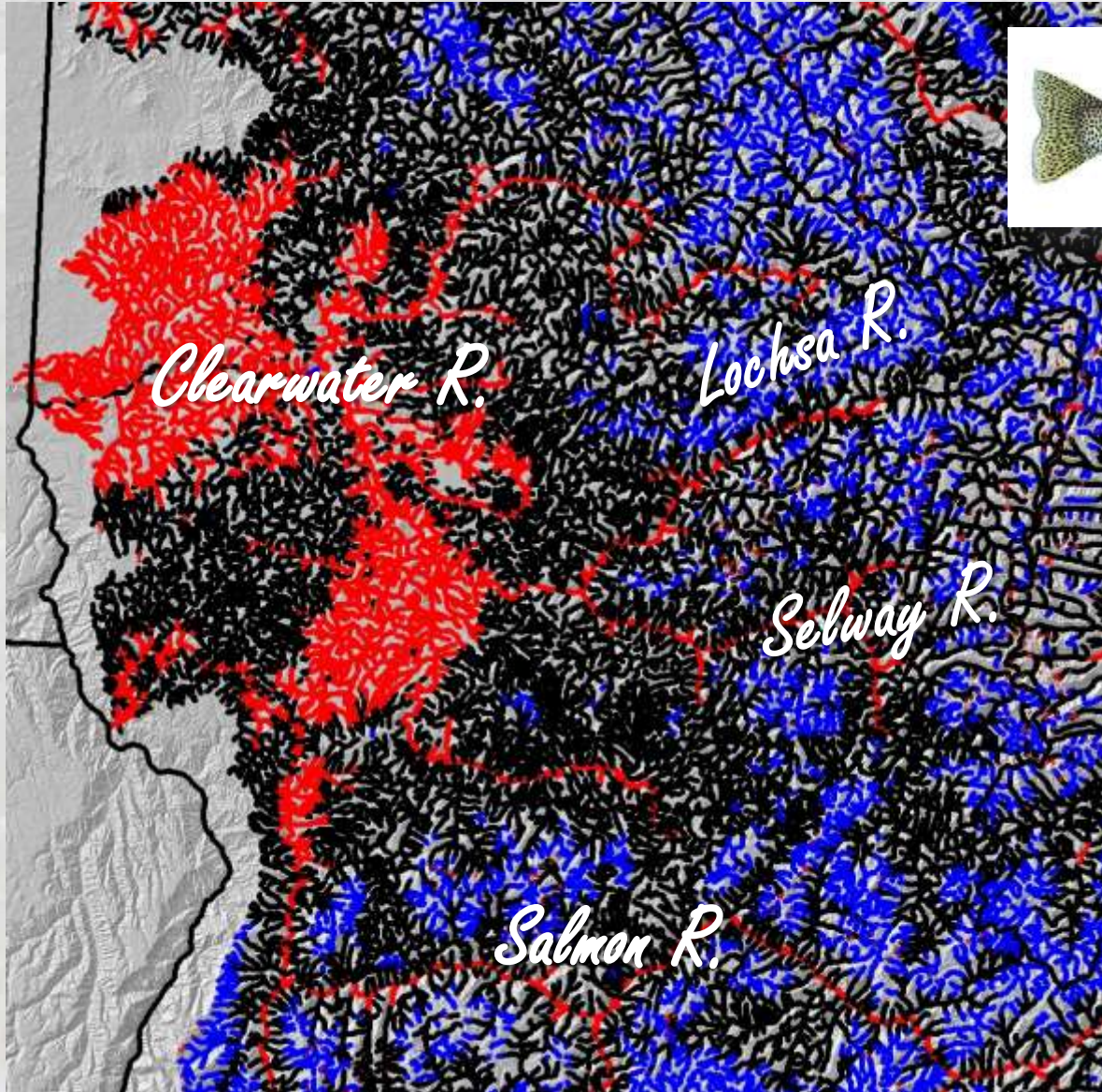
+1.50°C Stream Temp (~2040s)






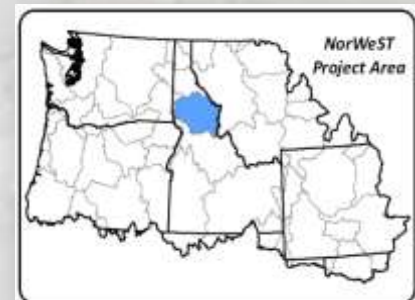
-  Suitable
 -  Too Hot
 -  Too Cold
- <17.0°C & >11.0°C



