

# Development and Application of the NorWeST Regional Stream Temperature Model for Bull Trout Climate Assessments and Monitoring

Dan Isaak, Seth Wenger<sup>1</sup>, Erin Peterson<sup>2</sup>, Jay Ver Hoef<sup>3</sup>, Charlie Luce, Steve Hostetler<sup>4</sup>, Jason Dunham<sup>4</sup>, Jeff Kershner<sup>4</sup>, Brett Roper, Dave Nagel, Dona Horan, Gwynne Chandler, Sharon Parkes, Sherry Wollrab

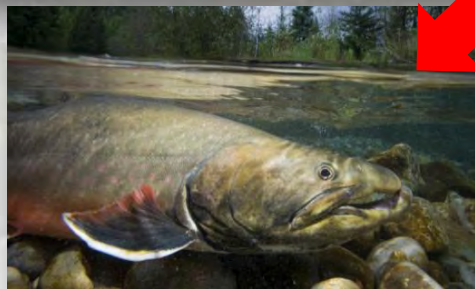
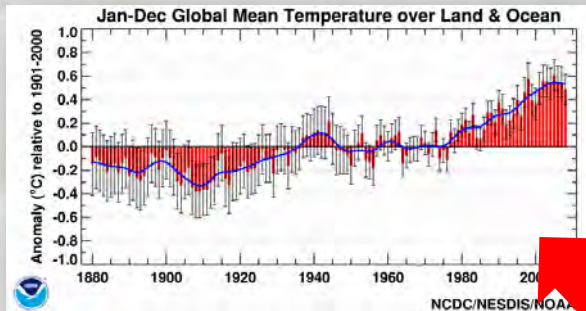
U.S. Forest Service

<sup>1</sup>Trout Unlimited

<sup>2</sup>CSIRO

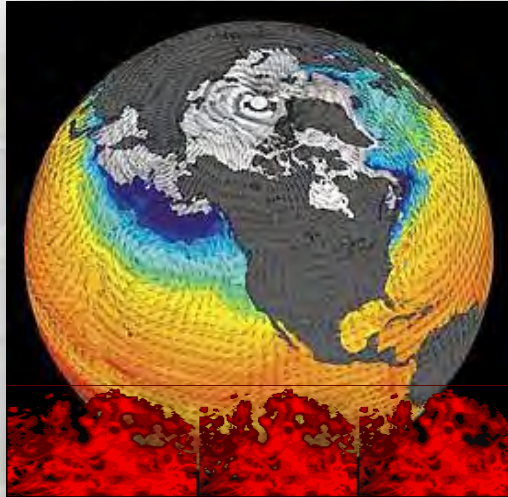
<sup>3</sup>NOAA

<sup>4</sup>USGS

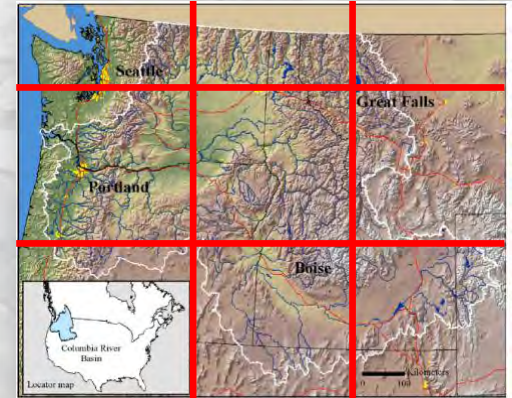


# How Will Global Climate Change Affect My Streams & Favorite Fish?

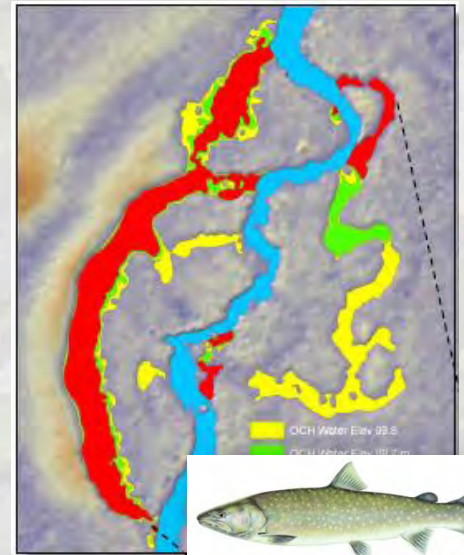
Global climate



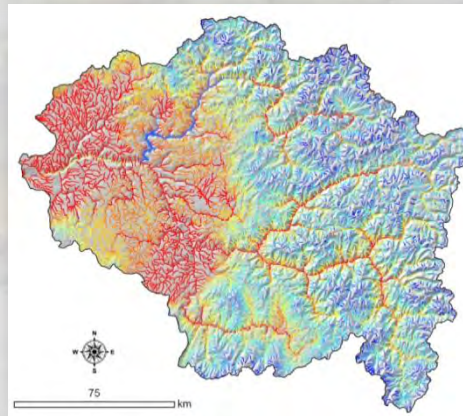
Regional climate



Stream reach



River network temperatures





## **General outline:**

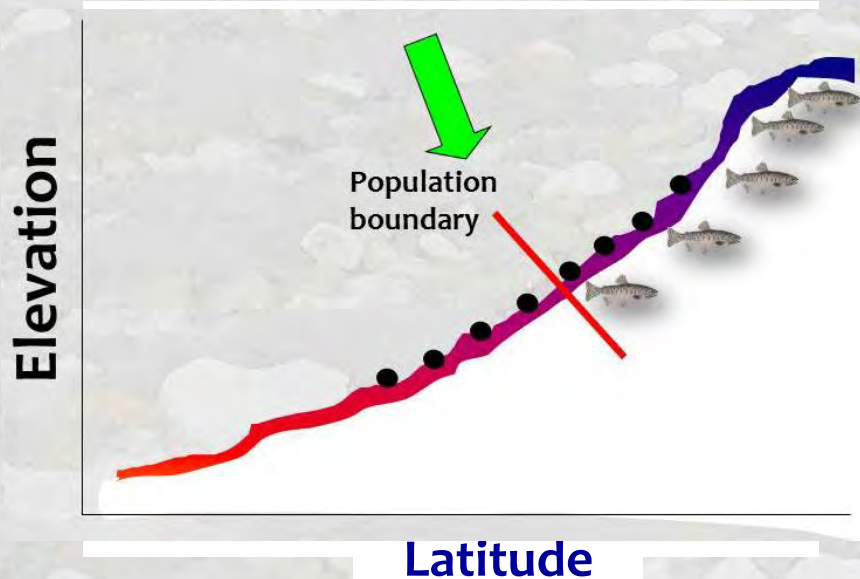
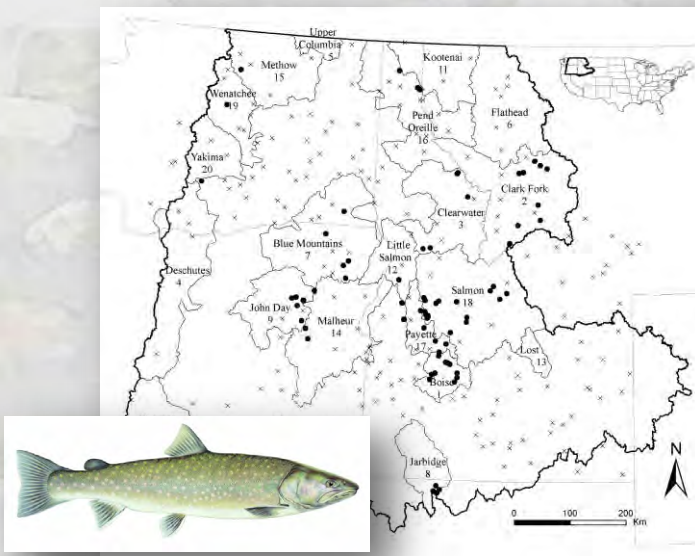
- 1) The Rieman et al. (2007) regional bull trout climate assessment
- 2) The NorWeST regional stream temperature database, model, and climate scenarios
- 3) Uses of NorWeST products for bull trout conservation and management
- 4) Key uncertainties for bull trout in a warming world

# Bull Trout Climate Model:

## What Are the Historical Patterns?

76 streams with longitudinal surveys

Bull trout elevation boundaries



**Juvenile Bull Trout Lower Elevation Limit ( $R^2 = 0.74$ )**

$$Y = 18693 - 191(\text{latitude}) + 73.6(\text{longitude})$$

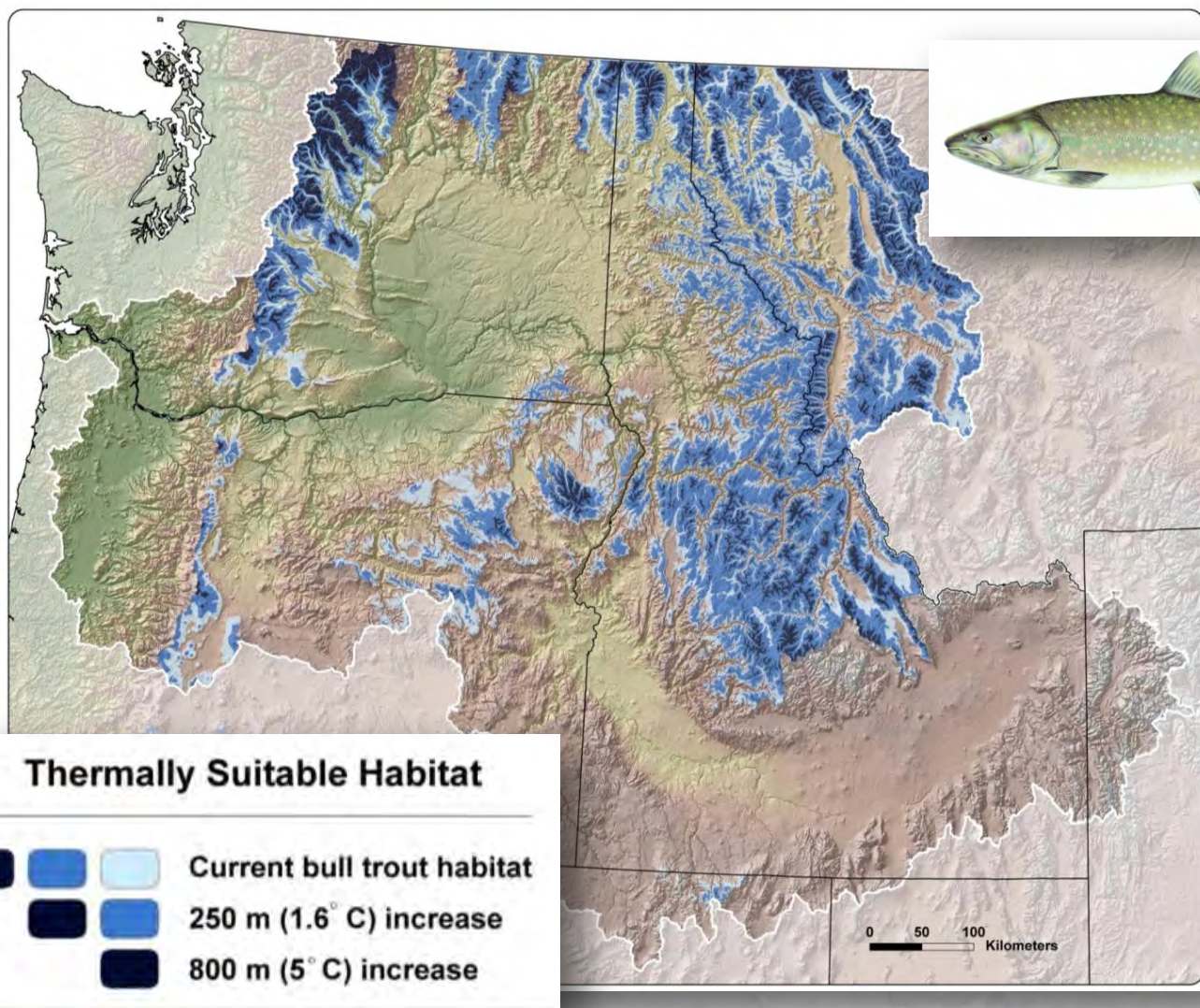
1° lat = -191 m; 1° long = 73.6 m change in bull trout elevation limit

**Mean Annual Air Temperature ( $R^2 = 0.89$ )**

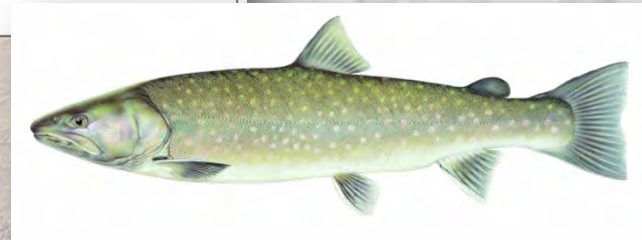
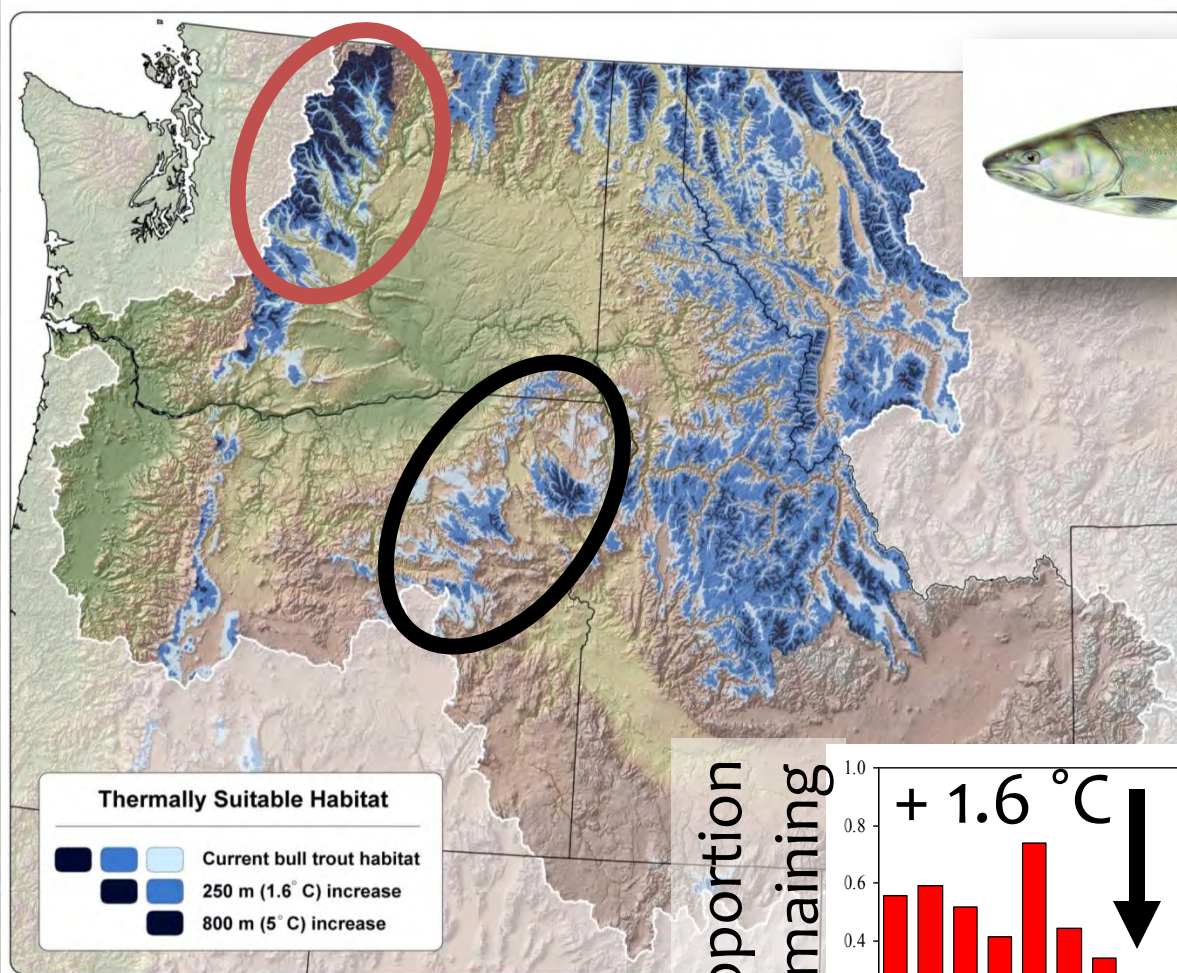
$$Y = 67 - 0.86(\text{latitude}) + 0.12(\text{longitude}) - 0.0062(\text{elevation})$$

1° lat = -138 m; 1° long = 88 m change in isotherm elevation

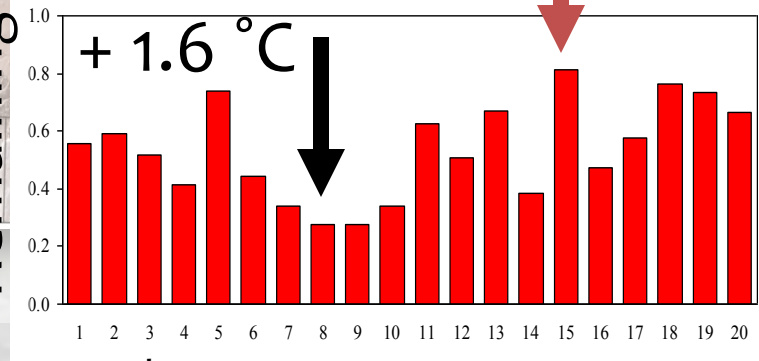
# Bull Trout Climate Model: Lots of Habitat at Risk



# Spatial Variation in Habitat Loss



Proportion Remaining

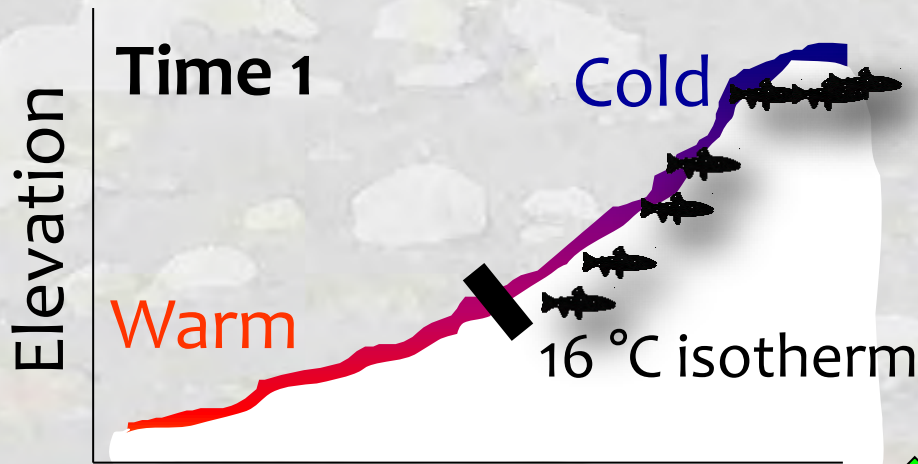


Rieman et al. 2007. *TAFS* 136:1552-1565

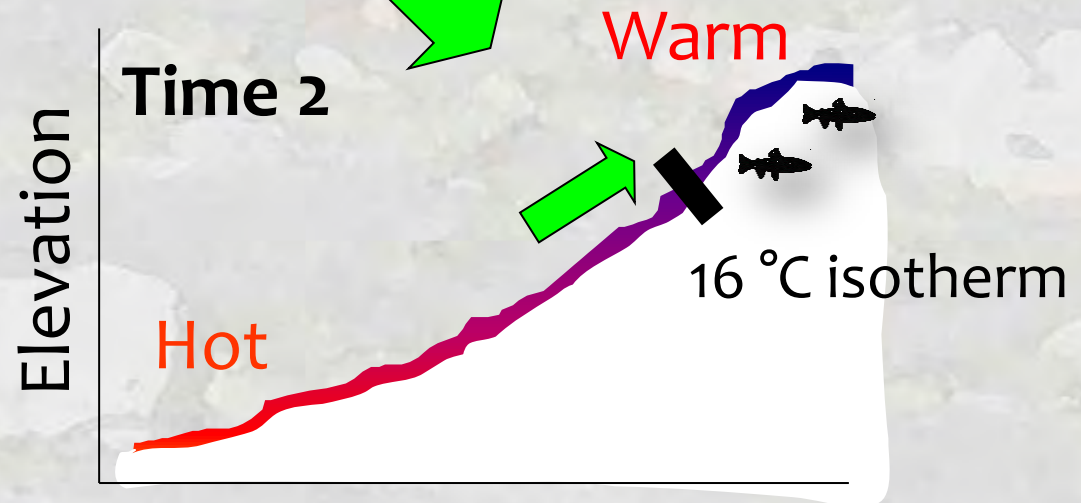
3<sup>rd</sup> Code HUC Subregion

# Key BioClimate Model Assumption:

Critical isotherm delimits species/population boundary...

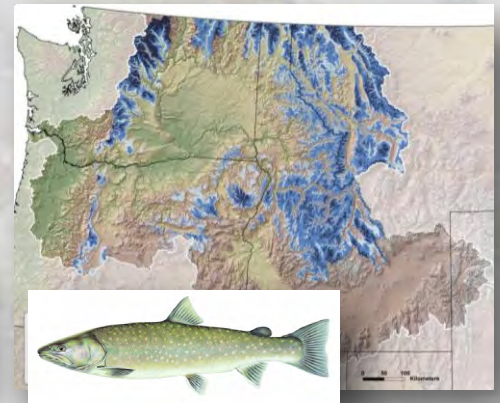
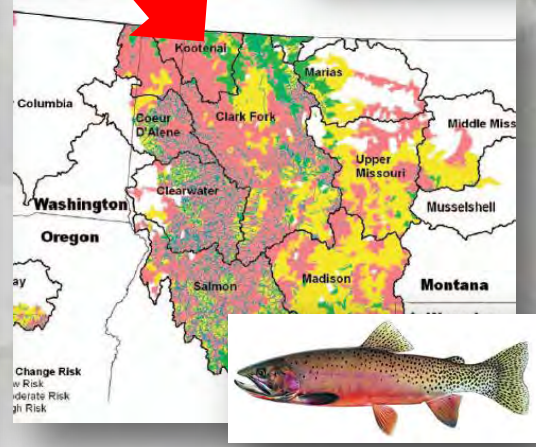
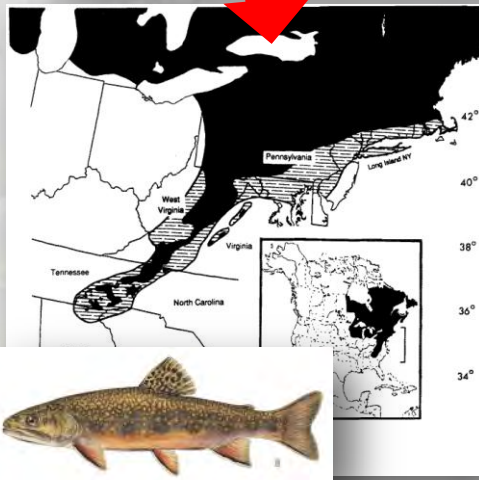
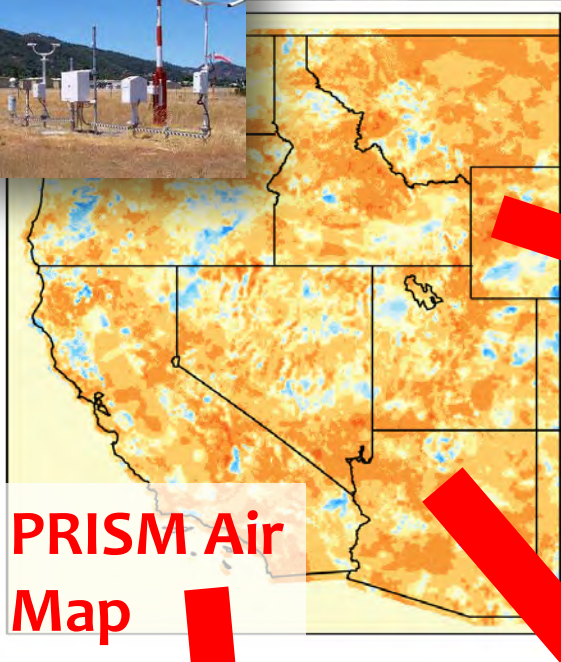


... & boundaries will track this isotherm



# Existing Fish-Climimate Models Are Coarse...

Based on air temperatures

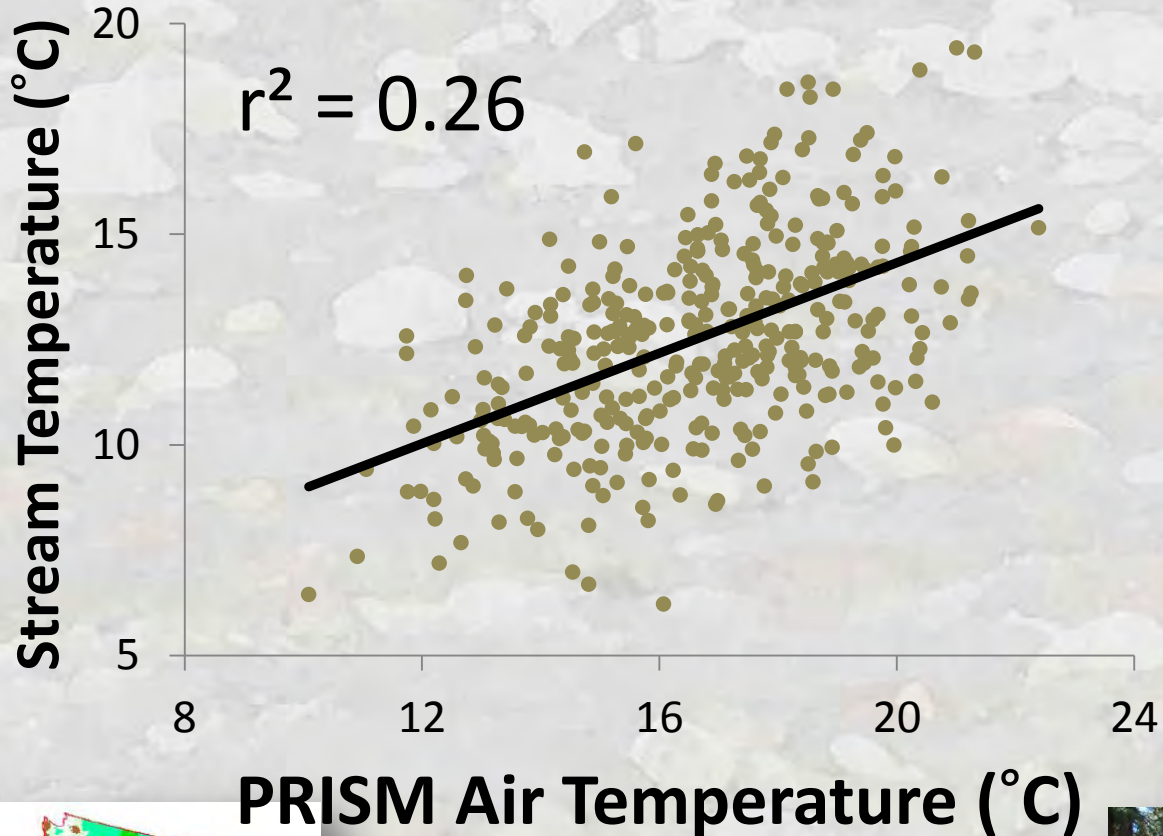


- Meisner 1988, 1990
- Eaton & Schaller 1996
- Keleher & Rahel 1996
- Rahel et al. 1996
- Mohseni et al. 2003
- Flebbe et al. 2006
- Rieman et al. 2007
- Kennedy et al. 2008
- Williams et al. 2009
- Wenger et al. 2011
- Almodovar et al. 2011
- Etc.