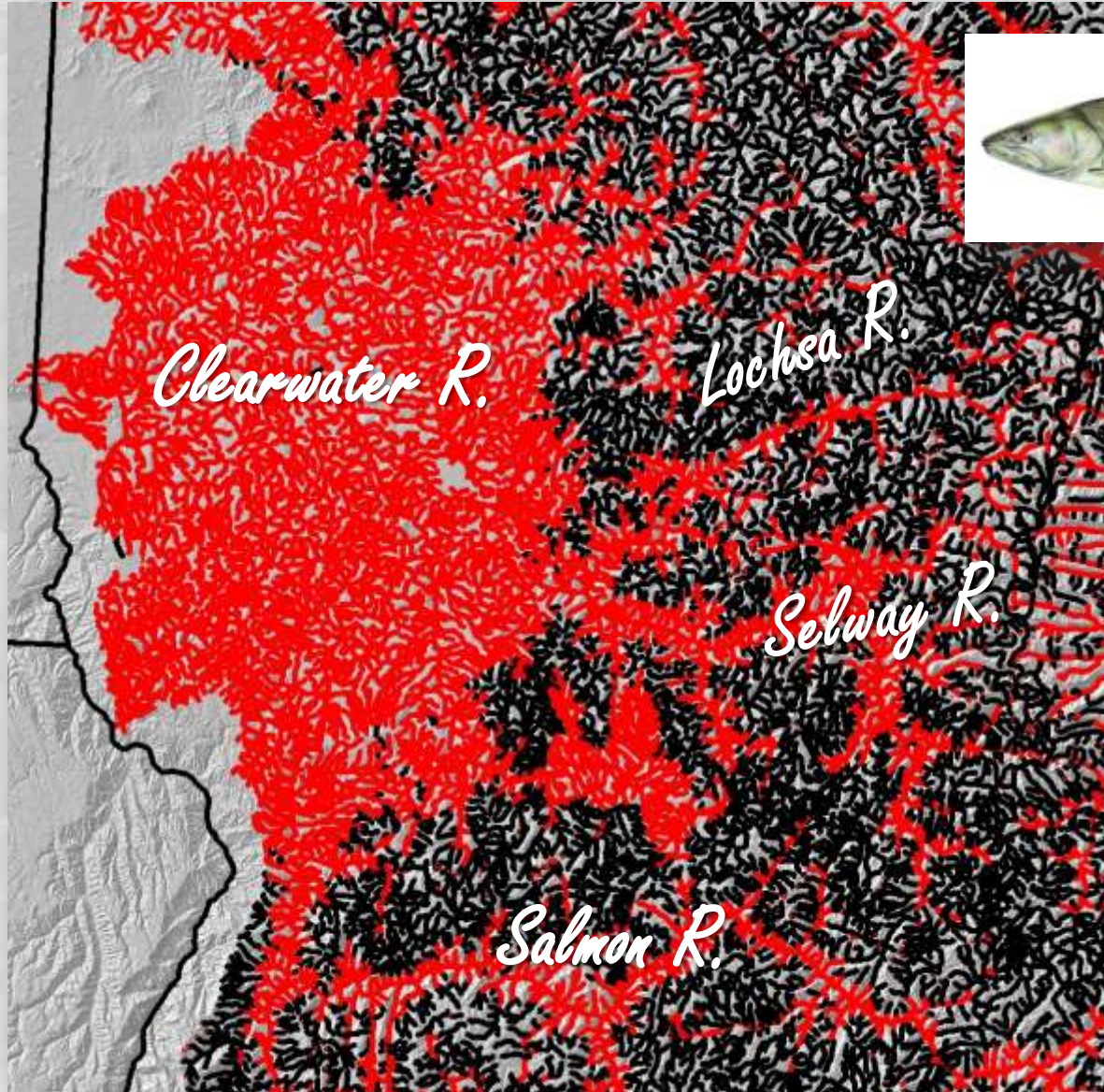
Climate Effects on Cutthroat Thermal Habitat +3.00°C Stream Temp (~2080s)