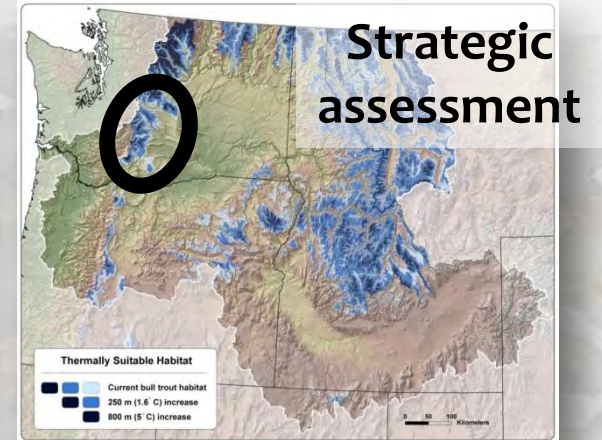
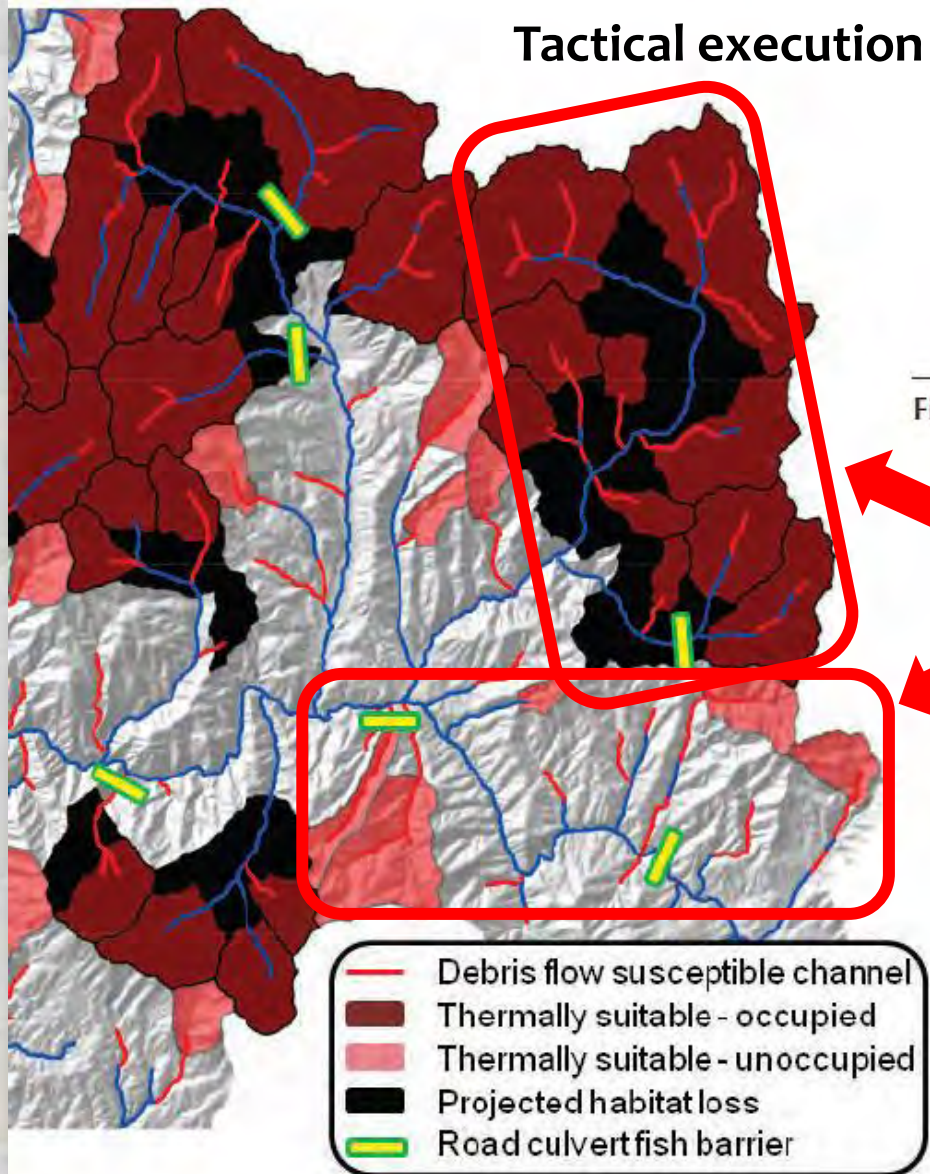
# Air Temp $\neq$ Stream Temp



Complex topography



# Accurate Landscape Level Information Needed to Empower Local Decision Makers



I'm going to invest here...  
... instead of here



# Developing a River Network Temperature Model from Application of Spatial Statistics to an Interagency Database

Dan Isaak, Charlie Luce, Bruce Rieman,  
Dave Nagel, Erin Peterson<sup>1</sup>, Dona Horan,  
Sharon Parkes, and Gwynne Chandler

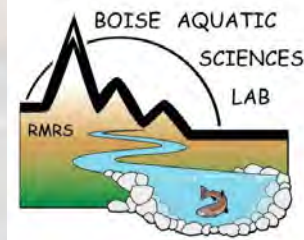
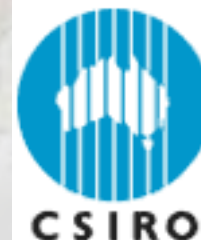
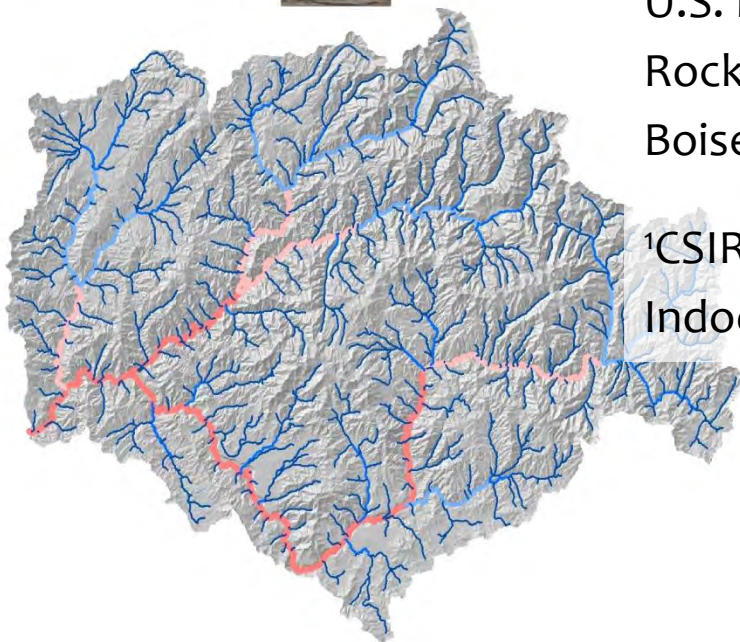
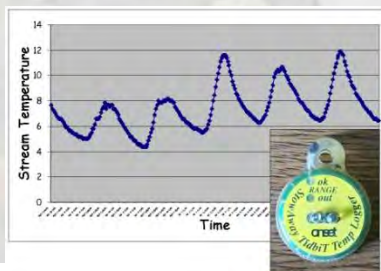
Boise Aquatic Sciences Lab

U.S. Forest Service

Rocky Mountain Research Station

Boise, ID 83702

<sup>1</sup>CSIRO Mathematical and Information Sciences  
Indooroopilly, Queensland, Australia



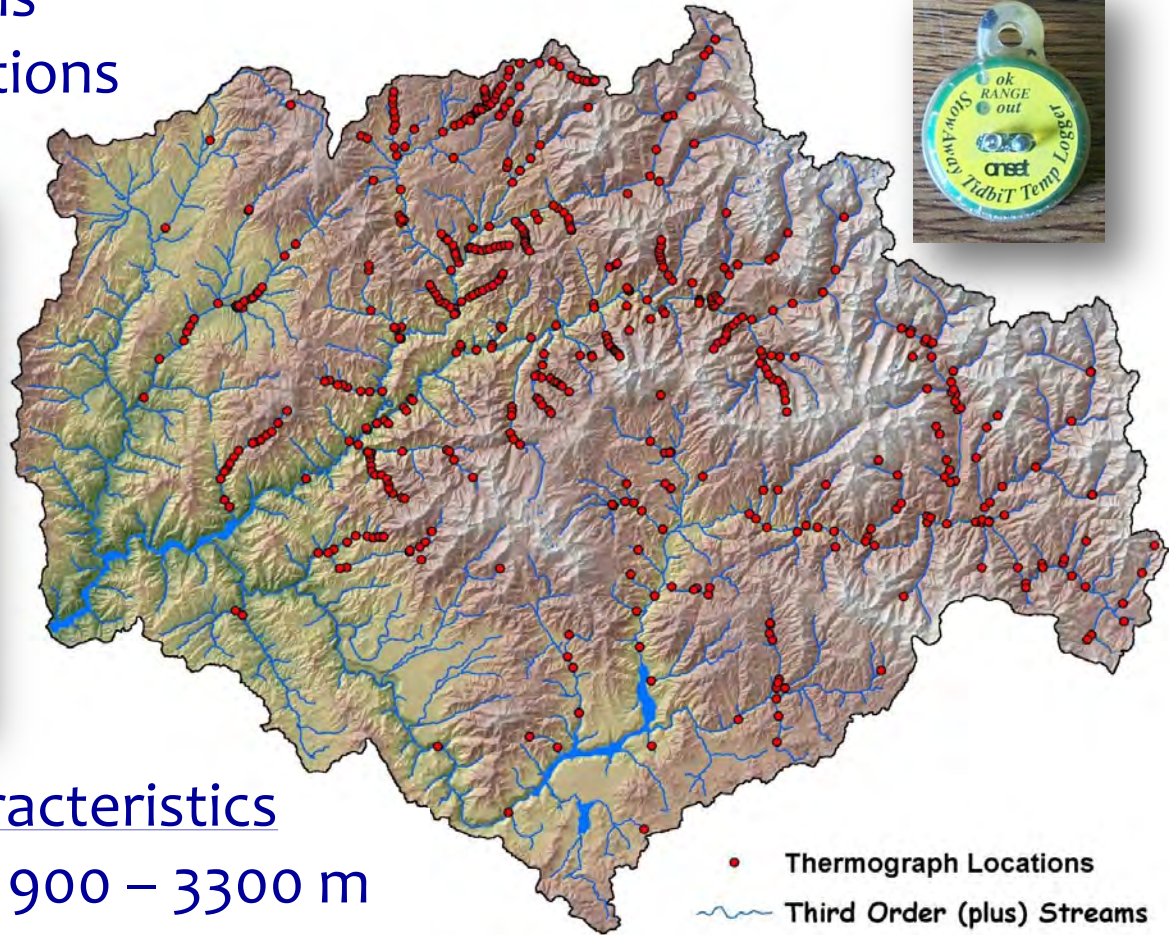
# Boise River Temperature Database

Stream Temperature Database

14 year period (1993 – 2006)

780 observations

518 unique locations



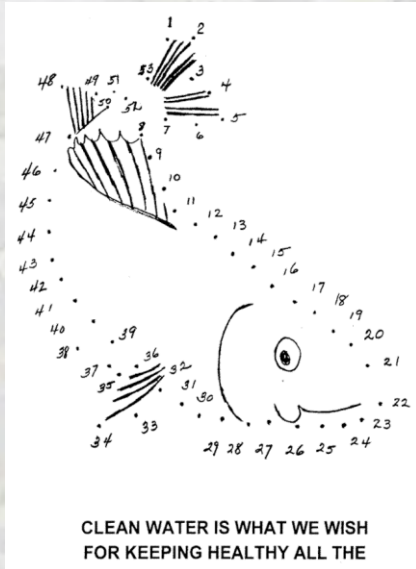
Watershed Characteristics

Elevation range 900 – 3300 m

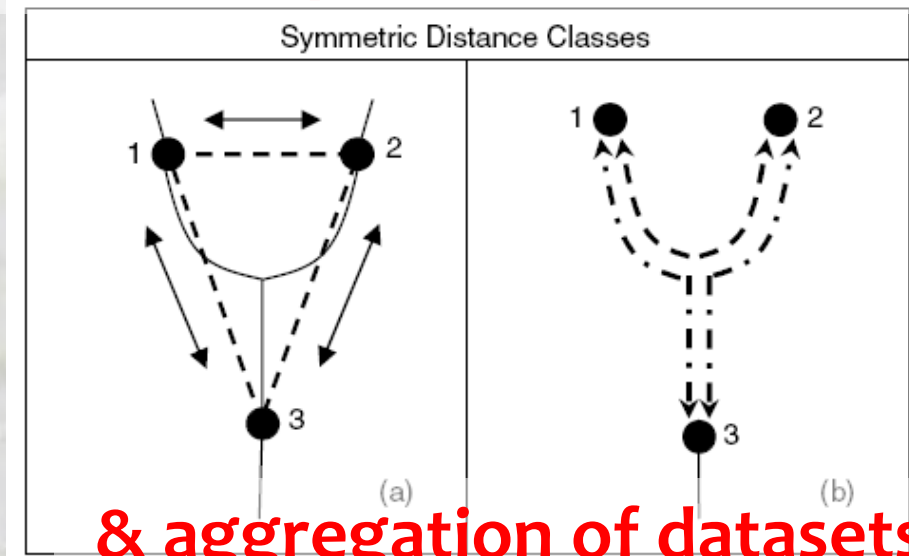
Fish bearing streams ~2,500 km

Watershed area = 6,900 km<sup>2</sup>

# Spatial Statistical Stream Models are Dot Connectors



Valid interpolation on networks



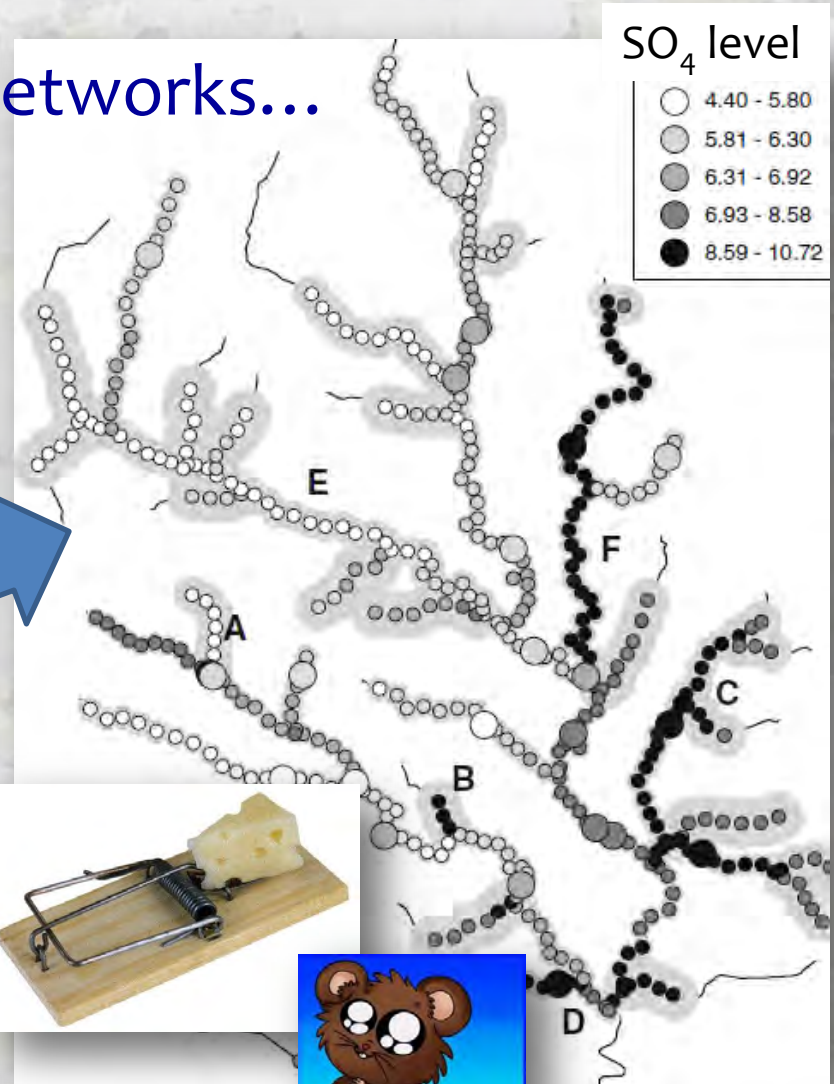
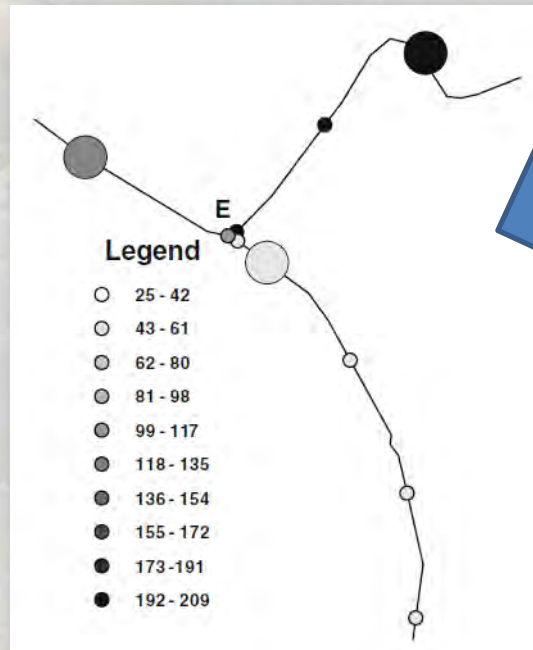
## Advantages:

- flexible & valid covariance structures  
by accommodating network topology
- weighting by stream size
- improved predictive ability & parameter estimates relative to non spatial models

# Spatial Statistical Network Models Work the Way that Streams Do...

Gradual trends within networks...

...but also changes at tributary confluences



... & are significantly better mousetraps

# Boise River Temperature Model

Summer Mean  
Non-spatial Stream Temp =

$$y = 0.93x + 0.830$$

$$= -0.0064 * \text{Elevation (m)} + 0.0104 * \text{Radiation} + 0.39 * \text{AirTemp (}^\circ\text{C)} - 0.17 * \text{Flow (m}^3\text{/s)}$$

Predicted (C°)



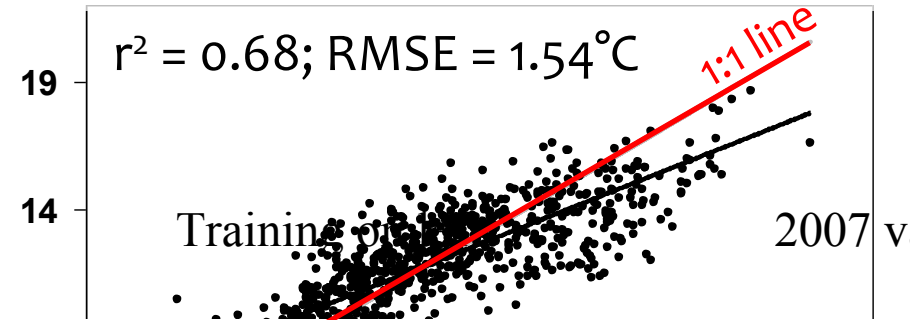
Parameter estimates are different because of autocorrelation in database

$$y = 0.00x + 2.43$$

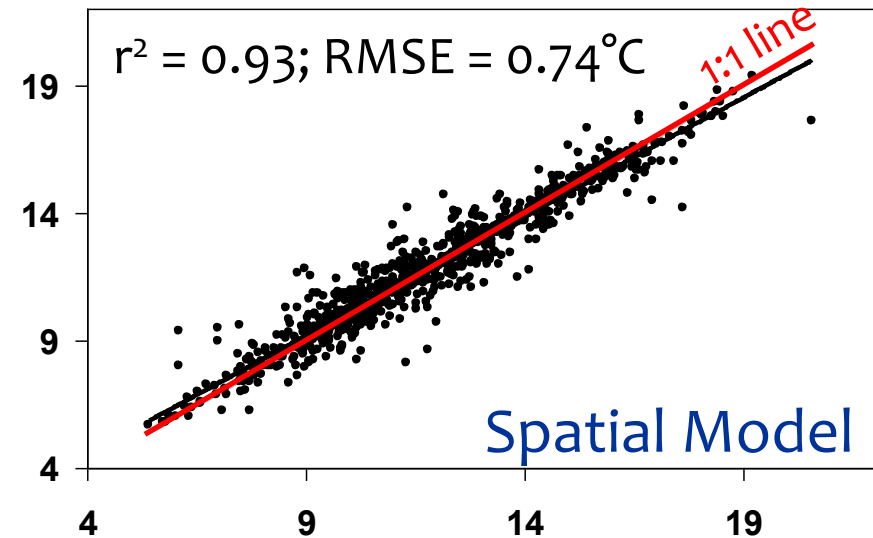
Spatial Stream Temp =

$$= -0.0045 * \text{Elevation (m)} + 0.0085 * \text{Radiation} + 0.48 * \text{AirTemp (}^\circ\text{C)} - 0.11 * \text{Flow (m}^3\text{/s)}$$

## Mean Summer Stream Temp



Non-spatial Model  
Summer Mean



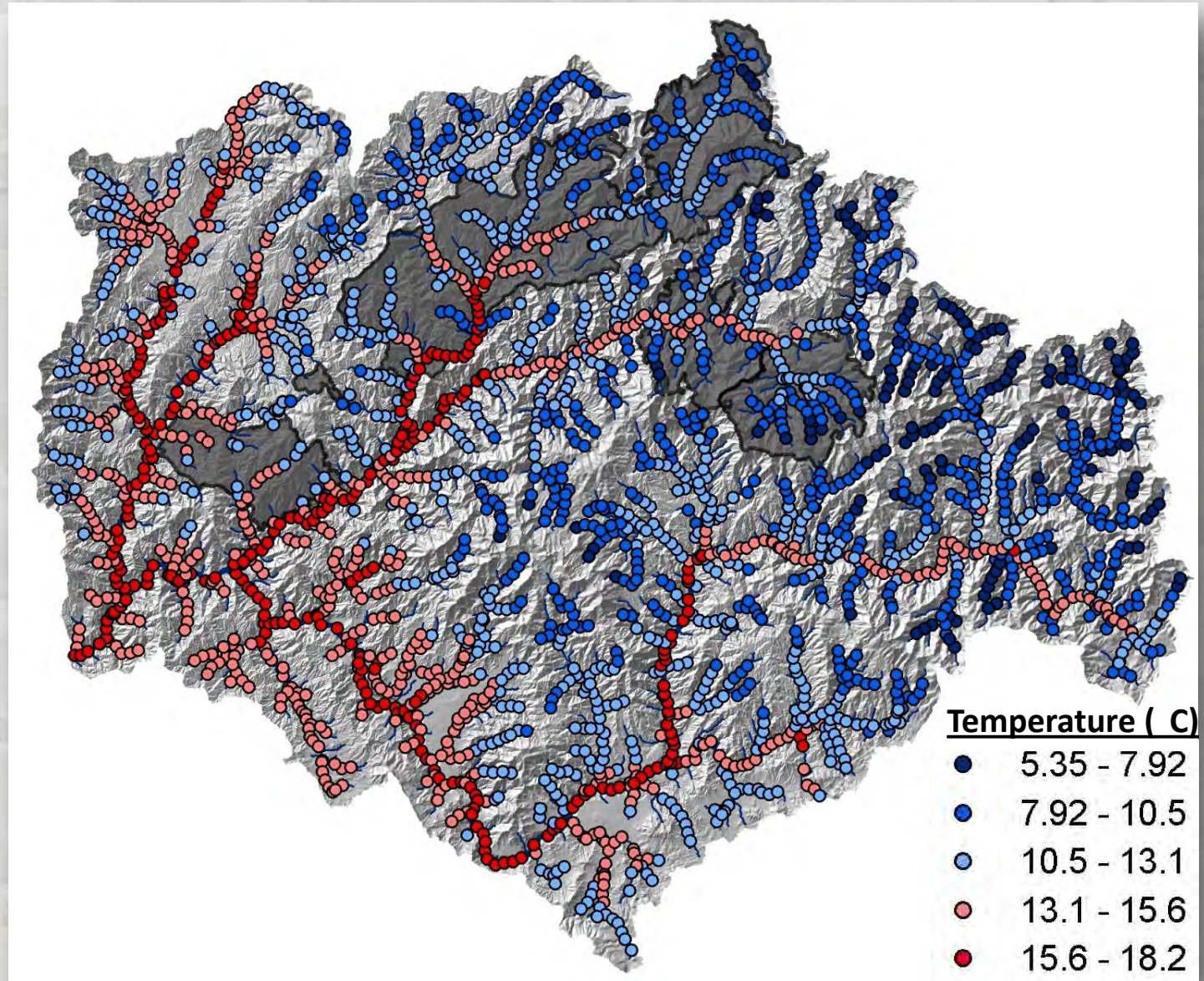
Spatial Model

Predicted (C°)

Observed (C)

# River Temperature Status Map

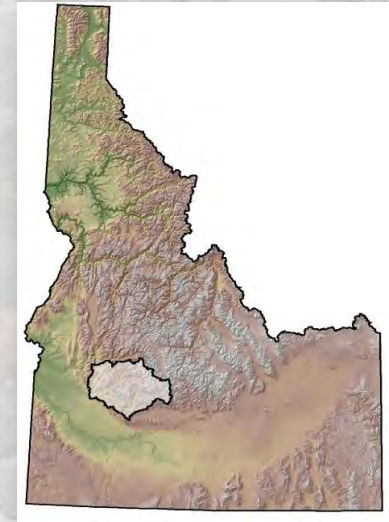
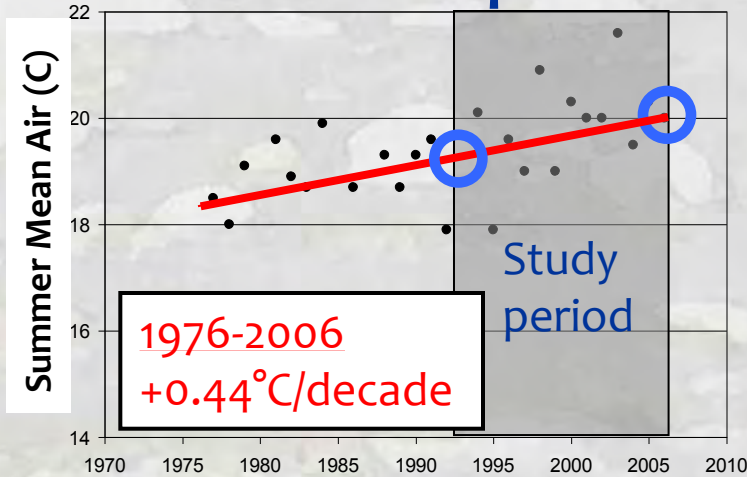
## 2006 Mean Summer Temperatures



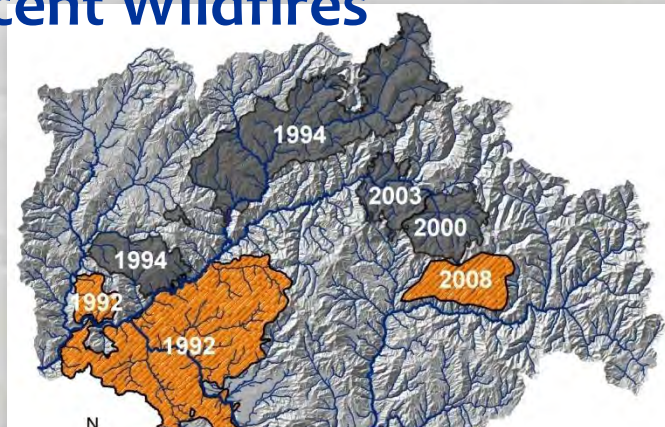


# Trend Assessment = Change in Status Between Time 1 & Time 2

## Summer Air Temperature

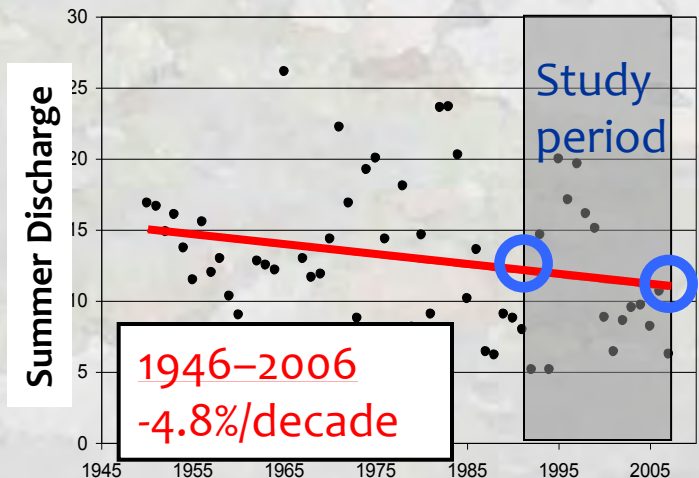


## Recent Wildfires



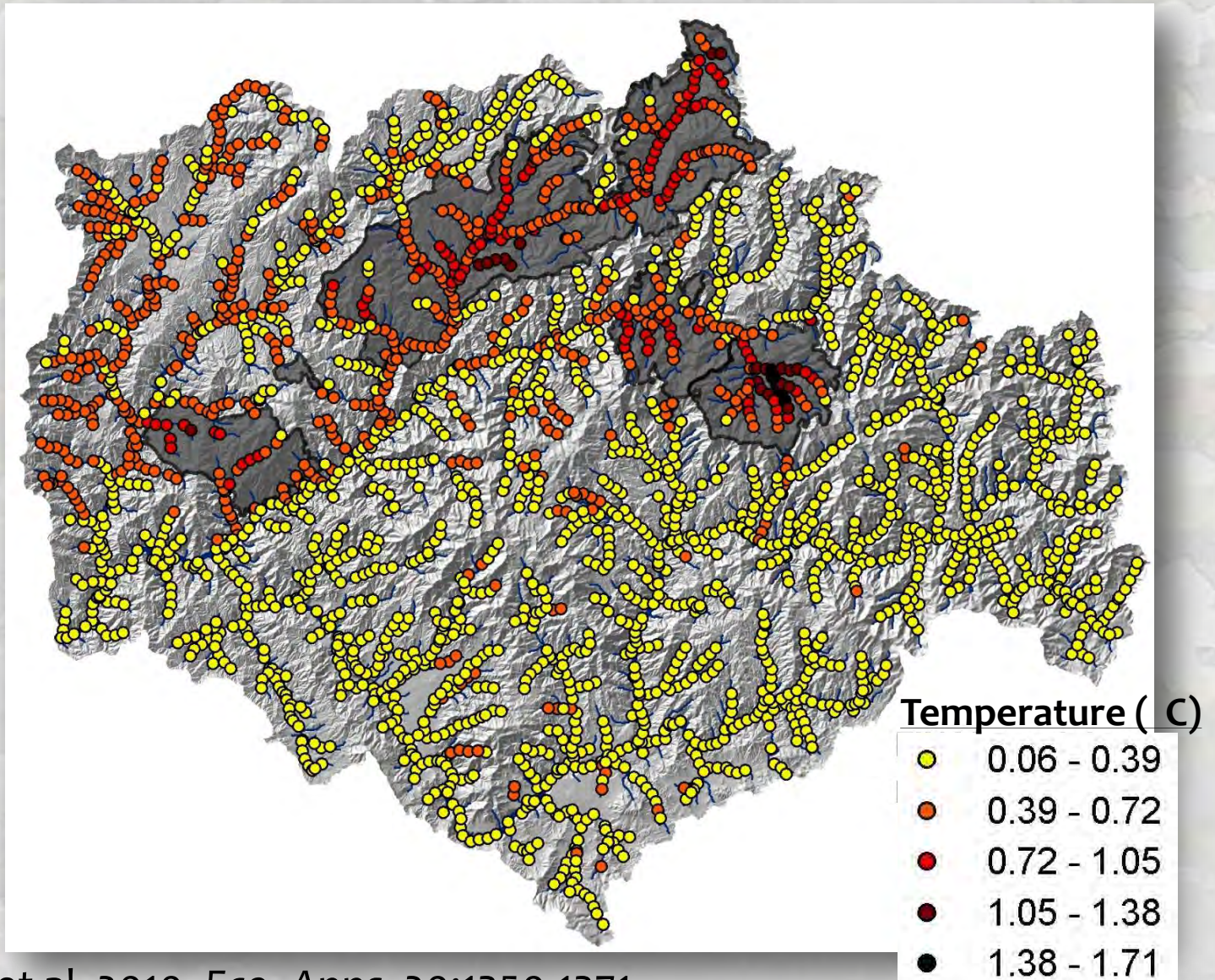
14% burned during 93-06 study period  
30% burned from 92-08

## Summer Stream Flow



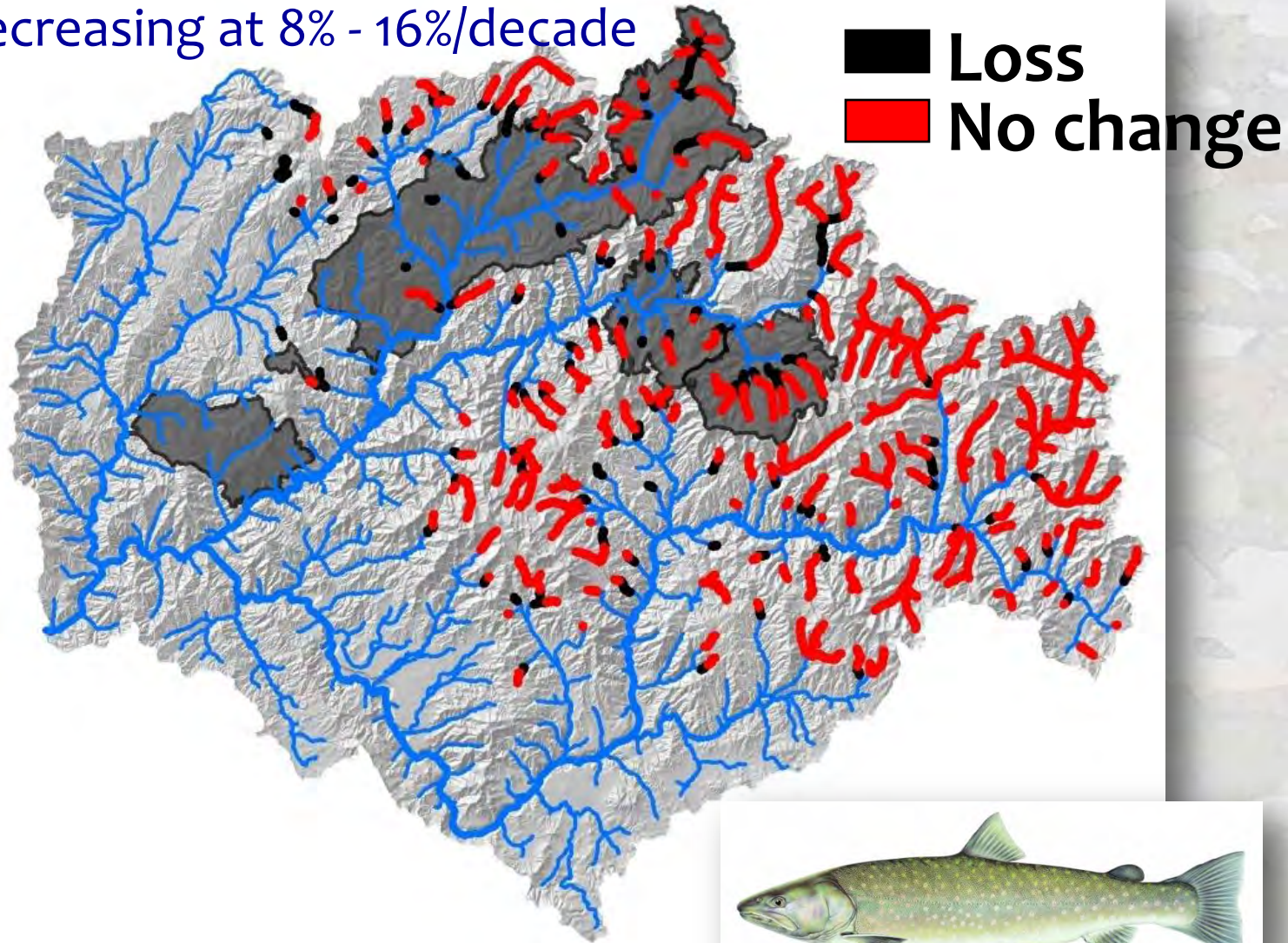
# Climate Change Map – Thermal Gains 93-06

## Change in Summer Temperature Status



# Effects of Climate Change on Bull Trout Habitats (1993-2006)

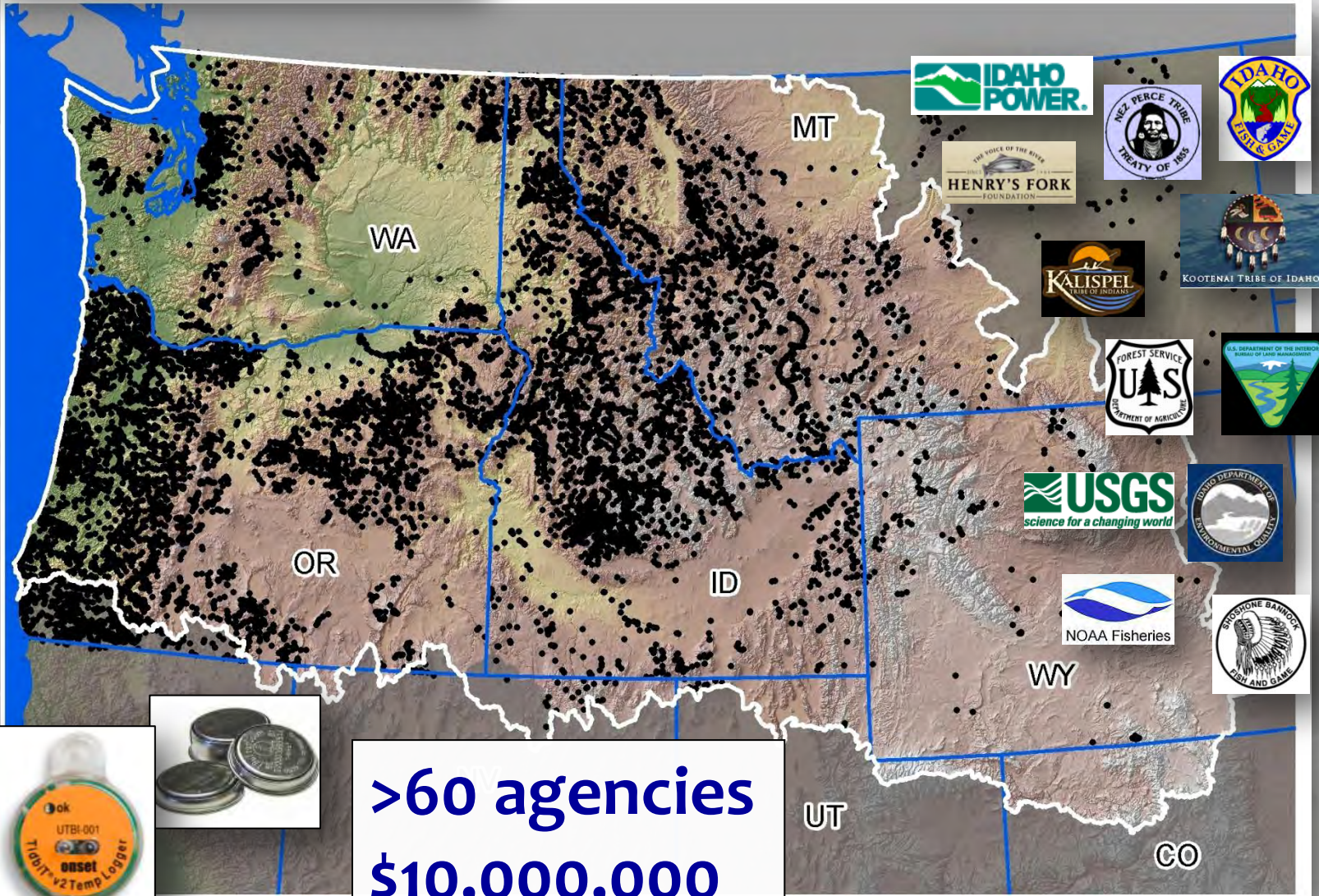
Decreasing at 8% - 16%/decade



# NorWeST

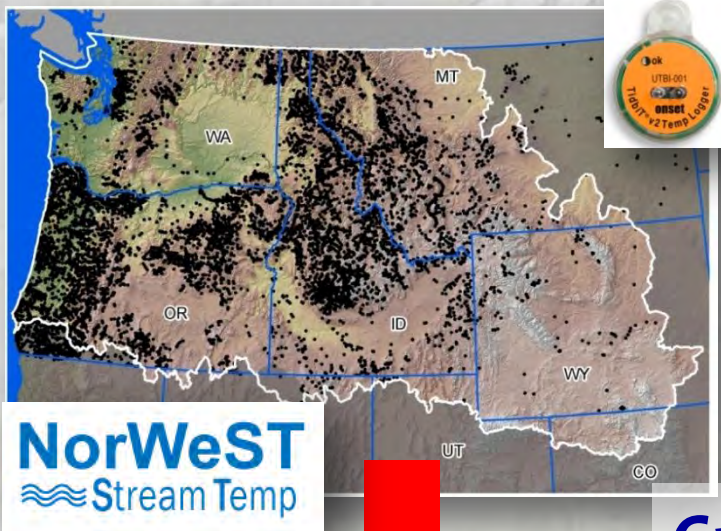
Stream Temp

>45,000,000 hourly records  
>15,000 unique stream sites

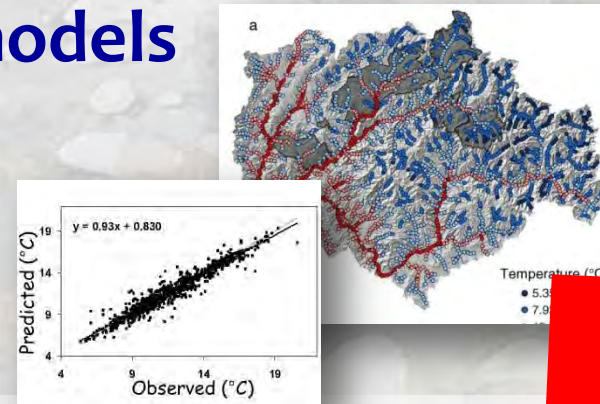


>60 agencies  
\$10,000,000

# Regional Temperature Model

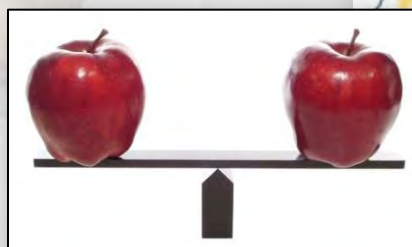
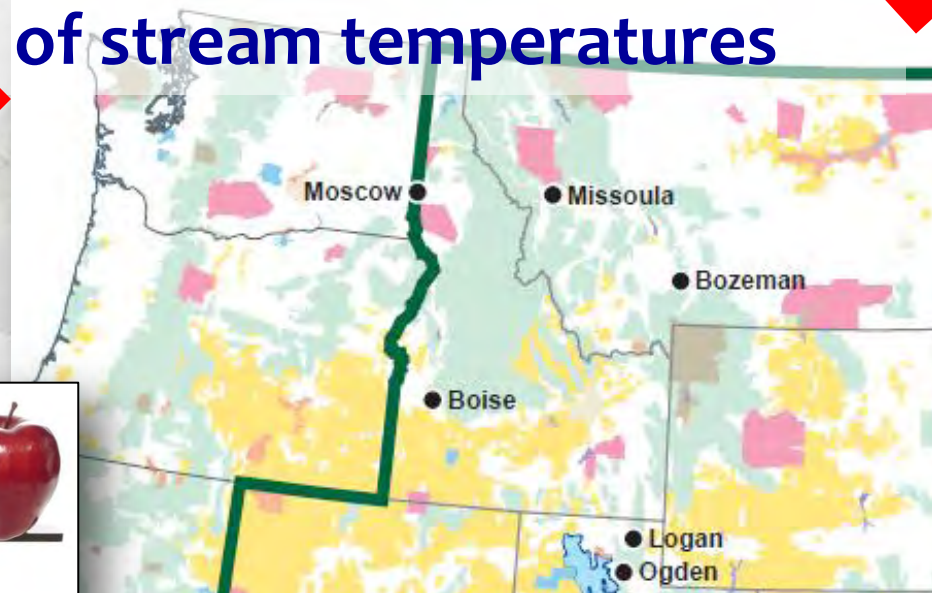


Accurate temperature models

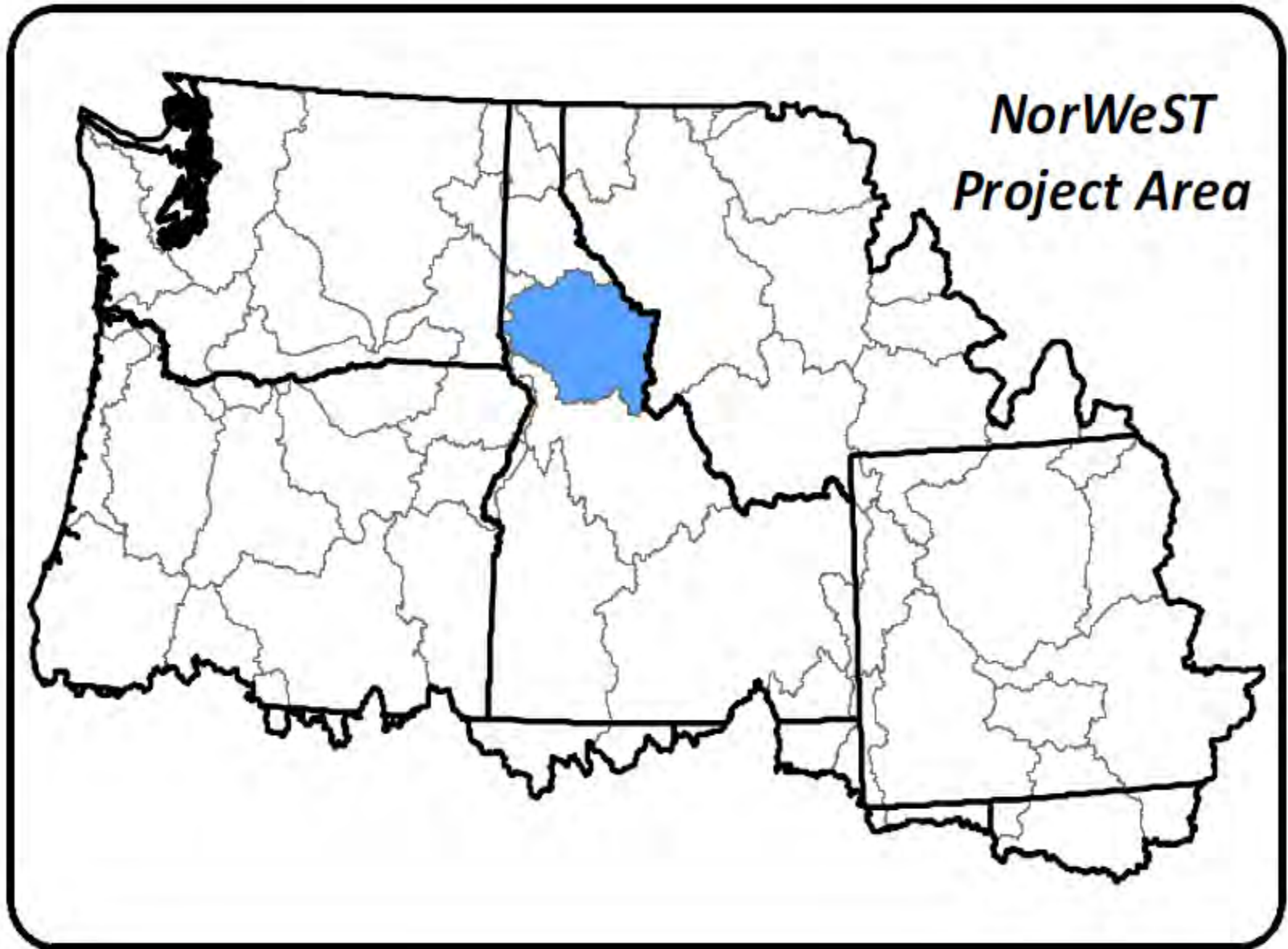


Cross-jurisdictional “maps” of stream temperatures

Consistent datum for strategic assessments across 400,000 stream kilometers



# Example: Clearwater River Basin

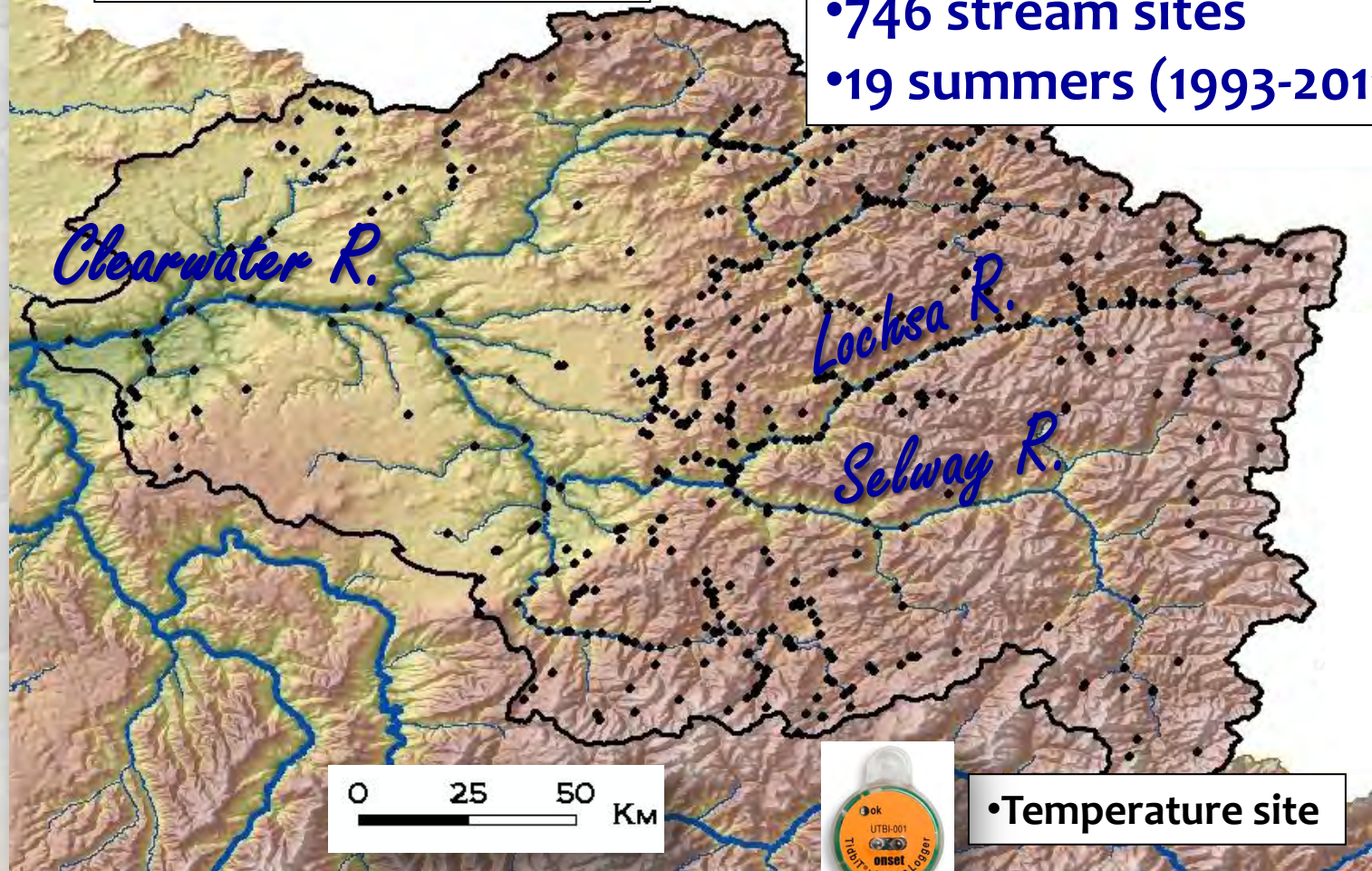


# Example: Clearwater River Basin

## Data extracted from NorWeST

16,700 stream km

- 4,487 August means
- 746 stream sites
- 19 summers (1993-2011)