-  Suitable
 -  Too Hot
 -  Too Cold
- <17.0°C & >11.0°C

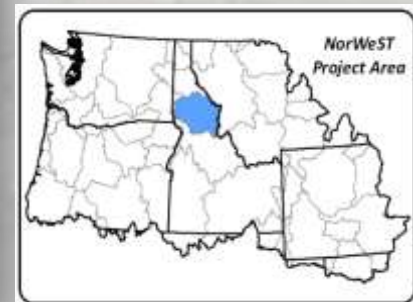


Climate Effects on Bull Trout Thermal Habitat Historic (1993-2011 Average August)

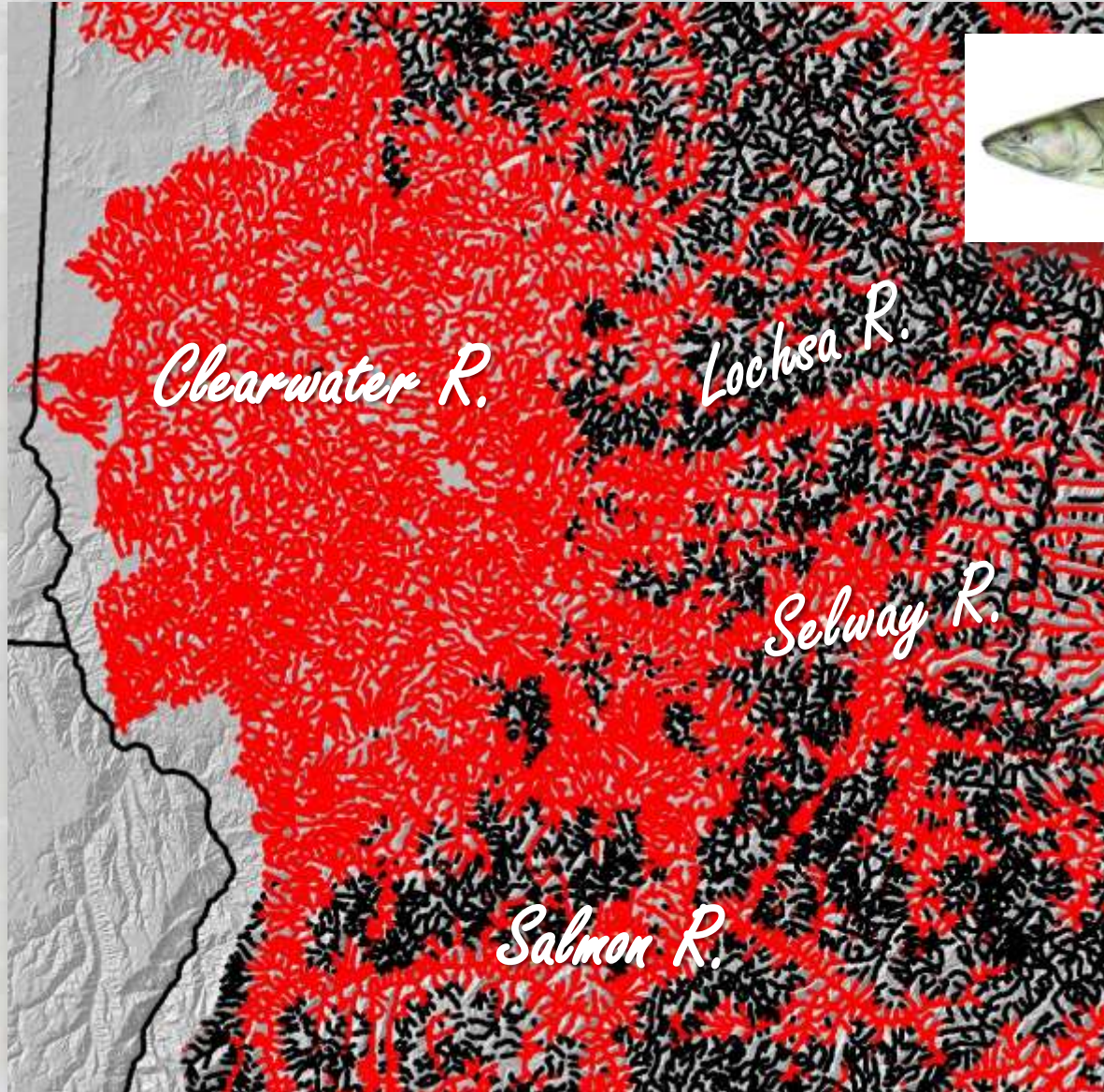


■ Suitable
■ Unsuitable

< 11.0°C

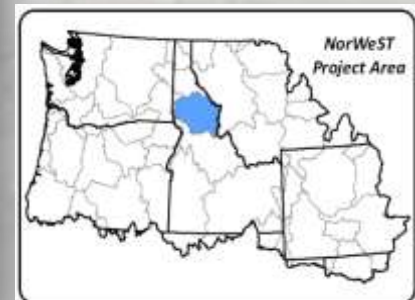


Climate Effects on Bull Trout Thermal Habitat +1.50°C Stream Temp (~2040s)