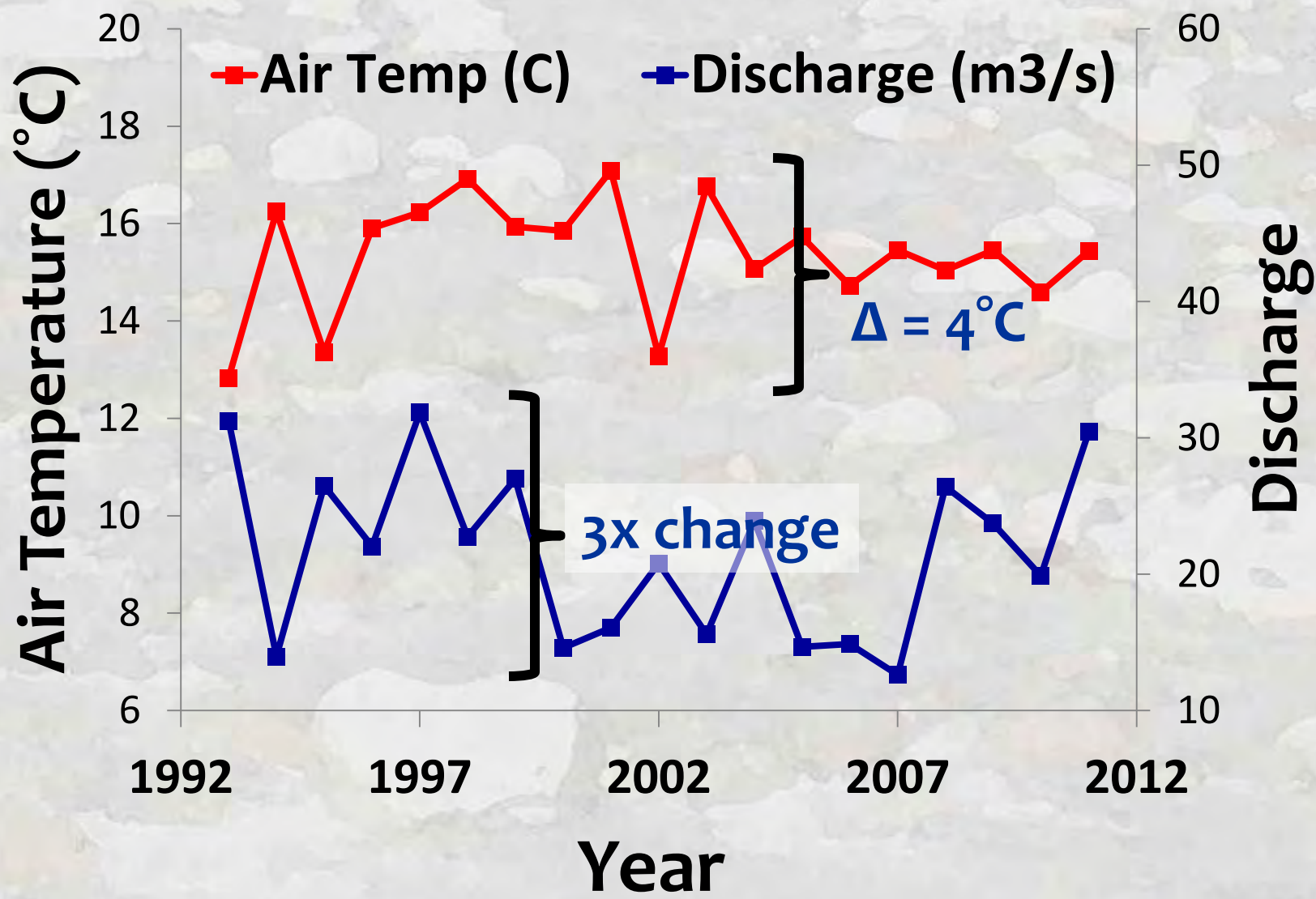


•Temperature site



# Climatic Variability in Historical Record

Extreme years include mid-21<sup>st</sup>-Century “averages”





# Clearwater River Temp Model

**n = 4,487**

## Covariate Predictors

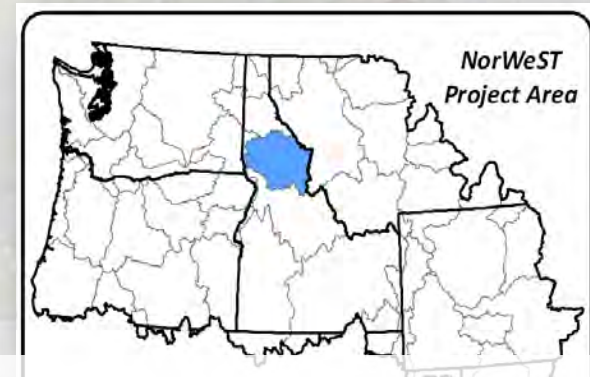
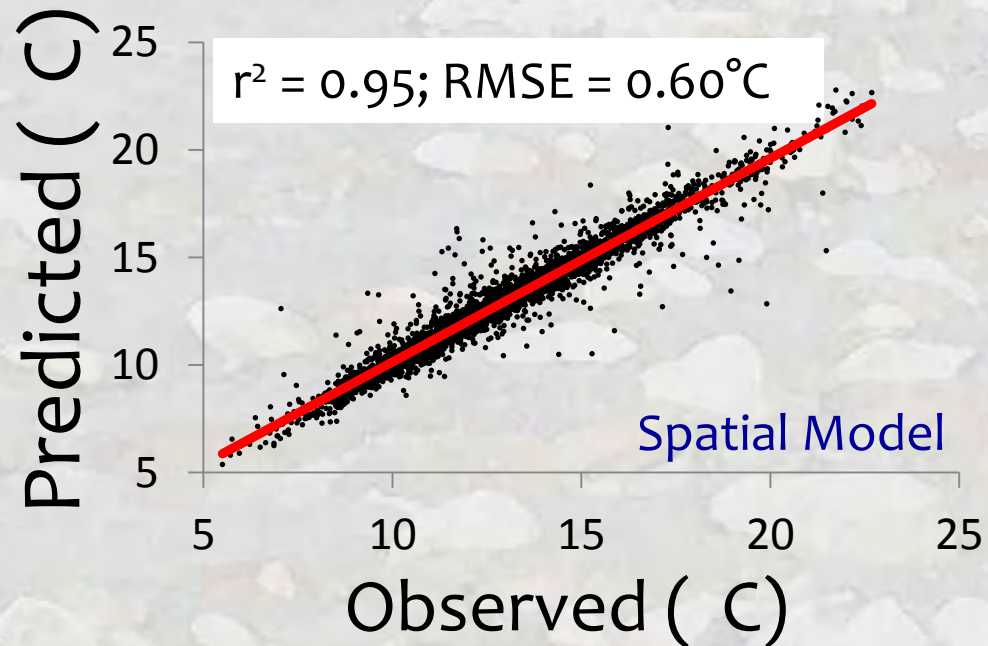
1. Elevation (m)
2. Canopy (%)
3. Stream slope (%)
4. Ave Precipitation (mm)
5. Latitude (km)
6. Lakes upstream (%)
7. Baseflow Index
8. Watershed size (km<sup>2</sup>)
9. Discharge (m<sup>3</sup>/s)
10. Air Temperature (°C)

**USGS gage data**

**RegCM3 NCEP reanalysis**

**Hostetler et al. 2011**

## Mean August Temperature



**16,000 stream kilometers**

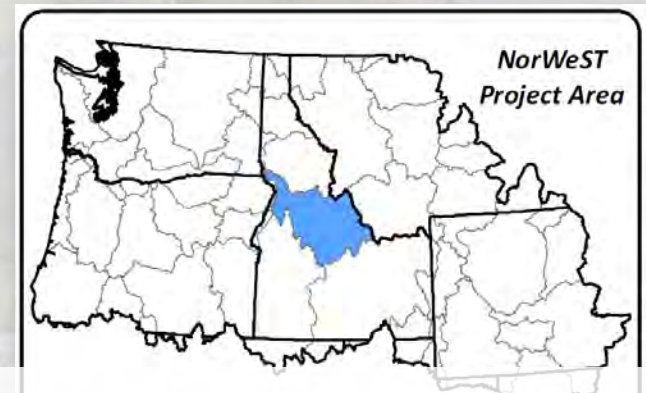
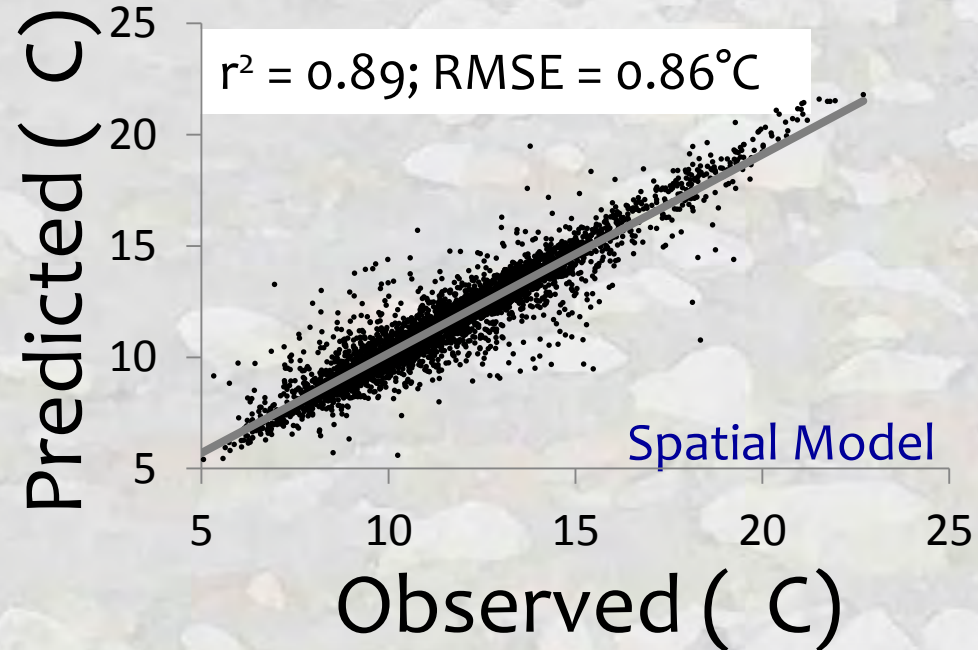
# Salmon River Temperature Model

**n = 4,401**

## 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. Discharge (m<sup>3</sup>/s)  
**USGS gage data**
10. Air Temperature (°C)  
**RegCM3 NCEP reanalysis**  
**Hostetler et al. 2011**

## Mean August Temperature



**21,000 stream kilometers**



# SpoKoot River Temp Model

**n = 5,482**

## 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. Discharge (m<sup>3</sup>/s)

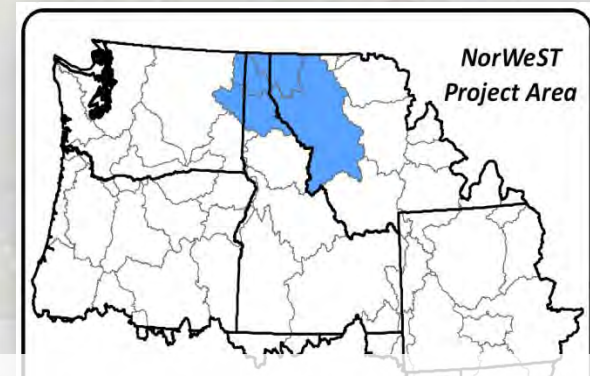
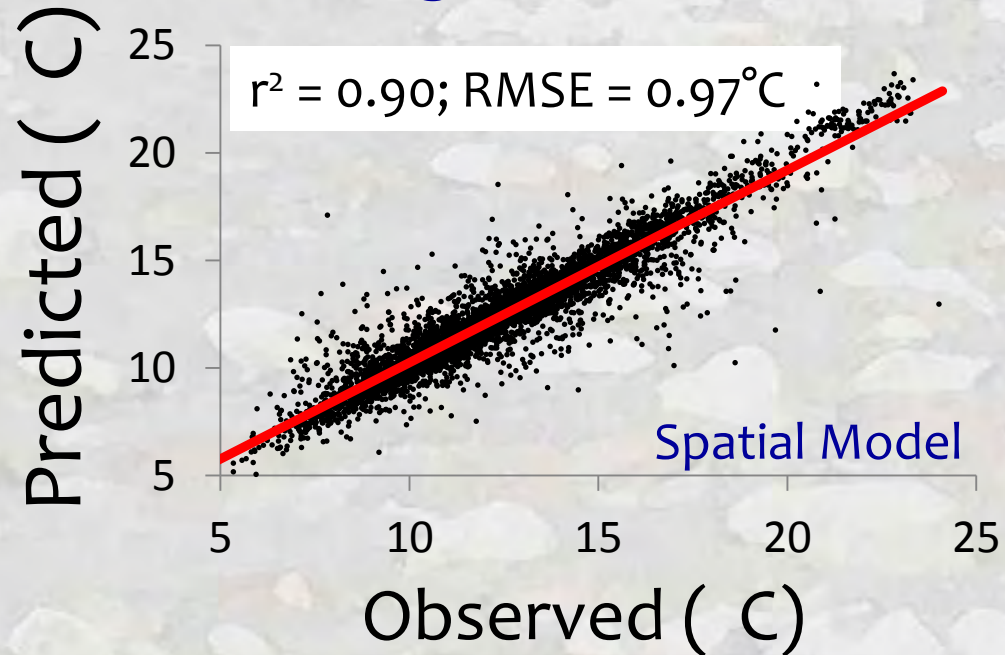
**USGS gage data**

10. Air Temperature (°C)

**RegCM3 NCEP reanalysis**

**Hostetler et al. 2011**

## Mean August Temperature



**55,000 stream kilometers**



# Upper Missouri River Temp Model

**n = 1,145**

## 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. Discharge (m<sup>3</sup>/s)

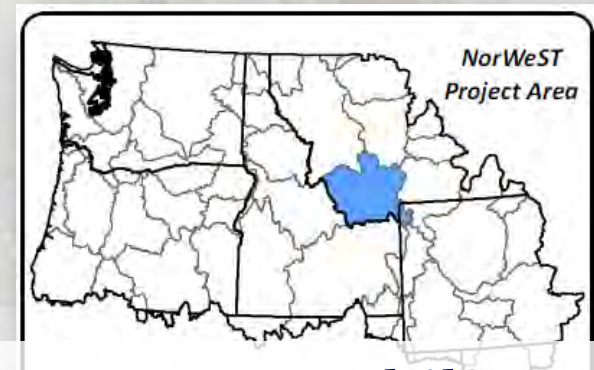
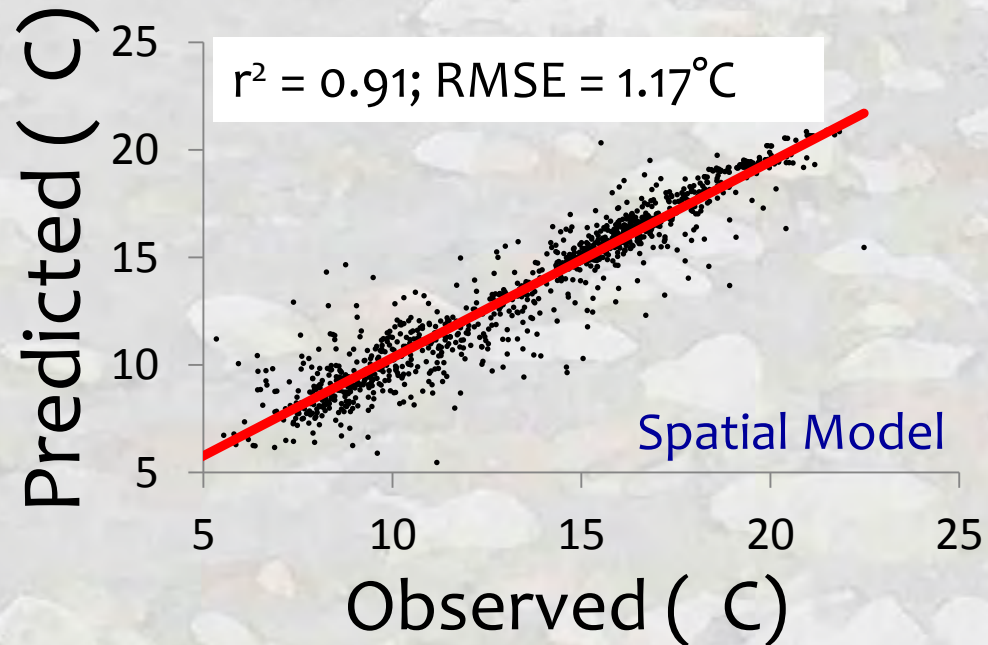
**USGS gage data**

10. Air Temperature (°C)

**RegCM3 NCEP reanalysis**

**Hostetler et al. 2011**

## Mean August Temperature

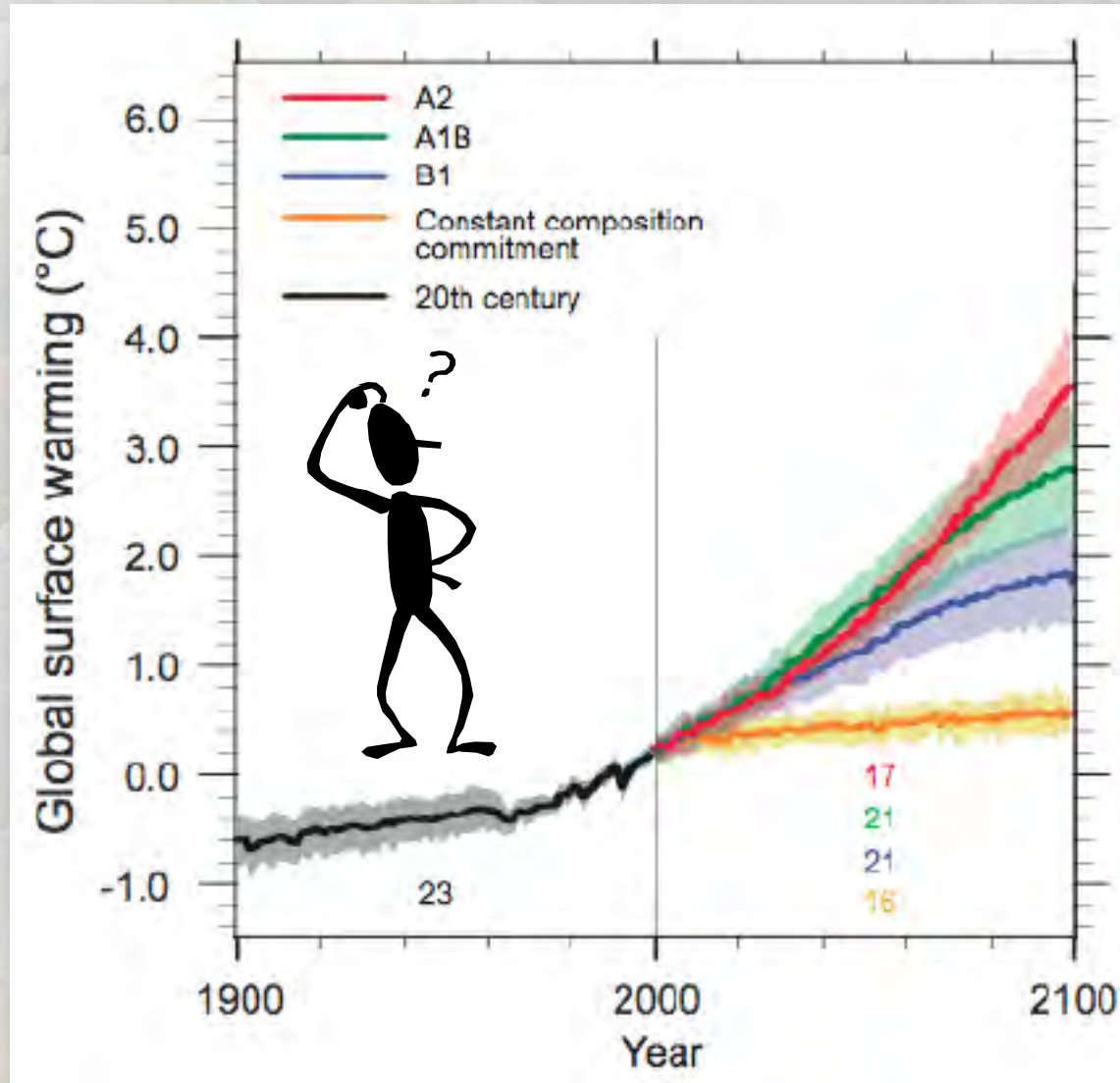


**25,000 stream kilometers**



# Models Enable Climate Scenario Mapping

Many possibilities exist...



Adjust...