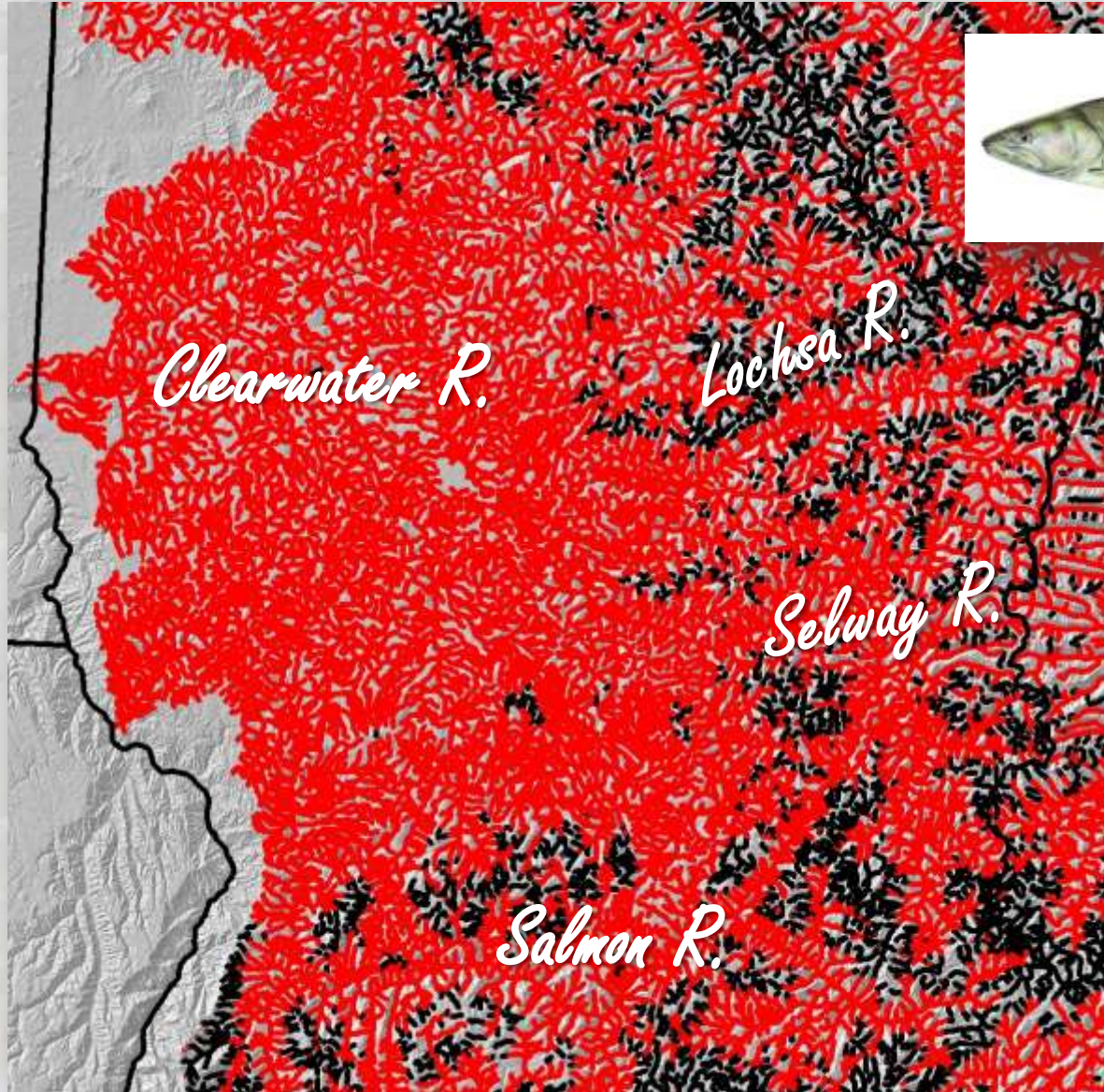




- Suitable
- Unsuitable

< 11.0°C

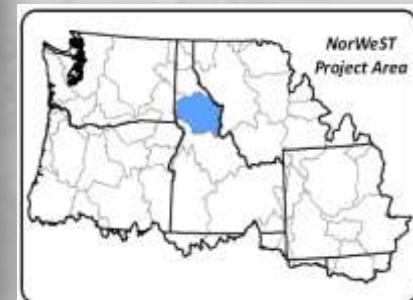


Climate Effects on Bull Trout Thermal Habitat +3.00°C Stream Temp (~2080s)



-  Suitable
-  Unsuitable

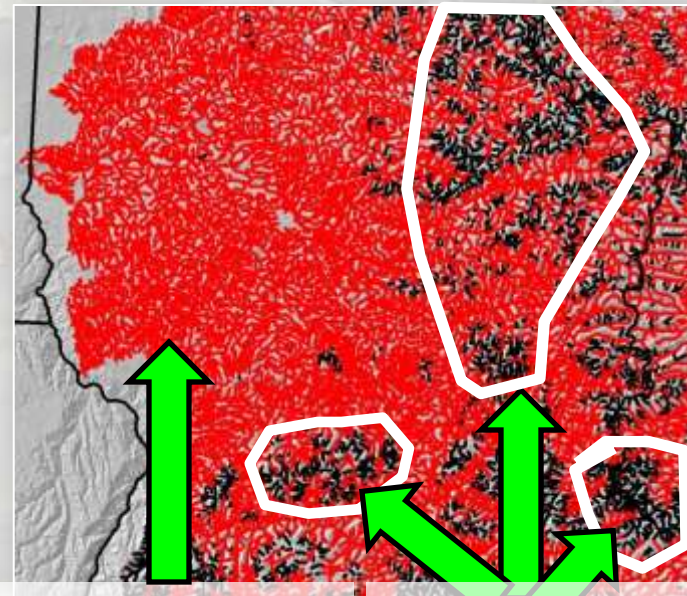
< 11.0°C



Climate-Smart Prioritization of Habitat Restoration

Lots of things we can do...

- Maintaining/restoring flow...
- Maintaining/restoring riparian...
- Restoring channel form/function...
- Prescribed burns limit wildfire risks...
- Non-native species control...
- Improve/impede fish passage...



Low
Priority

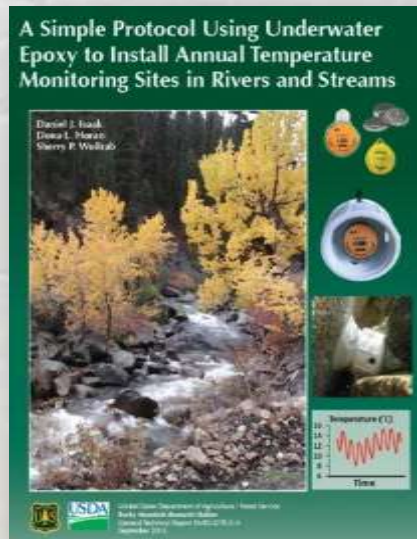
High
Priority

Additional Resources...

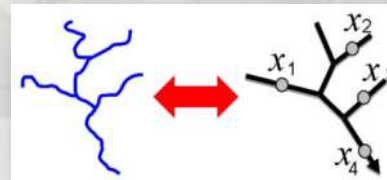
Websites (Google Search On...)

- 1) *SSN/STARS* – statistical modeling of data on networks
- 2) *NorWeST* – regional stream temperature database & climate scenarios
- 3) *Stream Temperature Modeling & Monitoring*

Publications...



Software...



Data...