- air temp
  - discharge
  - %canopy
- values to represent scenarios

# Climate Scenario Descriptions

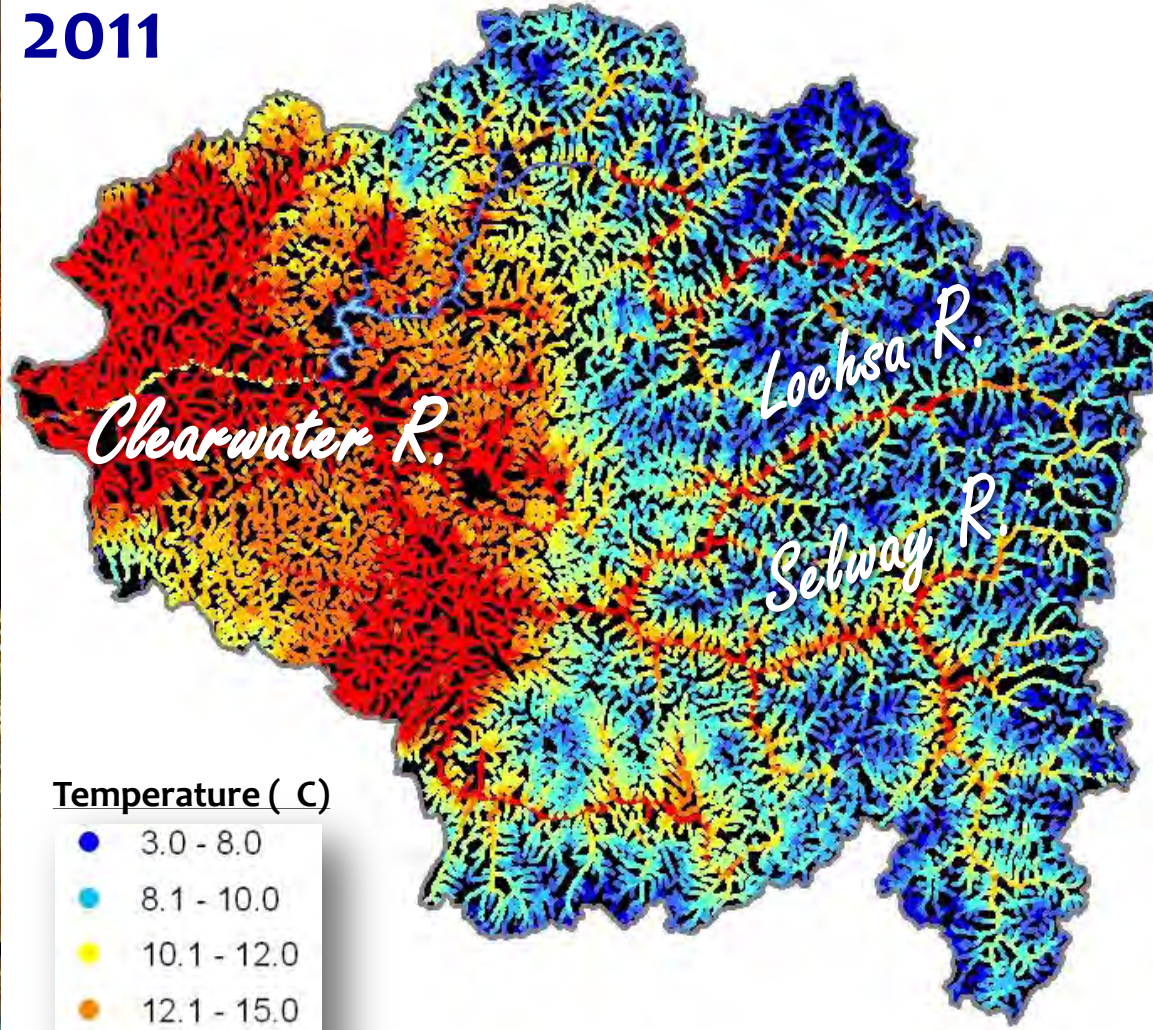
Scenario	Description
S1_93_11	Historical scenario representing 19 year average August mean stream temperatures for 1993-2011
S2_02_11	Historical scenario representing 10 year average August mean stream temperatures for 2002-2011
S3_1993	Historical scenario representing August mean stream temperatures for 1993
S4_1994	Historical scenario representing August mean stream temperatures for 1994
Etc...	
S21_2011	Historical scenario representing August mean stream temperatures for 2011
S22_025C	Future scenario adds 0.25°C to S1_93-11
S23_050C	Future scenario adds 0.50°C to S1_93-11
Etc...	
S33_300C	Future scenario adds 3.00°C to S1_93-11
S34_PredSE	Standard errors of stream temperature predictions



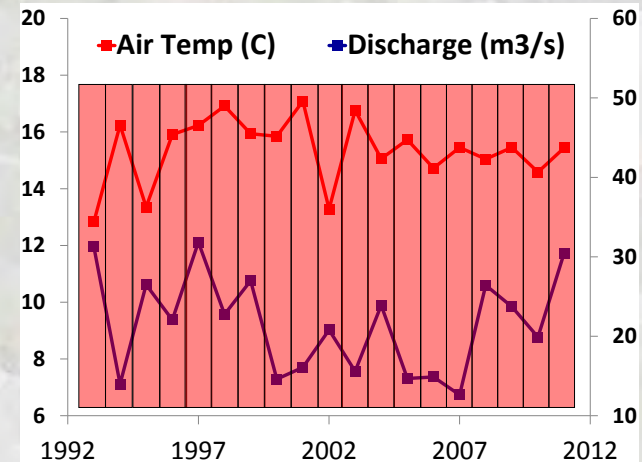
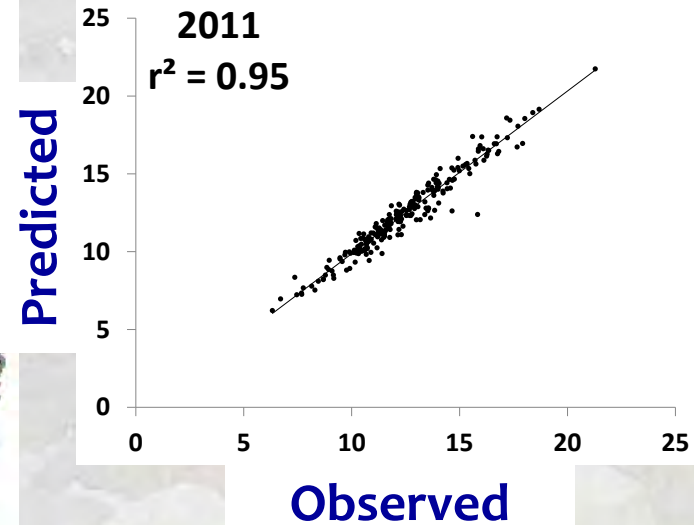
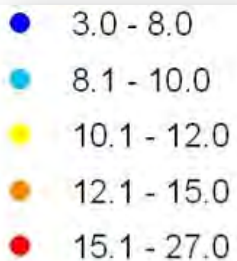
# Historical Year Sequence (1993-2011)

## Mean August Temperature - Clearwater Basin

2011



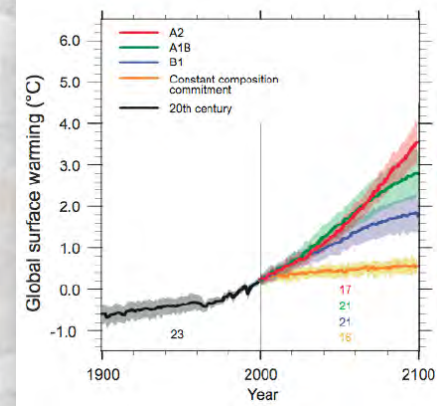
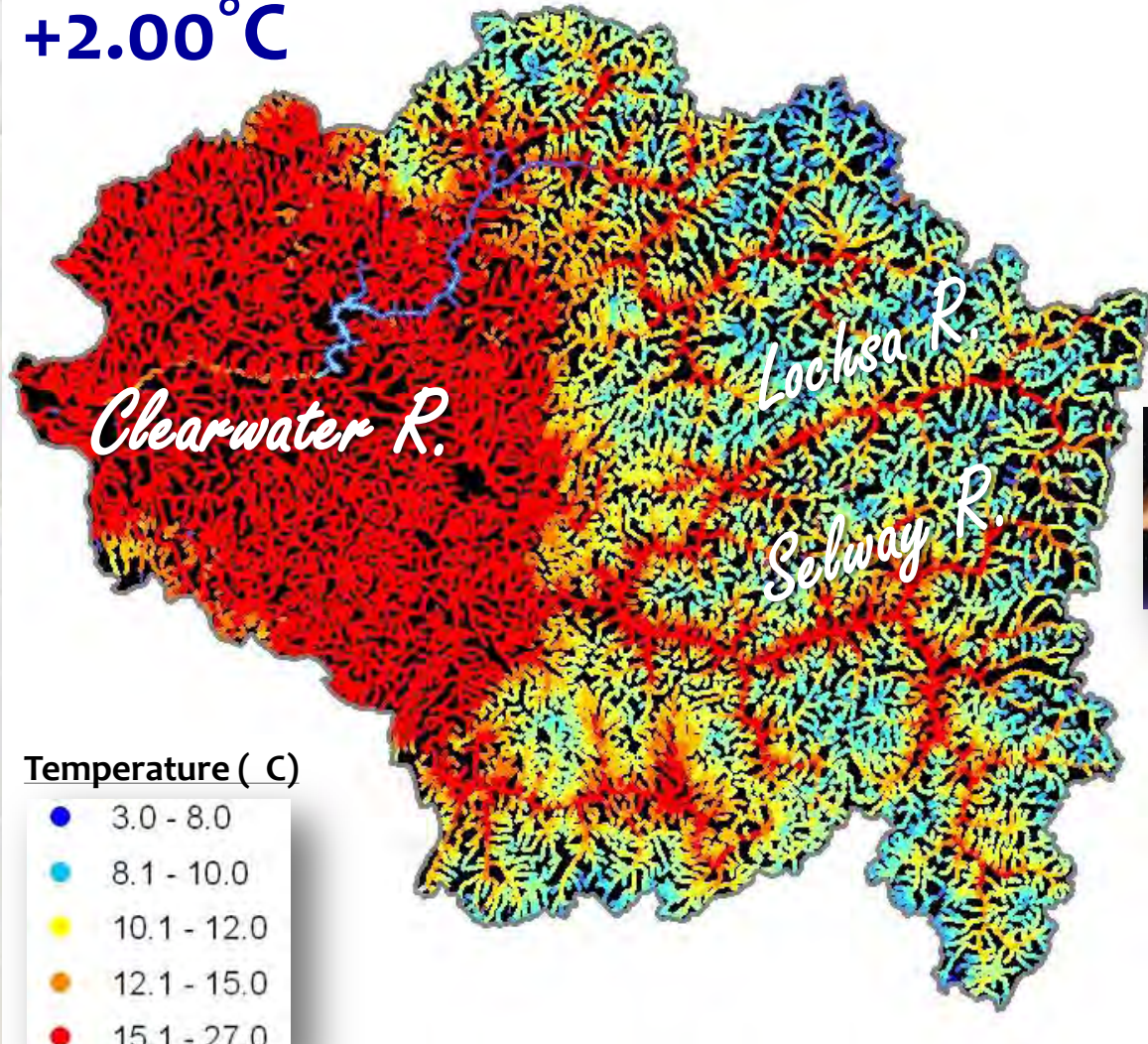
Temperature ( C )



# Future Scenarios (S1, S25, S29)

1993-2011, +1.0°C, +2.0°C

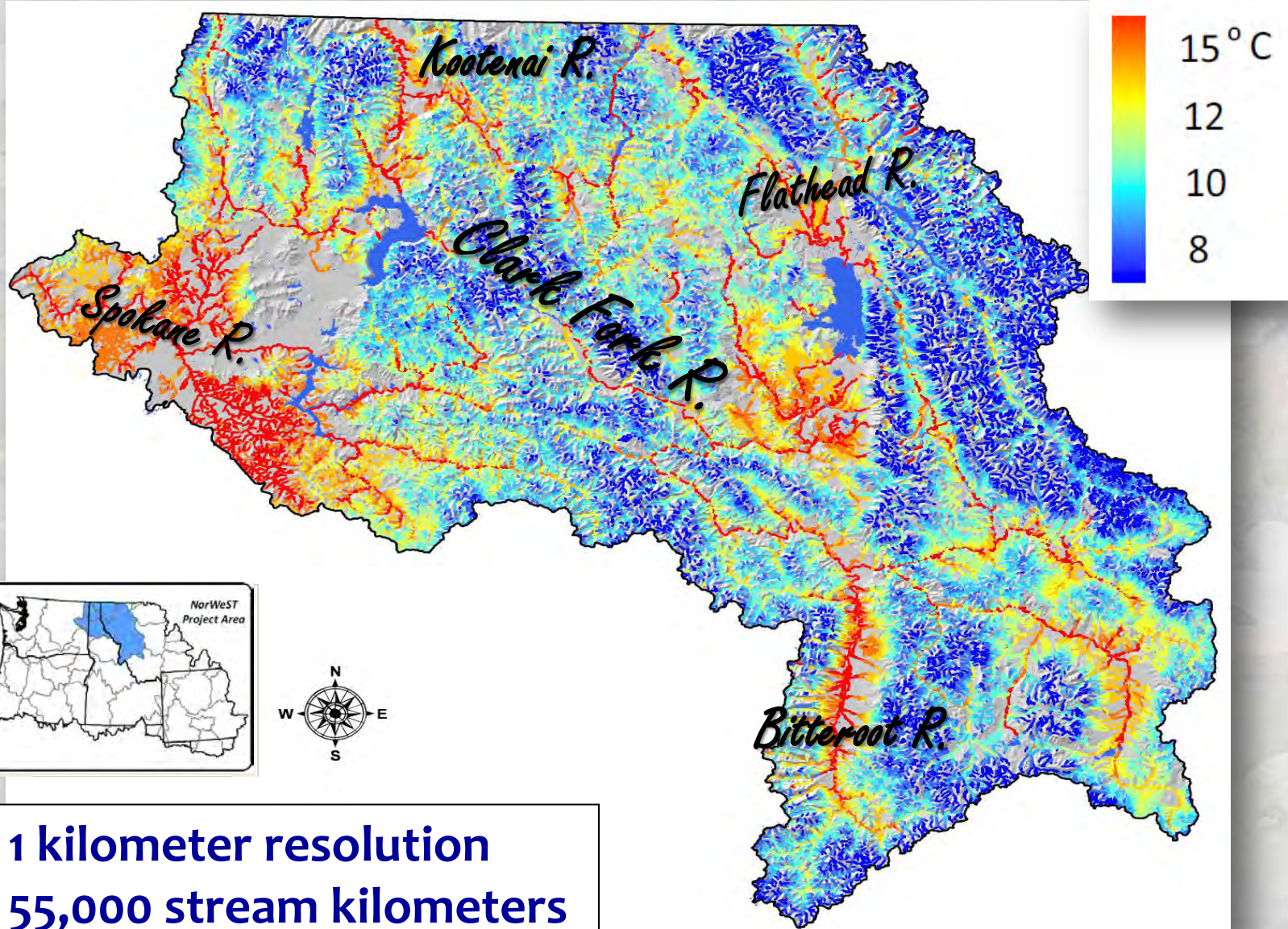
+2.00°C





# Historic Scenario: SpoKoot Unit (S1\_93-11)

1993-2011 mean August stream temperatures

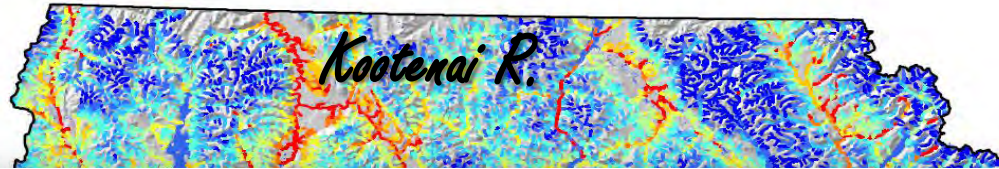


1 kilometer resolution  
55,000 stream kilometers



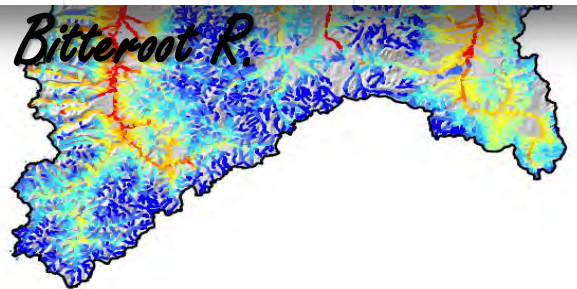
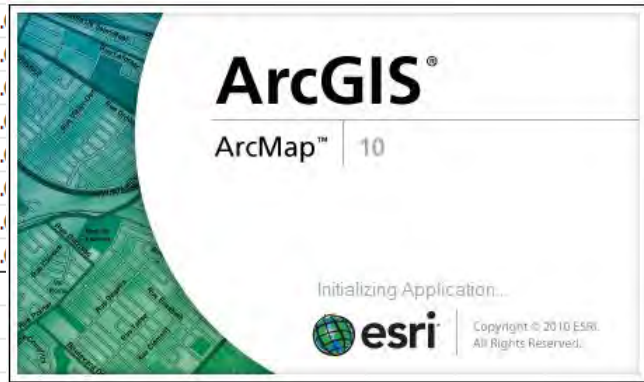
# Historic Scenario: SpoKoot Unit (S1\_93-11)

## 1993-2011 mean August stream temperatures



C	D	E	F	G	H	I	J	K	L	M
CANOPY	SLOPE	PRECIP	CUMDRAINAGE	COORD	NLCD11PC	NLCD12PC	BFI	Air_August	Flow_August	Stream_August
2.82	0.08857	299.6256	19.833	1623663.32	0	0	79	14.02	35.71	12.0812903
2.82	0.08857	299.6256	19.833	1623663.32	0	0	79	13.20	40.52	12.333771
2.82	0.08857	299.6256	19.833	1623663.32	0	0	79	13.00	38.99	11.4041581
12.23	0.03514	242.42	69.271	1620504.73	0.012	0	80	15.84	18.47	12.2216452
12.23										11.0053548
12.23										12.7445484
12.23										11.9685161
12.23										10.9931936
12.23										11.3862545
12.23										11.4452903
12.23										11.5266484
12.23										10.7834677
67.2										
62.89	0.12123	1040.365	3.544	1517651.14						
19.84	0.1333	1107.499	3.312	1516970.64						
61.45	0.1333	1107.499	3.312	1517620.51						
42.49	0.10194	984.29	3.36	1516791.23	0	0	75	13.59	32.75	
52.92	0.10194	984.29	3.36	1517620.42	0	0	75	13.59	32.75	

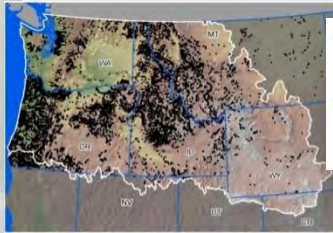
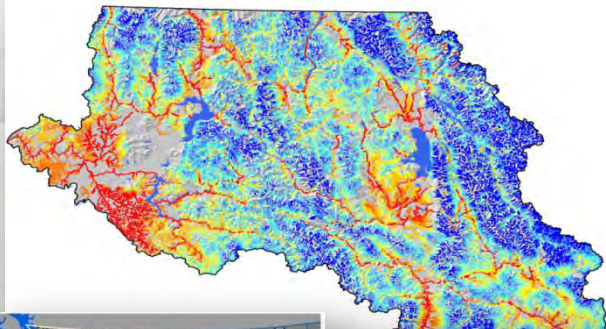
**Scenarios are GIS layers for easy display & query**



**1 kilometer resolution  
55,000 stream kilometers**

# Regionally Consistent Thermal Niche Definitions

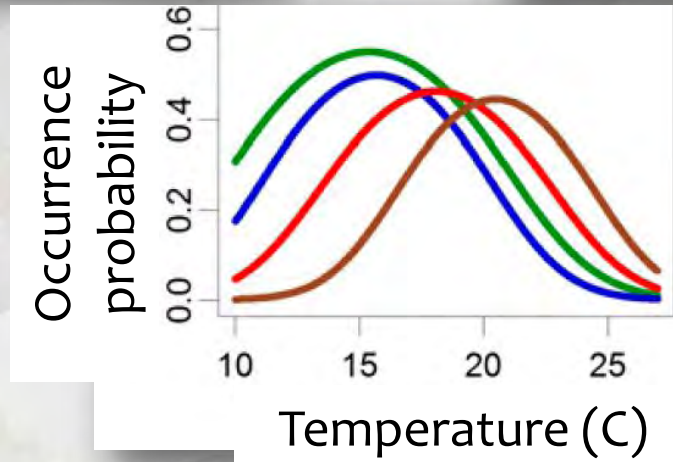
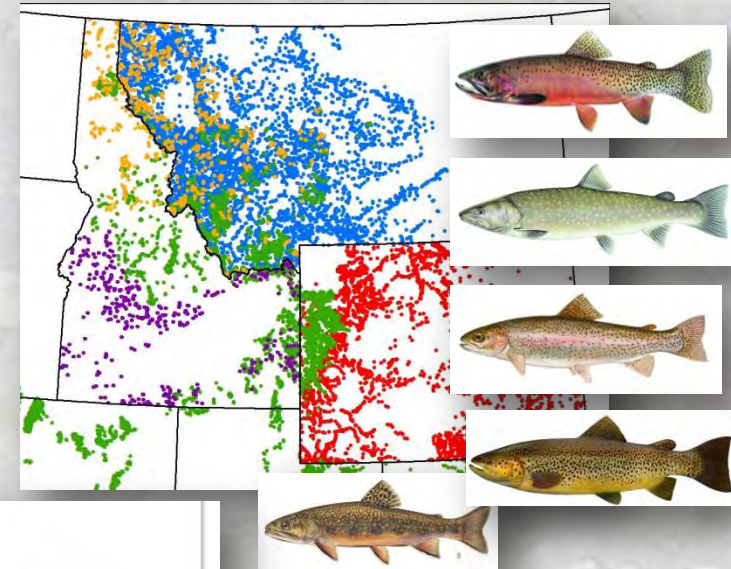
Stream temperature maps



**NorWeST**  
Stream Temp



Regional fish survey databases (n ~ 30,000)

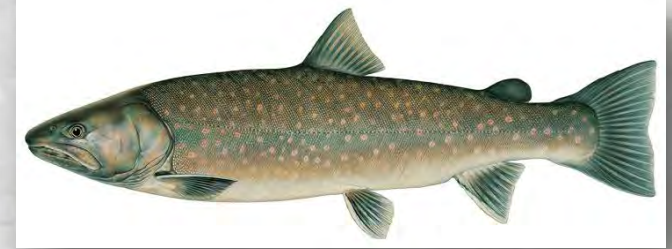
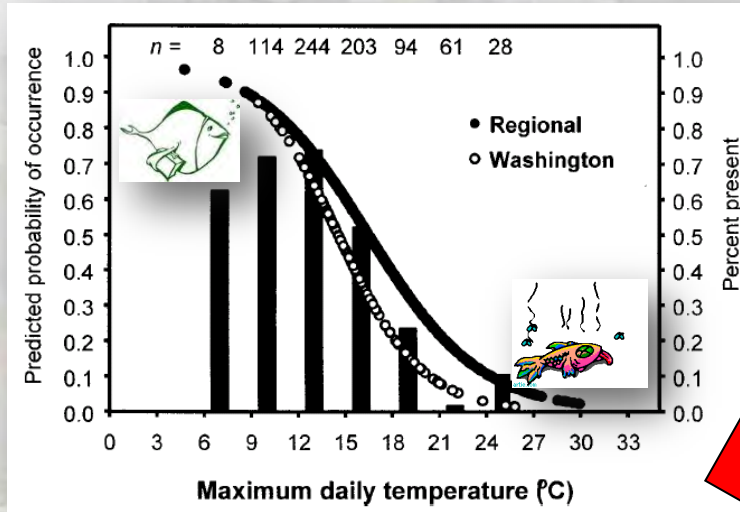


Wenger et al. 2011a. *PNAS* **108**:14175-14180

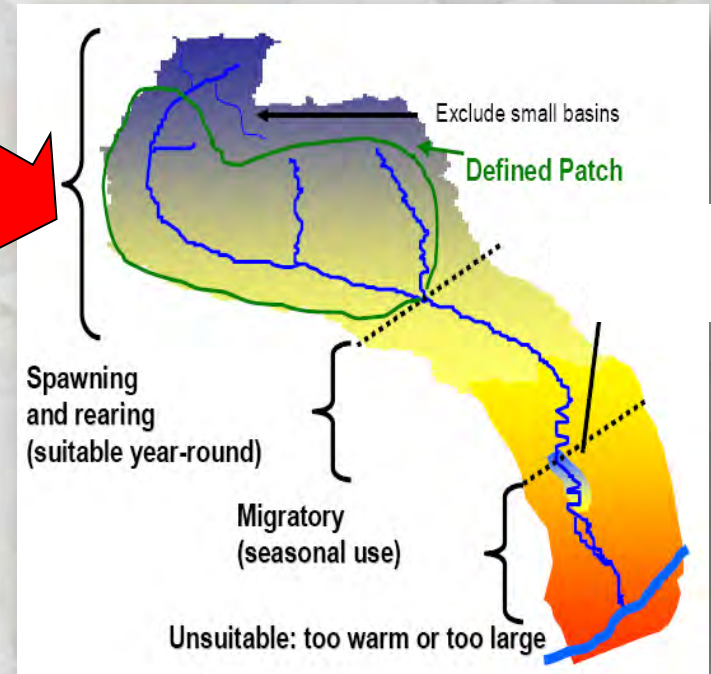
Wenger et al. 2011b. *CJFAS* **68**:988-1008; Wenger et al., *In Preparation*



# Bull Trout Thermal Criteria & Patches

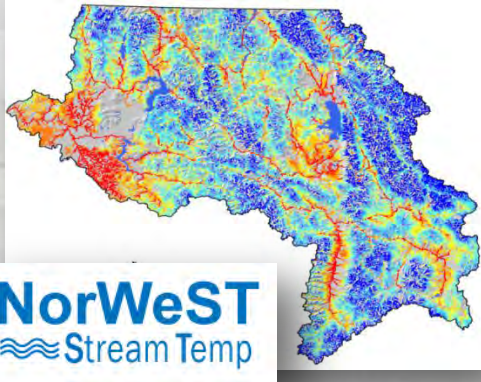


- Dunham et al. 2003
- Selong et al. 2001
- McMahan et al. 2007
- Mesa et al. 2012
- Many others...

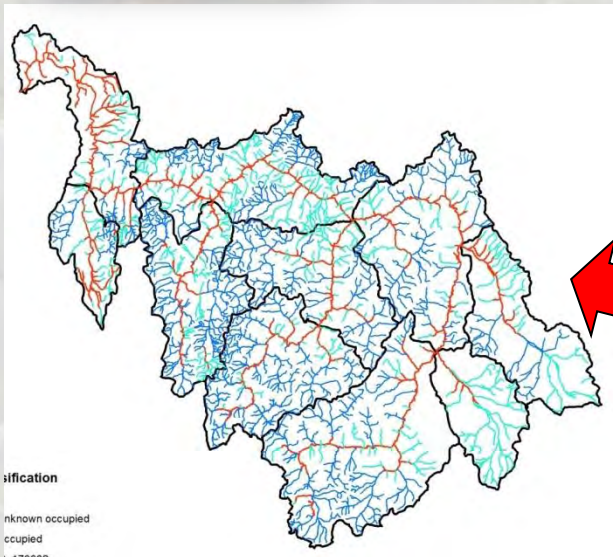
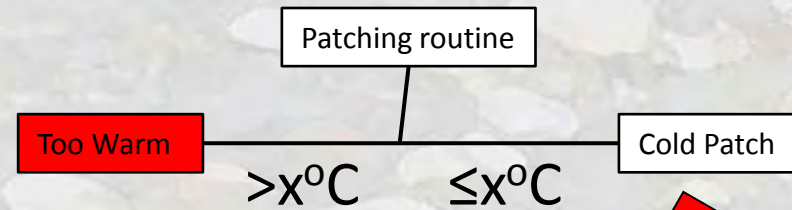


• Dunham et al. 2002

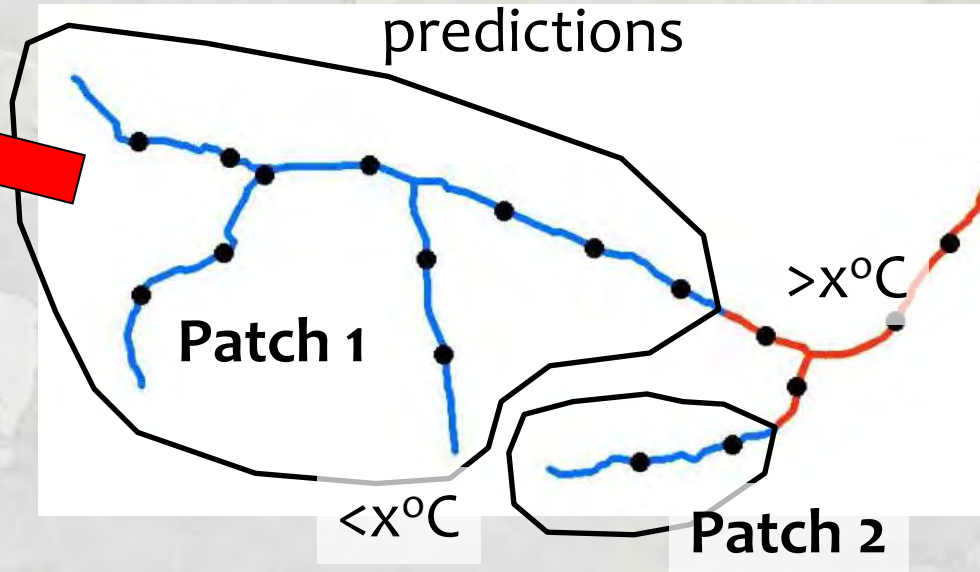
# Range-wide bull trout vulnerability assessment (Dunham and co.)



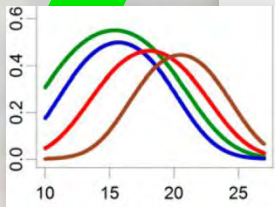
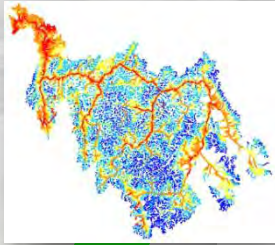
Computer algorithm delineates consistent set of patches based on thermal criteria



1 kilometer NorWeST predictions



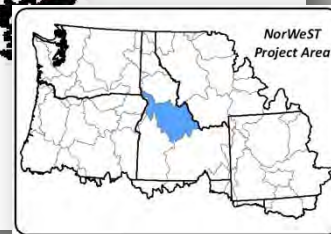
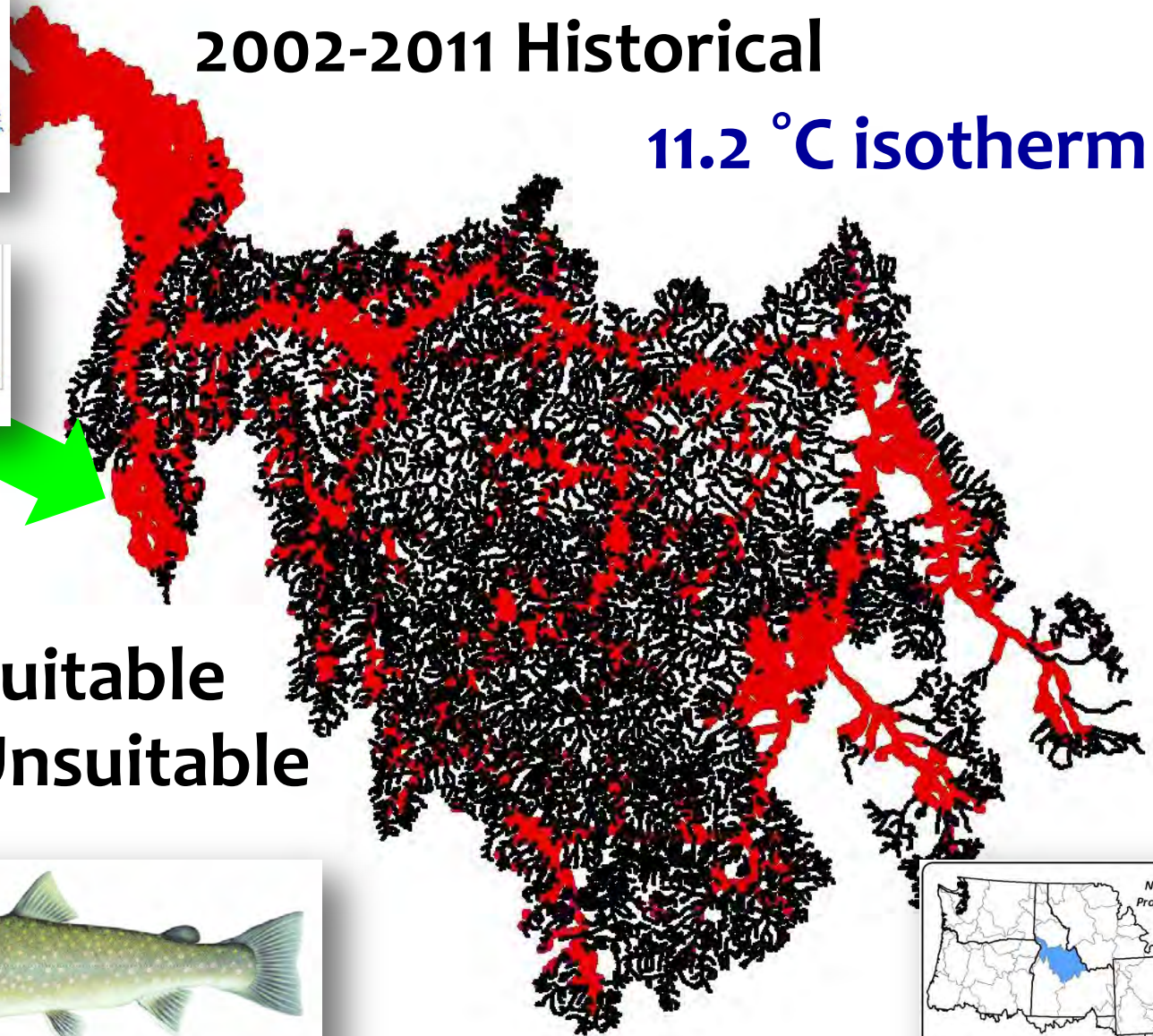
# Simple Salmon River Example



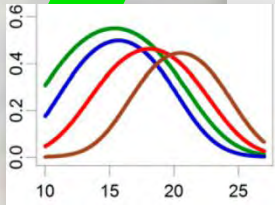
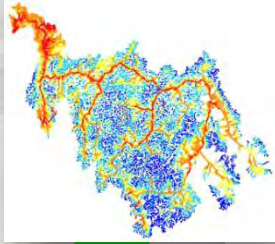
2002-2011 Historical

11.2 °C isotherm

■ Suitable  
■ Unsuitable



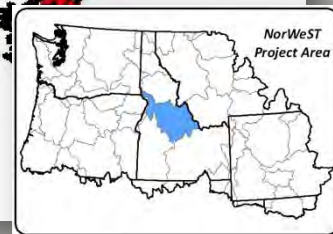
# Simple Salmon River Example



+1°C Stream Temperature

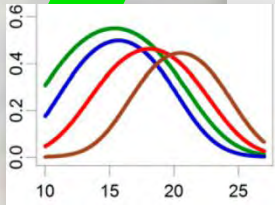
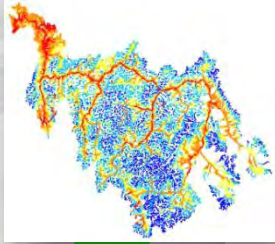
11.2 °C isotherm

■ Suitable  
■ Unsuitable





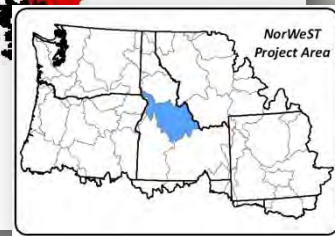
# Simple Salmon River Example



+2°C Stream Temperature

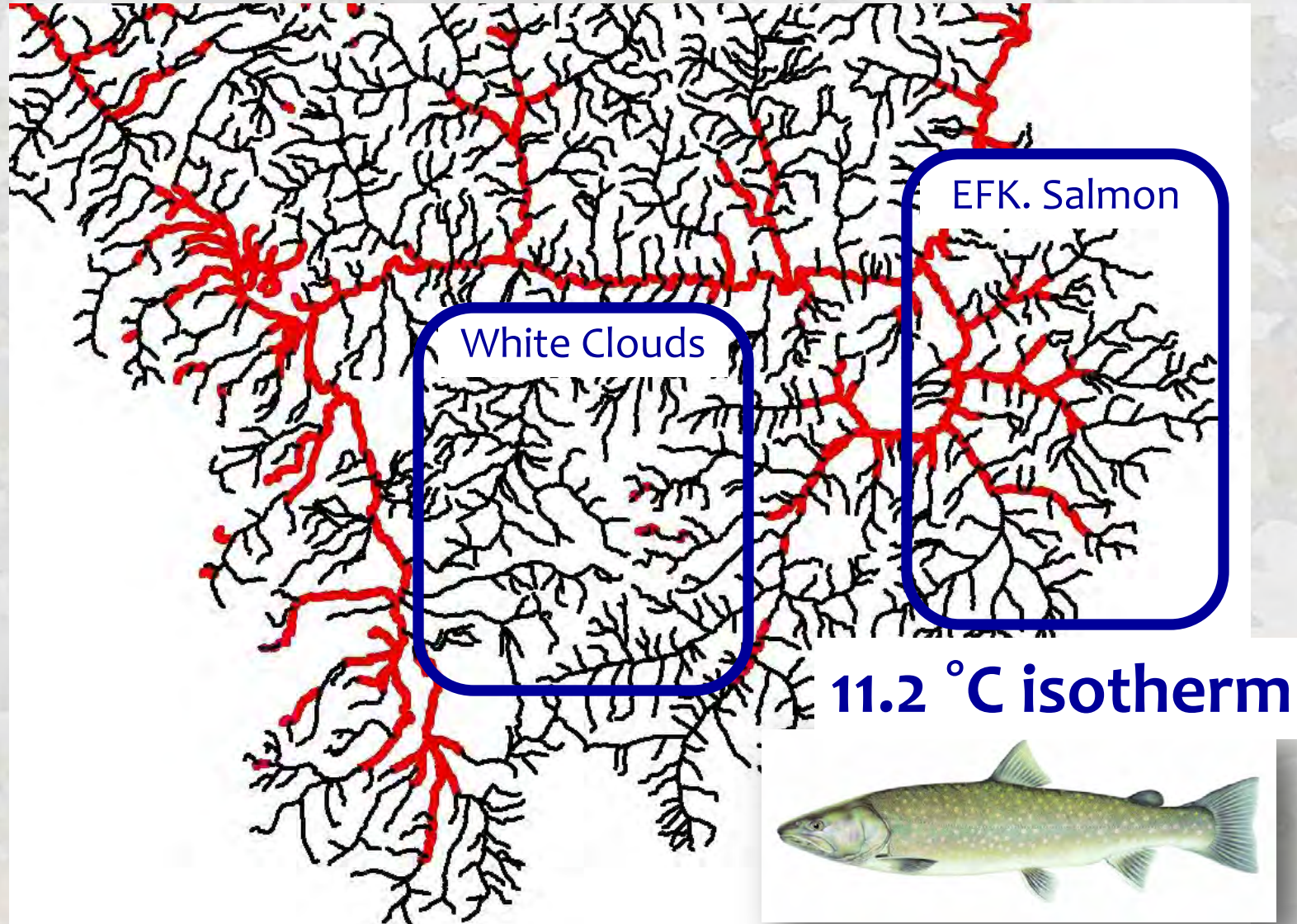
11.2 °C isotherm

■ Suitable  
■ Unsuitable



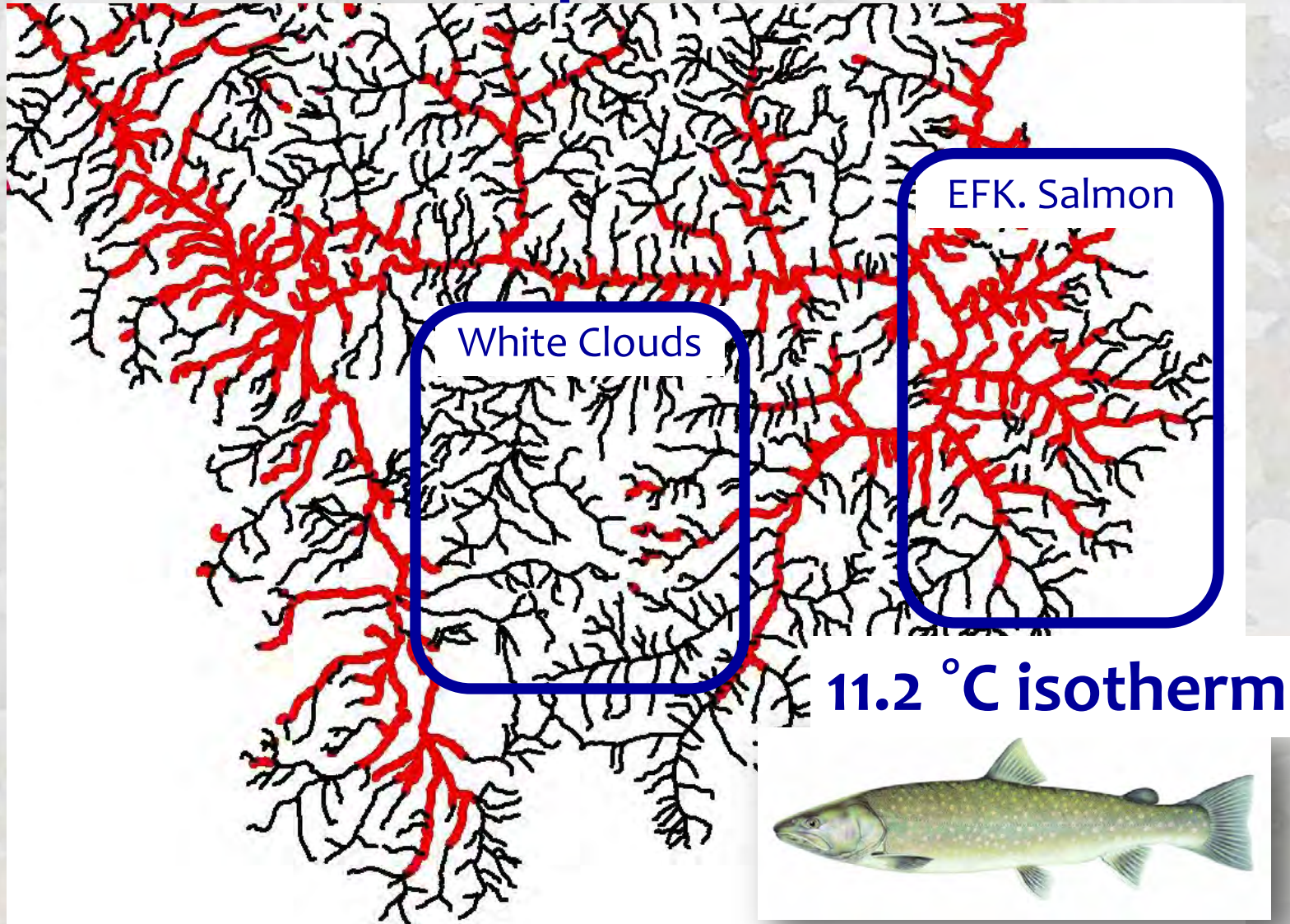
# Spatial Variation in Habitat Loss

## 2002-2011 historical scenario



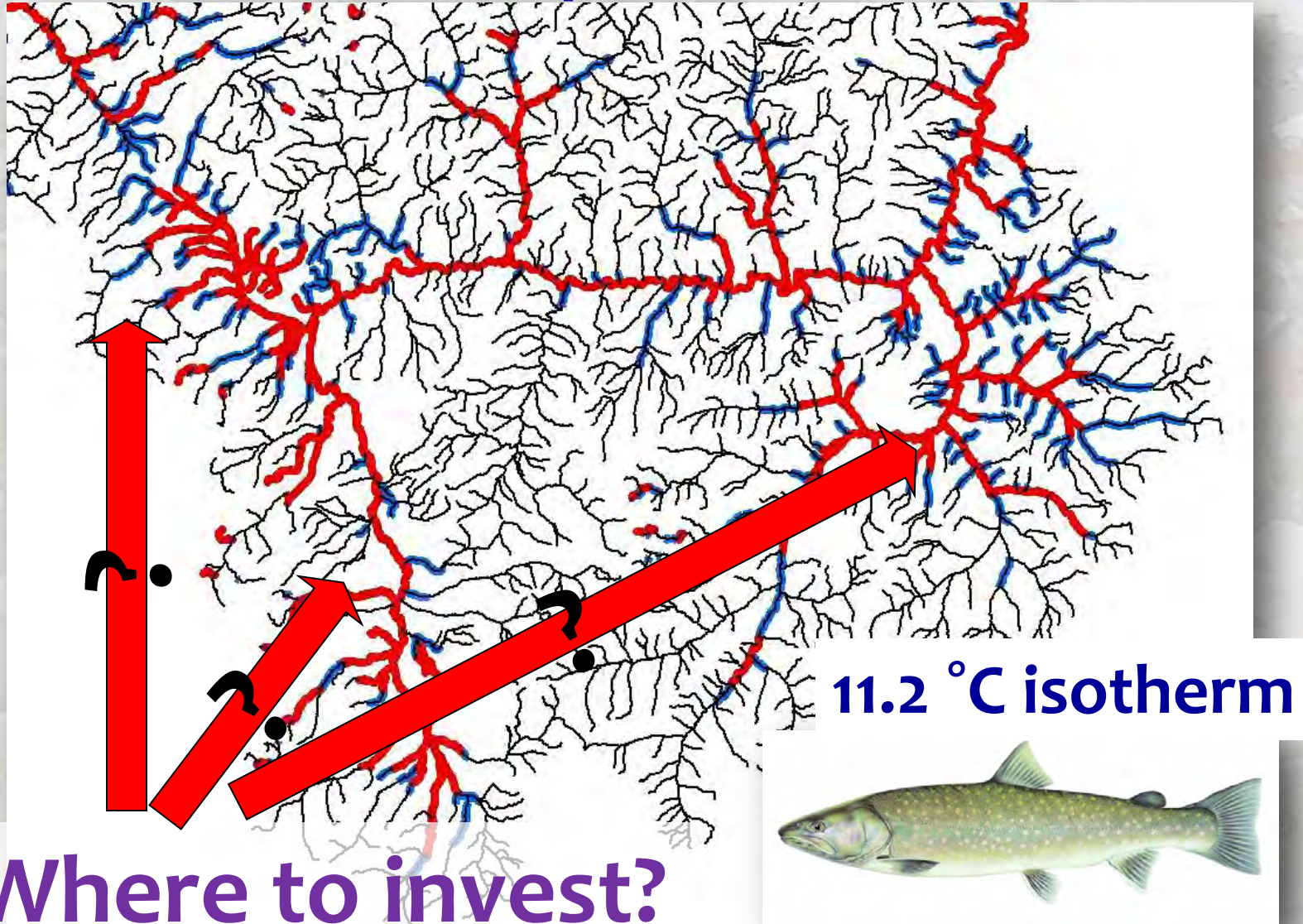
# Spatial Variation in Habitat Loss

+1°C stream temperature scenario



# Difference Map Shows Vulnerable Habitats

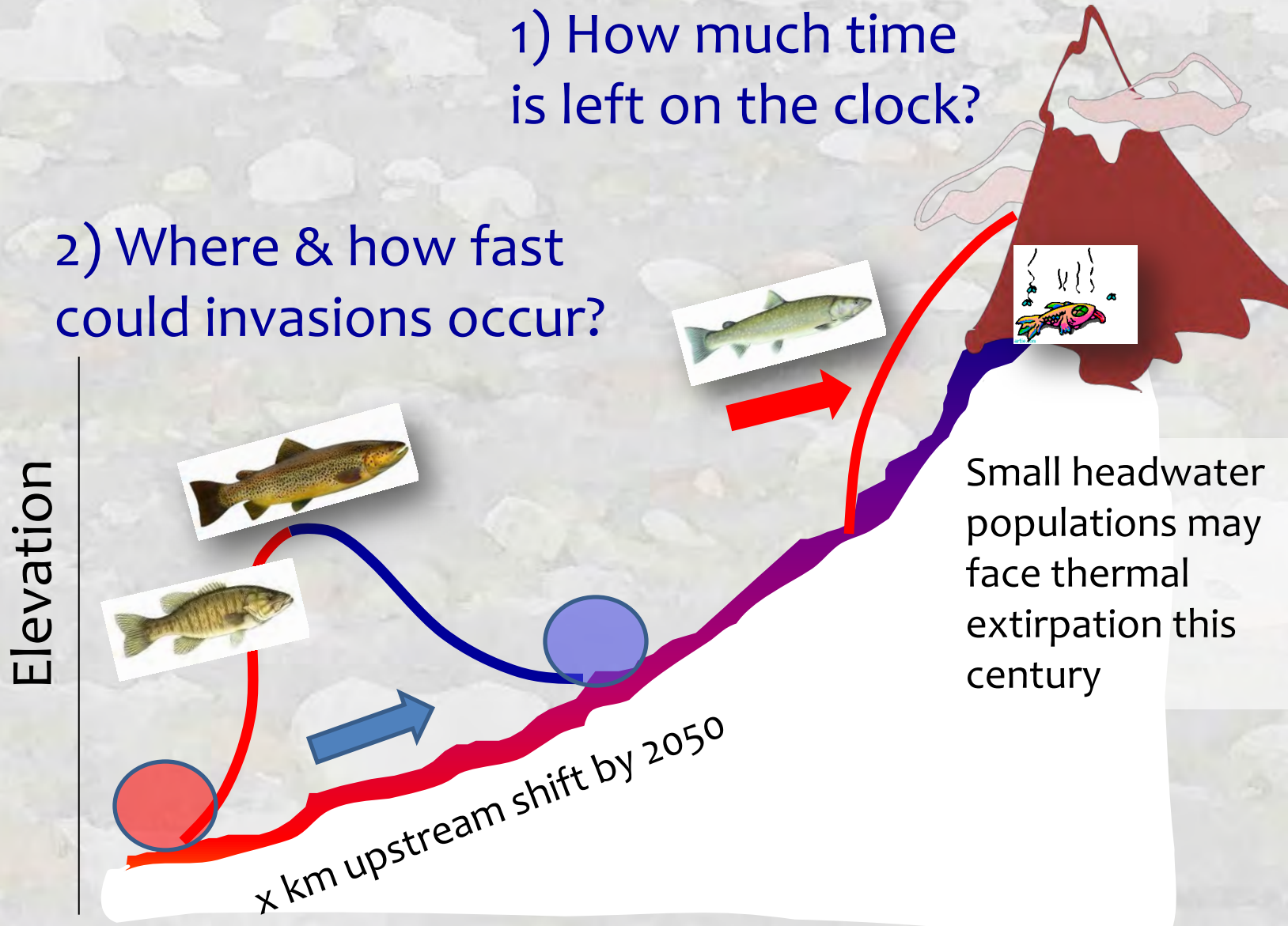
## +1°C stream temperature scenario



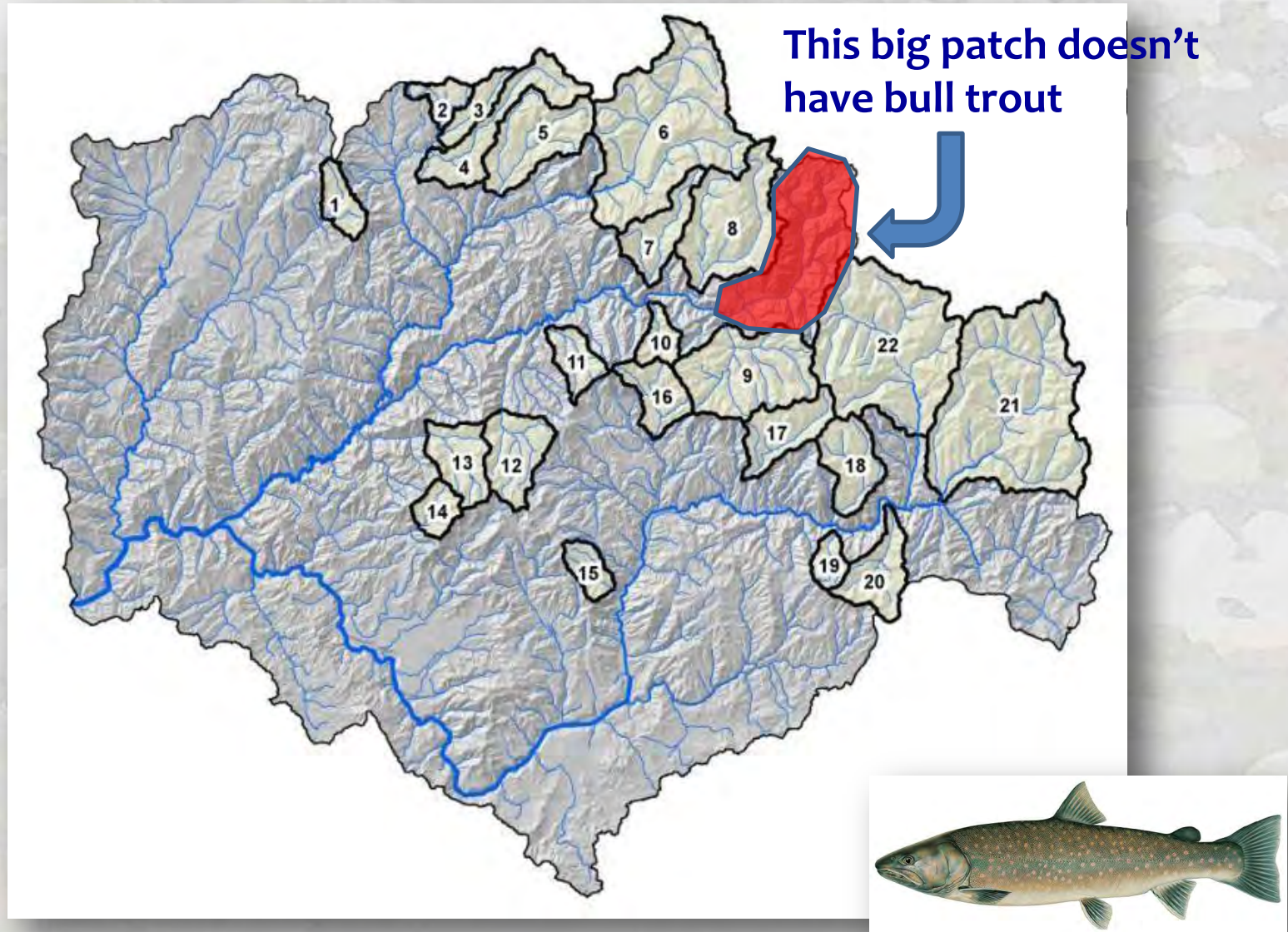
# Precise Information Regarding Potential Species Invasions & Population Extirpations

1) How much time is left on the clock?

2) Where & how fast could invasions occur?

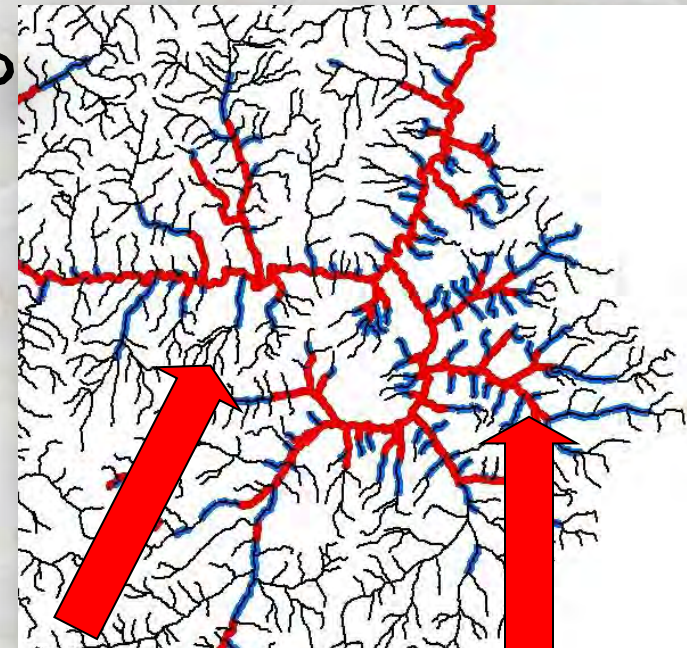
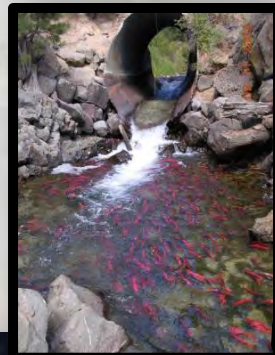


# Precise Targeting of Assisted Migrations & Reintroduction Efforts



# Climate-Smart Strategic Prioritization

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

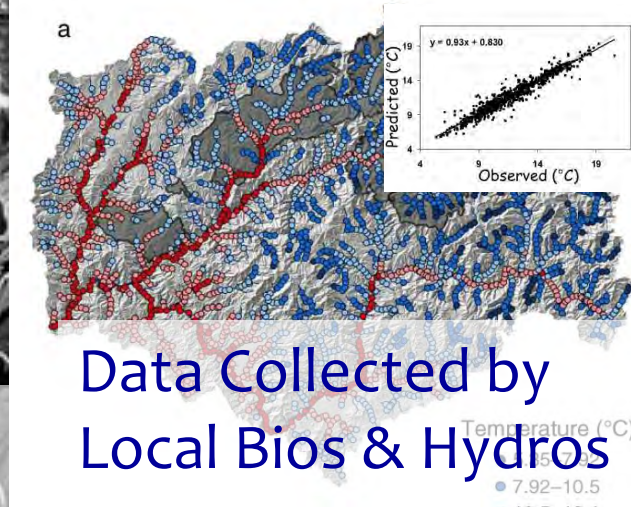
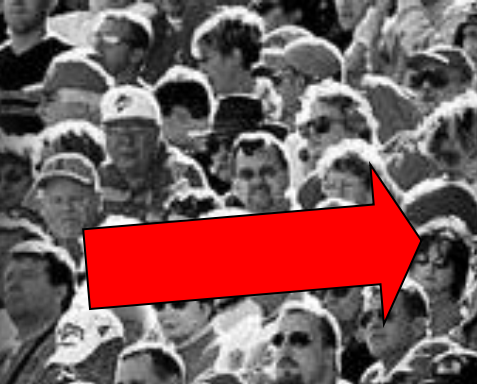
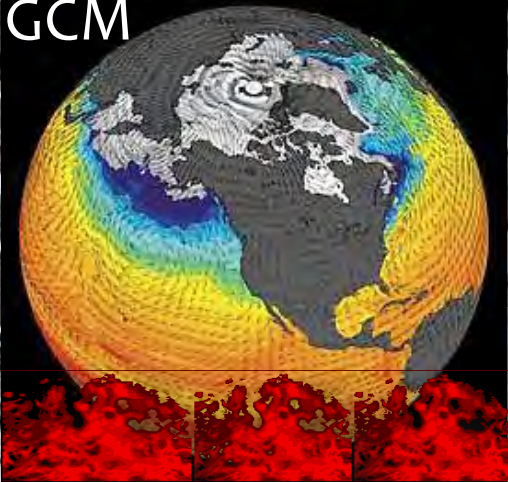


**High  
Priority**

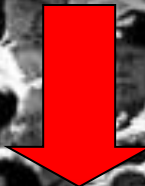
**Low  
Priority**

# NorWeST is a “Crowd-Sourced” Model Developed from Everyone’s Data

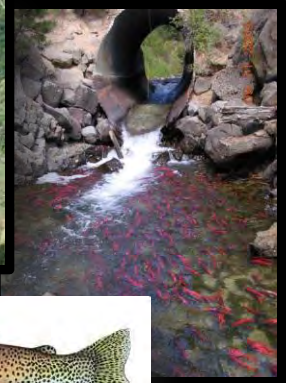
GCM



Coordinated Management Responses?



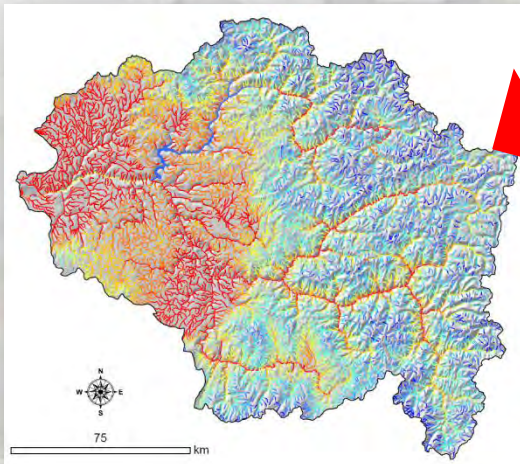
Management Decisions



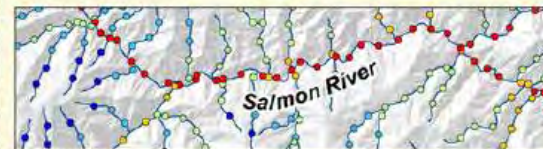


# Website Distributes Scenarios & Temperature Data as GIS Layers

1) GIS shapefiles of stream temperature scenarios

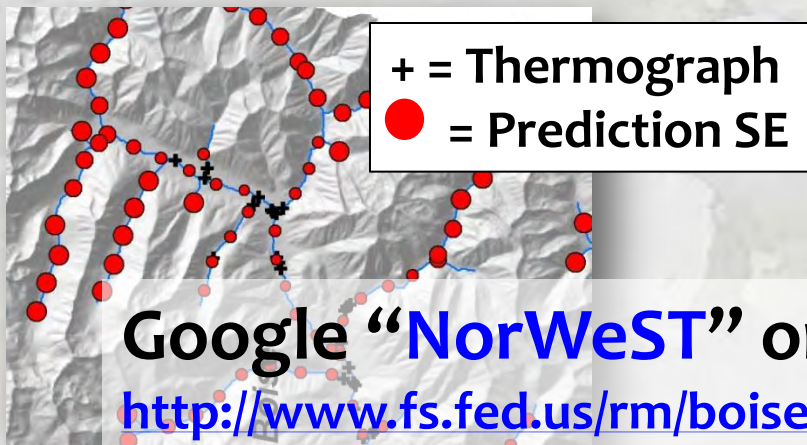


**NorWeST**  
Stream Temp

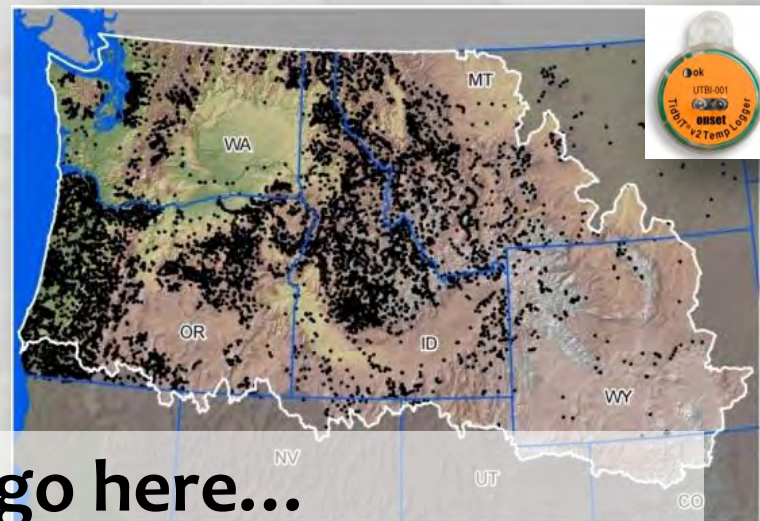


*Regional Database and Modeled Stream Temperatures*

2) GIS shapefiles of stream temperature model prediction precision



3) Temperature data summaries

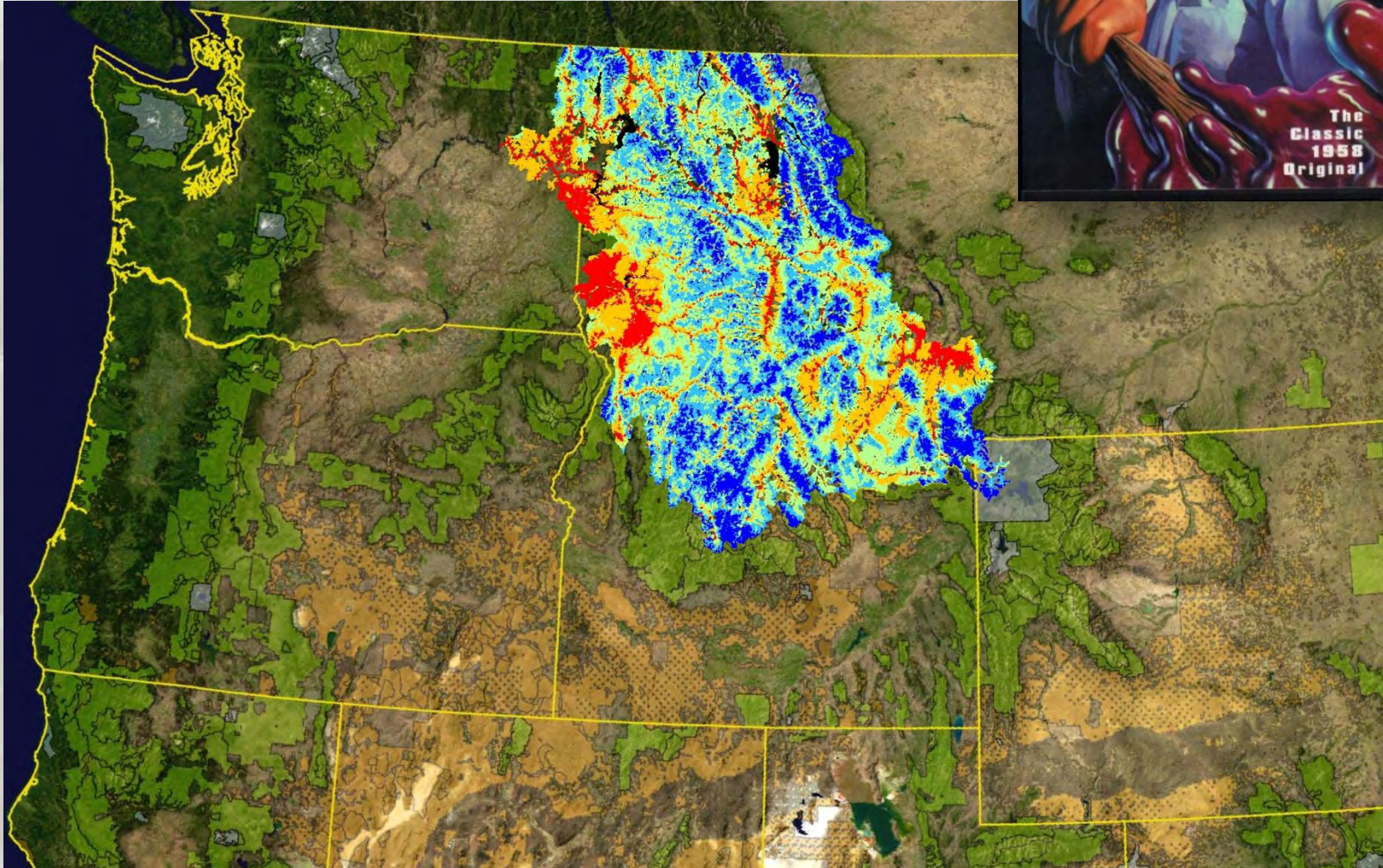
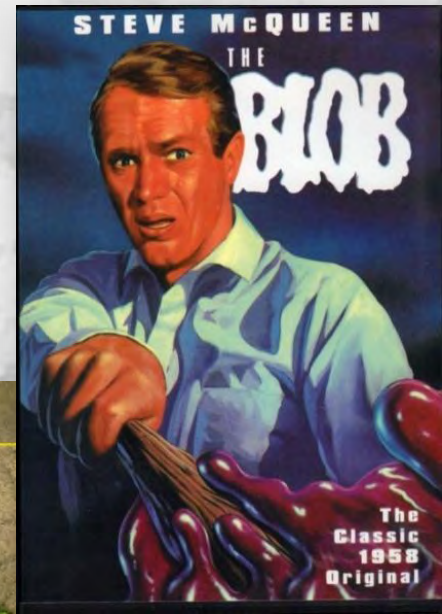


Google **"NorWeST"** or go here...

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

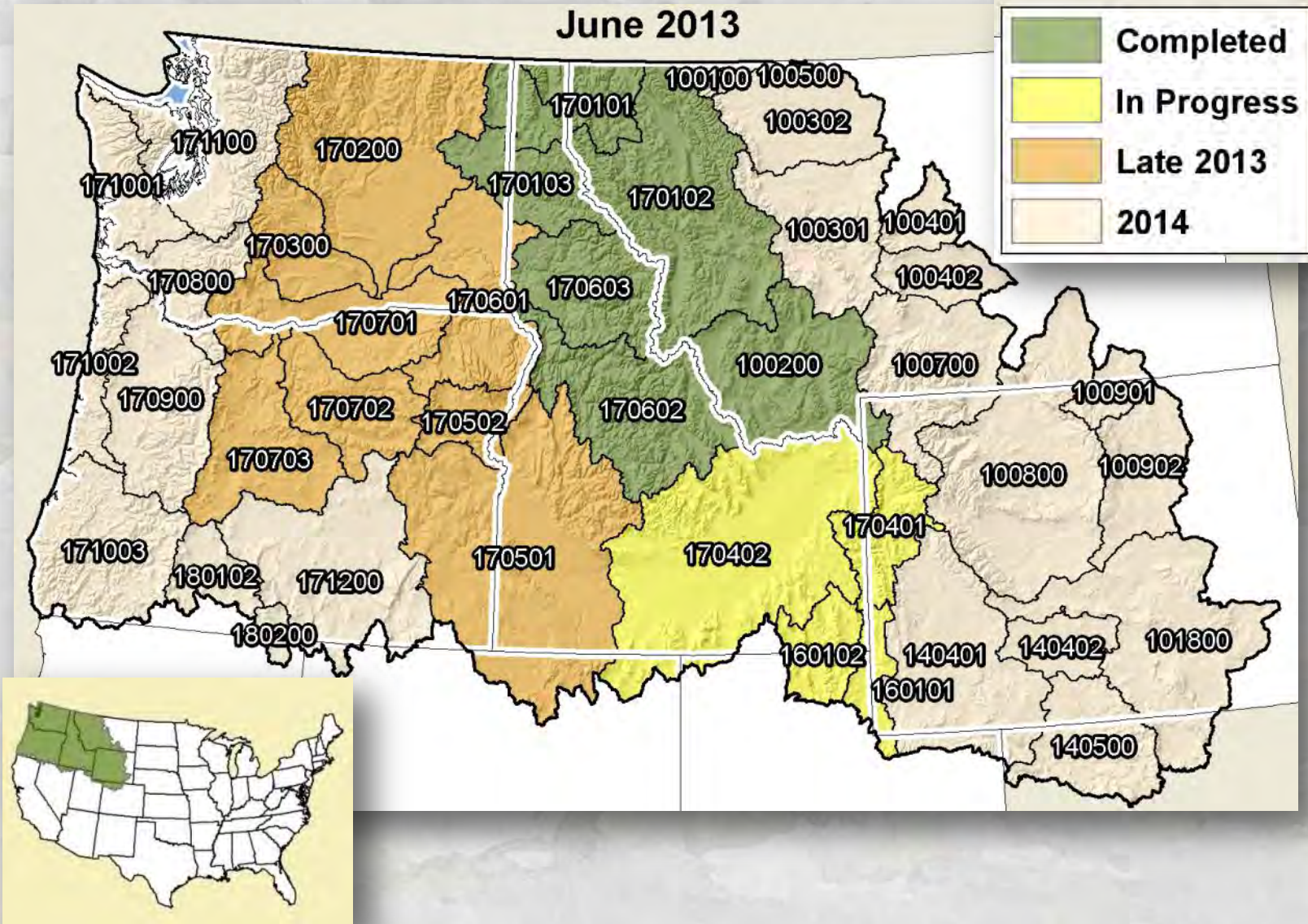
# The Blob is Growing...

- 15,515 summers of data swallowed
- 117,000 stream kilometers of thermal ooze mapped



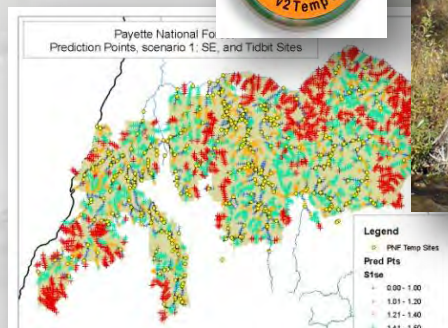
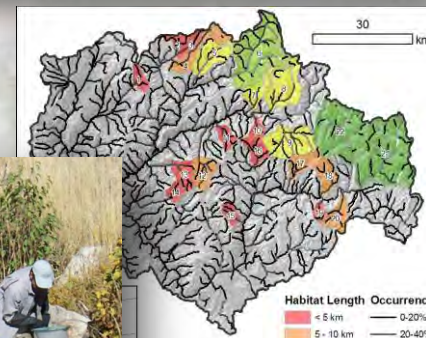
# NorWeST Schedule

June 2013



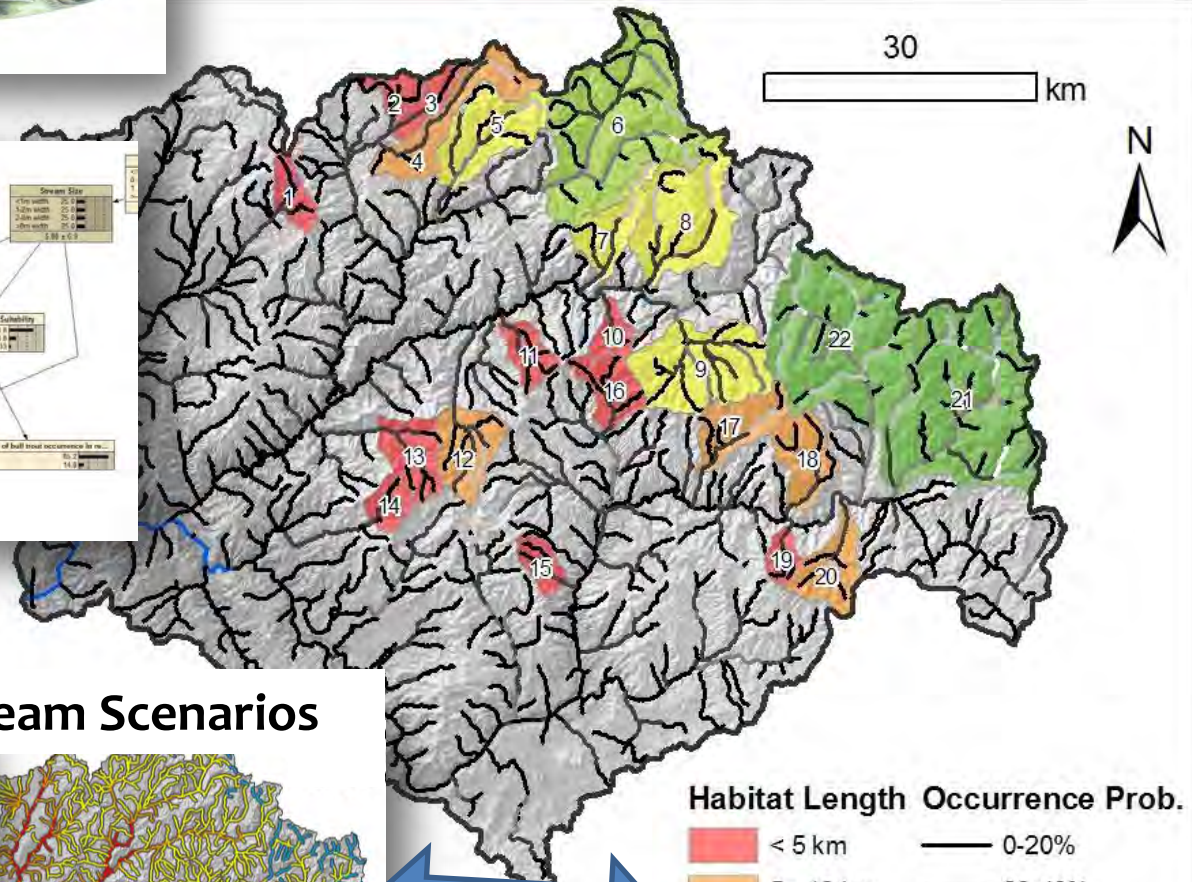
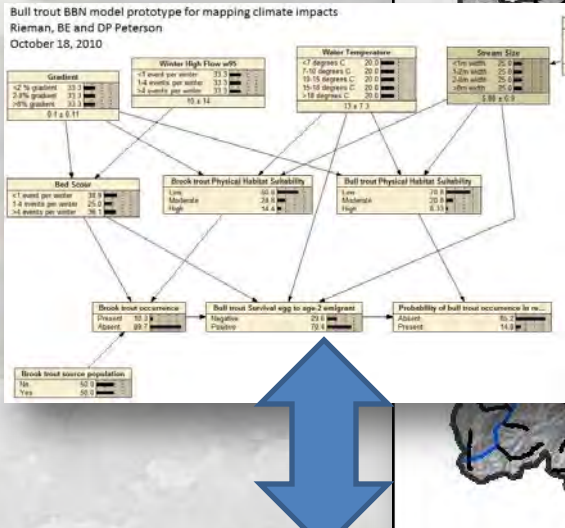
# NorWeST Facilitating Related Projects

- Regional bull trout climate vulnerability assessment (J. Dunham)
- Cutthroat & bull trout climate decision support tools (Peterson et al., 2013)
- Landscape-scale bull trout monitoring protocol (Isaak et al. 2009)
- Consistent thermal niche definitions & more accurate bioclimatic models for trout & nongame fishes (S. Wenger, In Prep.)
- Efficient stream temperature monitoring designs

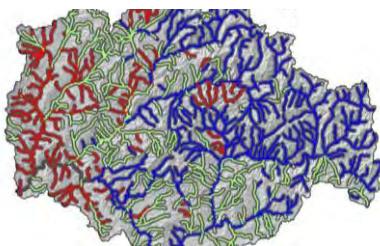


# Bull Trout Climate Decision Support Tool

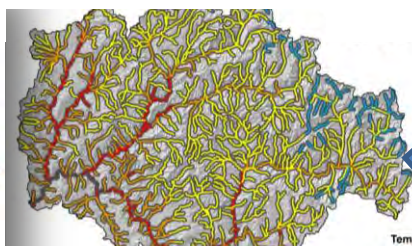
Tool runs on regionally consistent data layers



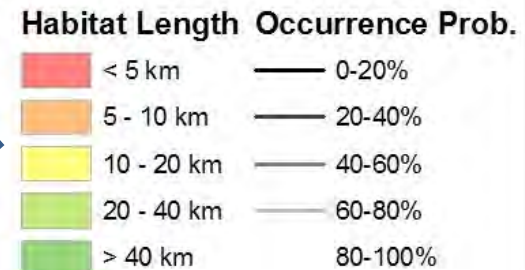
## Downscaled Stream Scenarios



Streamflow



Stream Temperature

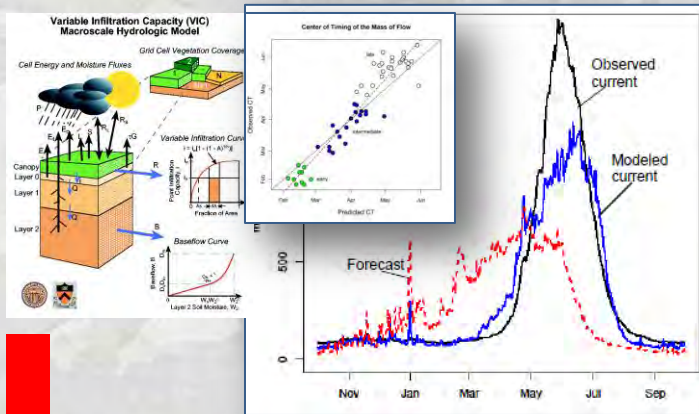


# VIC Streamflow Scenarios

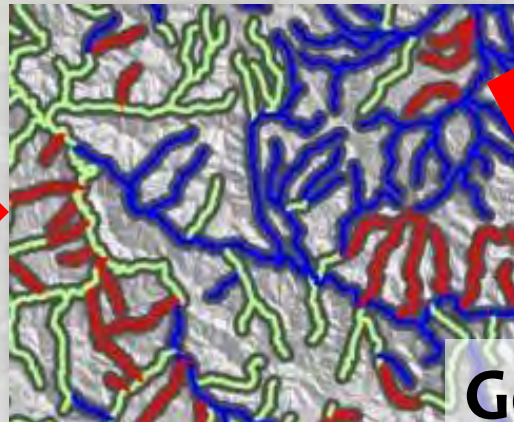
## Ecological Flow Metrics



A1B IPCC Scenarios  
for the western U.S.



NHD+ stream segment resolution



Google “Stream flow Metrics”

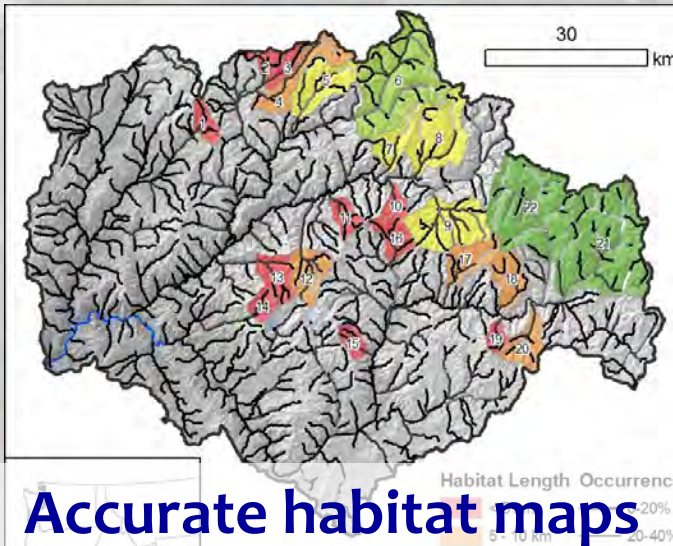
Website: [http://www.fs.fed.us/rm/boise/AWAE/projects/modeled\\_stream\\_flow\\_metrics.shtml](http://www.fs.fed.us/rm/boise/AWAE/projects/modeled_stream_flow_metrics.shtml)

Wenger et al. 2010. *Water Resources Research* 46, W09513



# Efficient Biological Monitoring

## Bull trout distributional status & trend



Accurate habitat maps  
from stream models

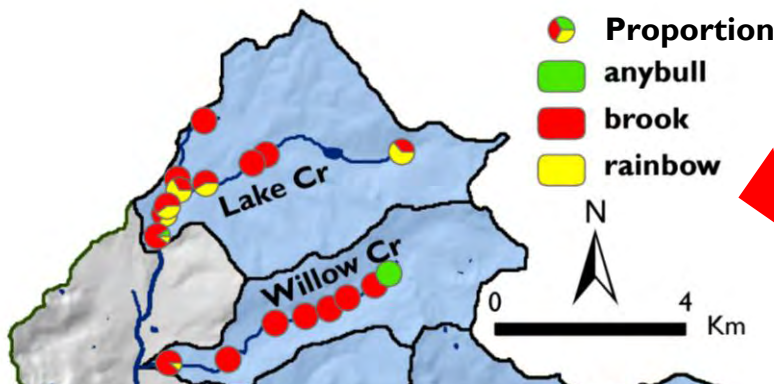
=

Map

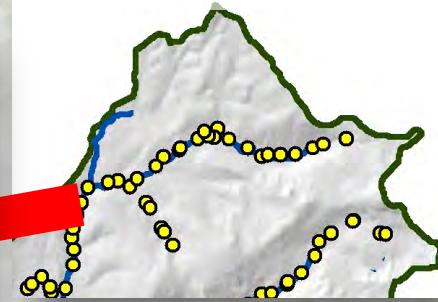


Probabilistic sample  
(i.e., EMAP GRTS)

Precise, representative sample

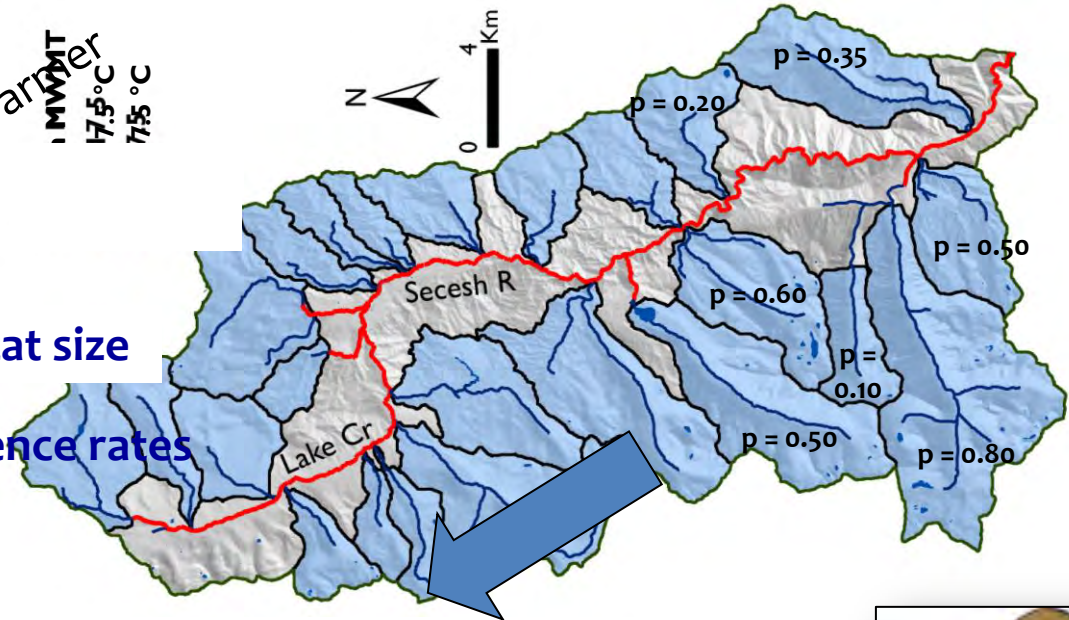
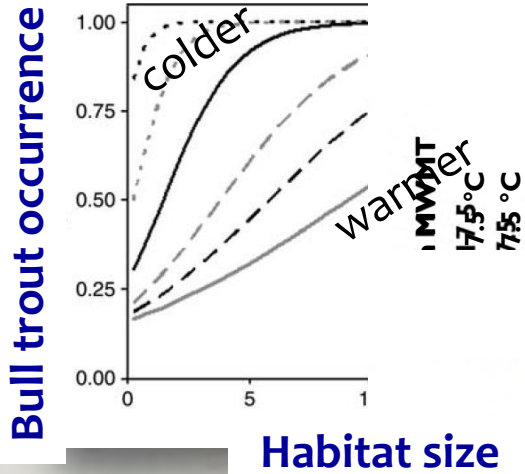


Biological  
survey

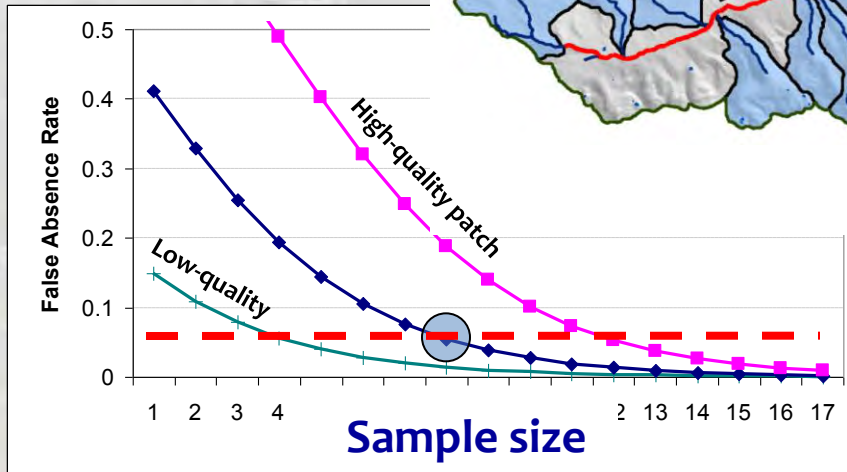


# Optimizing Biological Monitoring: Covariate Effects on Detection Efficiencies

## Habitat Suitability Curves



## Modified false absence rates



Peterson & Dunham 2003



**How many claims to stake?**



# Regionally Consistent Framework

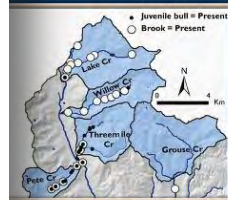
## Bull trout status & trend monitoring



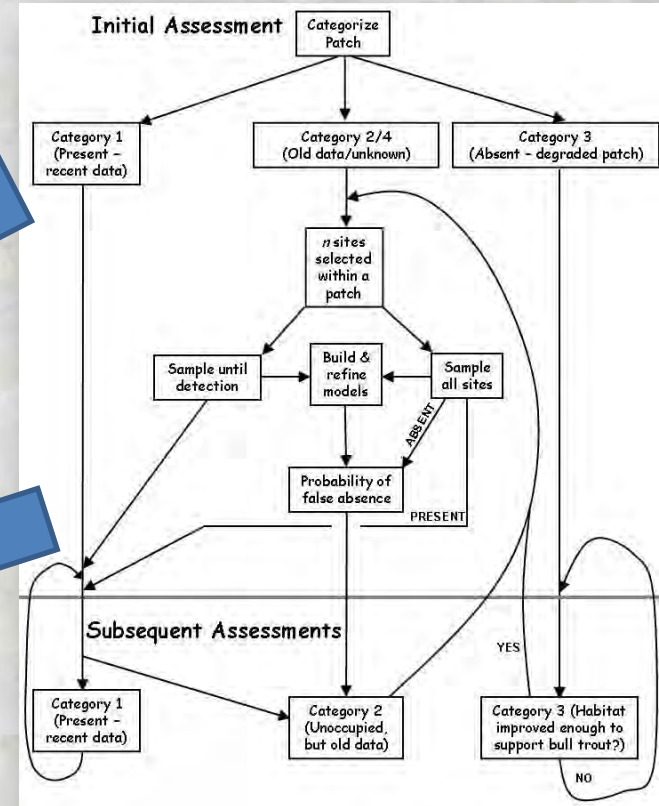
### A Watershed-Scale Monitoring Protocol for Bull Trout

Dan Isaak, Bruce Rieman, and Dona Horan

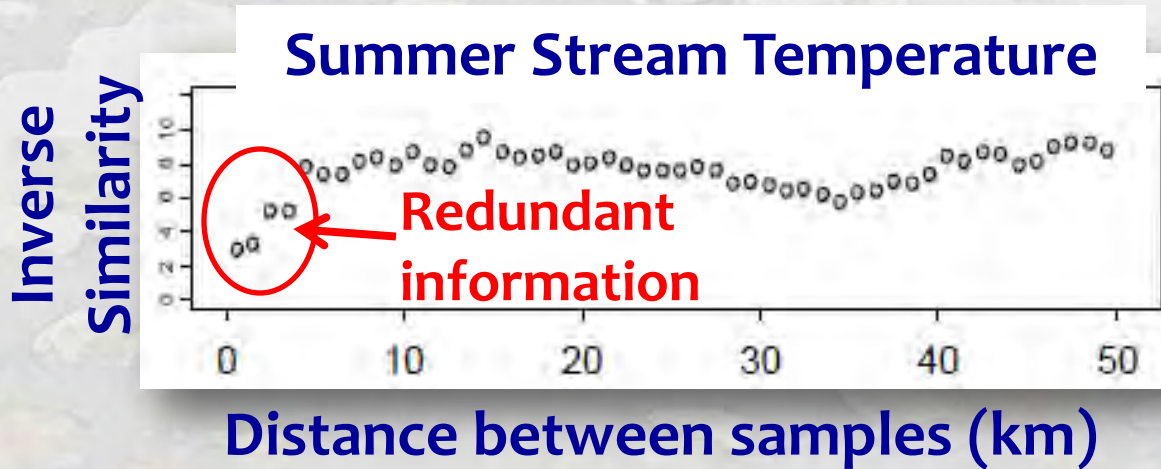
### Bull Trout Recovery: Monitoring and Evaluation Guidance



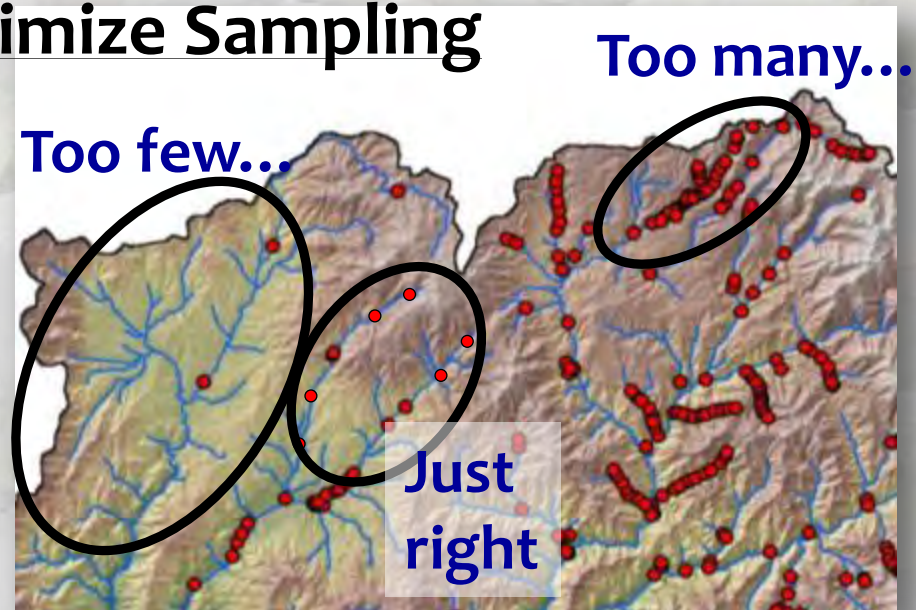
Prepared for  
 US Fish and Wildlife Service  
 Columbia River Fisheries Program Office  
 1211 SE Cardinal Court, Suite 100  
 Vancouver, WA 98683



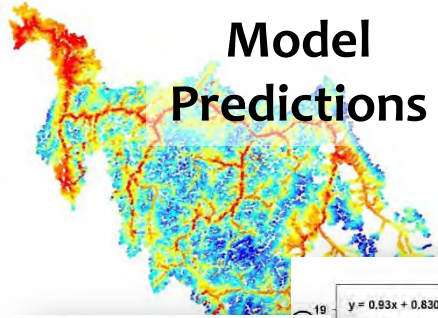
# Efficient Temperature Monitoring



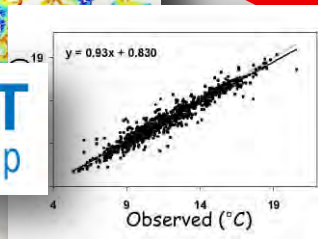
## Optimize Sampling



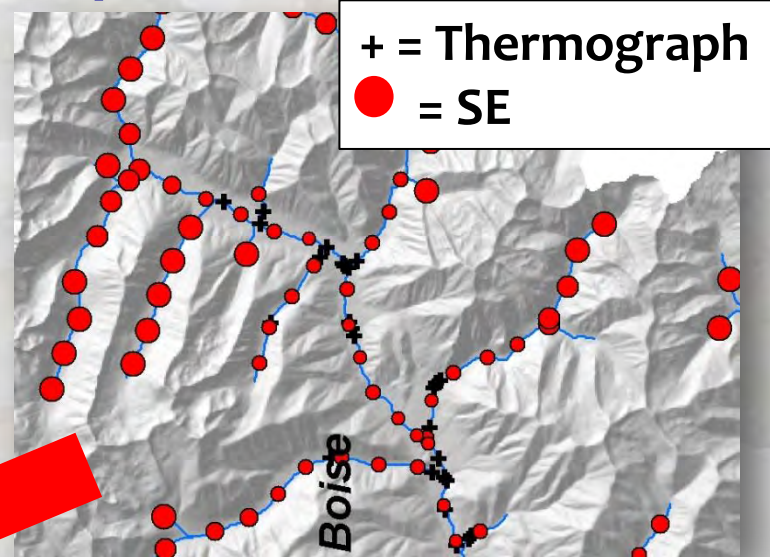
# Spatially Explicit Maps of Prediction Uncertainty (S34\_PredSE)



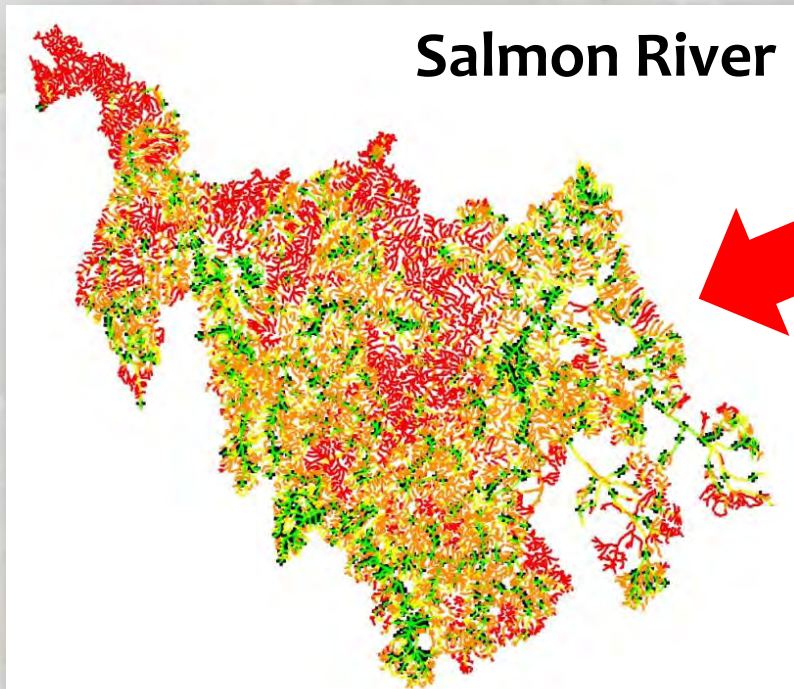
NorWeST  
Stream Temp



Temperature Prediction SE's



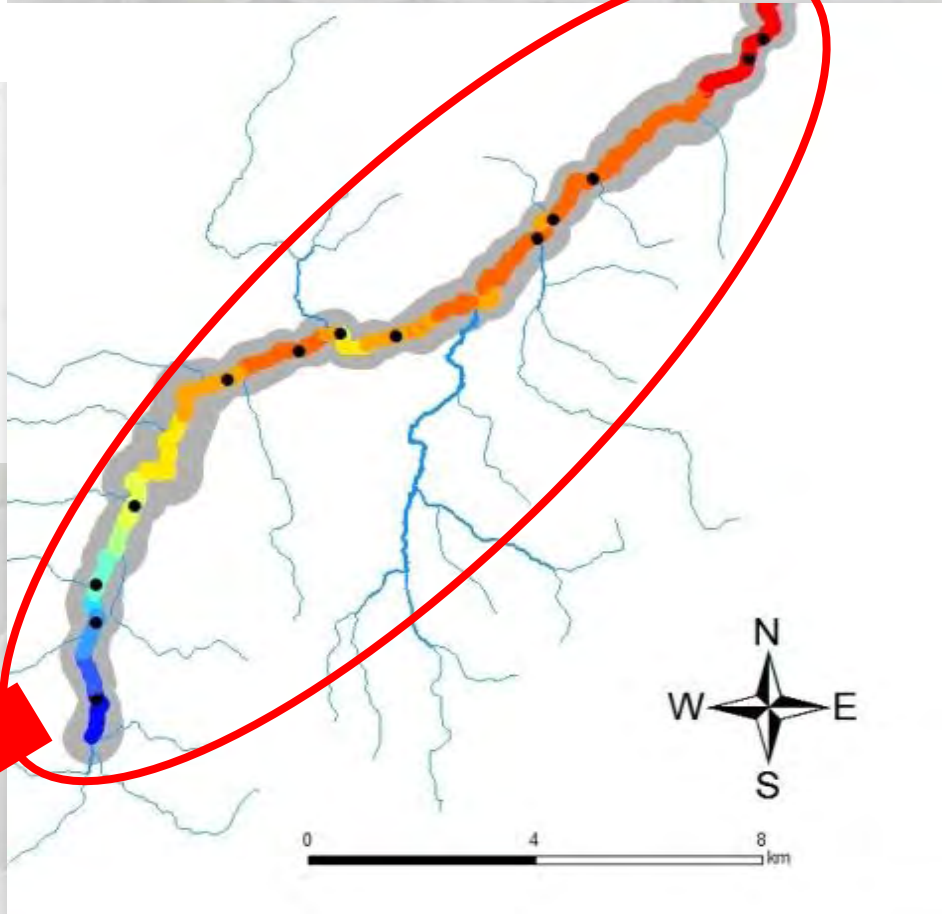
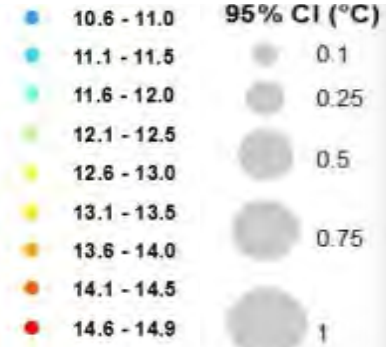
SE's are small near sites with temperature measurements



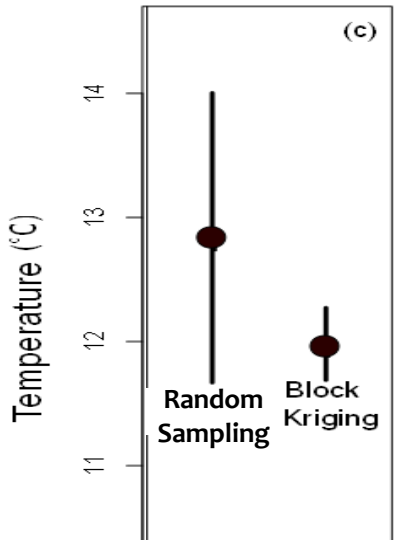
# Block-krige Accurate Stream Temperature Estimates at User Defined Scales



Temperature (°C)



Bear Valley Creek Mean Temperature



Precise & unbiased estimates

Does this reach exceed the TMDL standard?

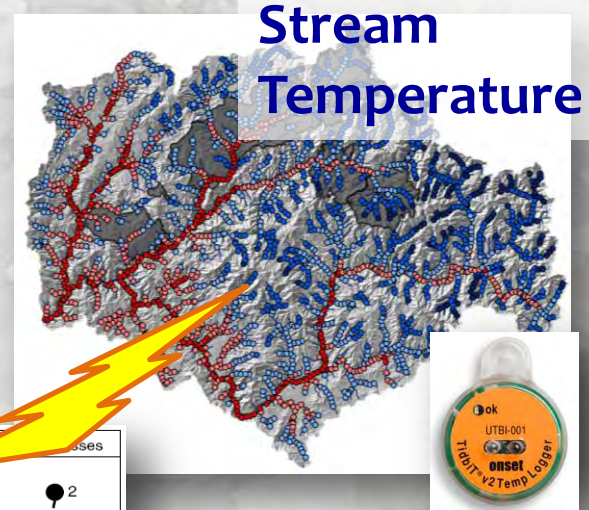
# Spatial Stream Models are Generalizable...



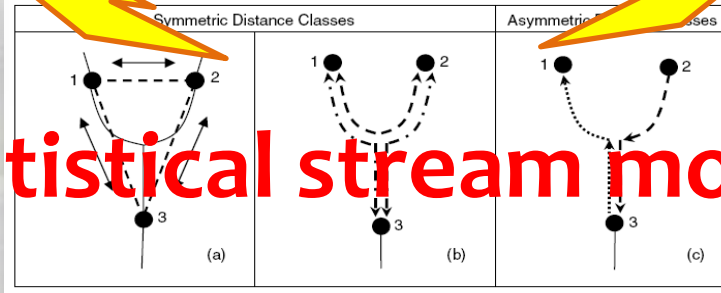
Distribution  
& abundance

Response  
Metrics

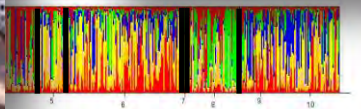
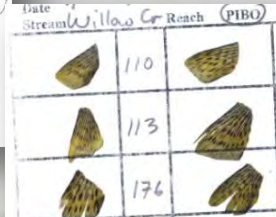
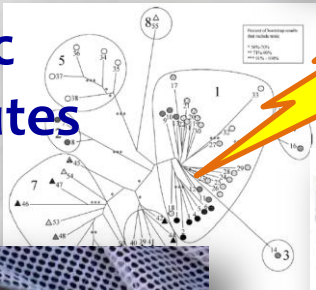
- Gaussian
- Poisson
- Binomial



Statistical stream models



Genetic  
Attributes



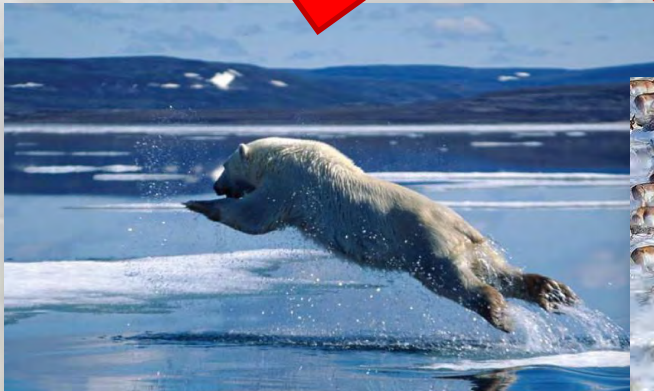
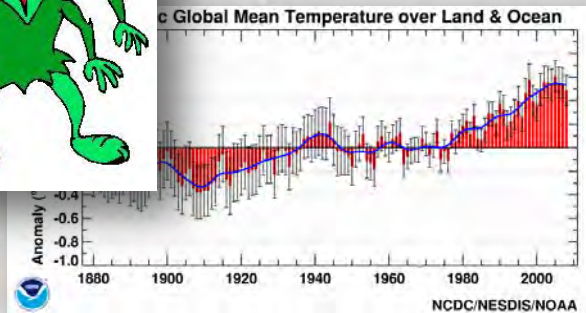
Water Quality  
Parameters



# Climate Is Happening...

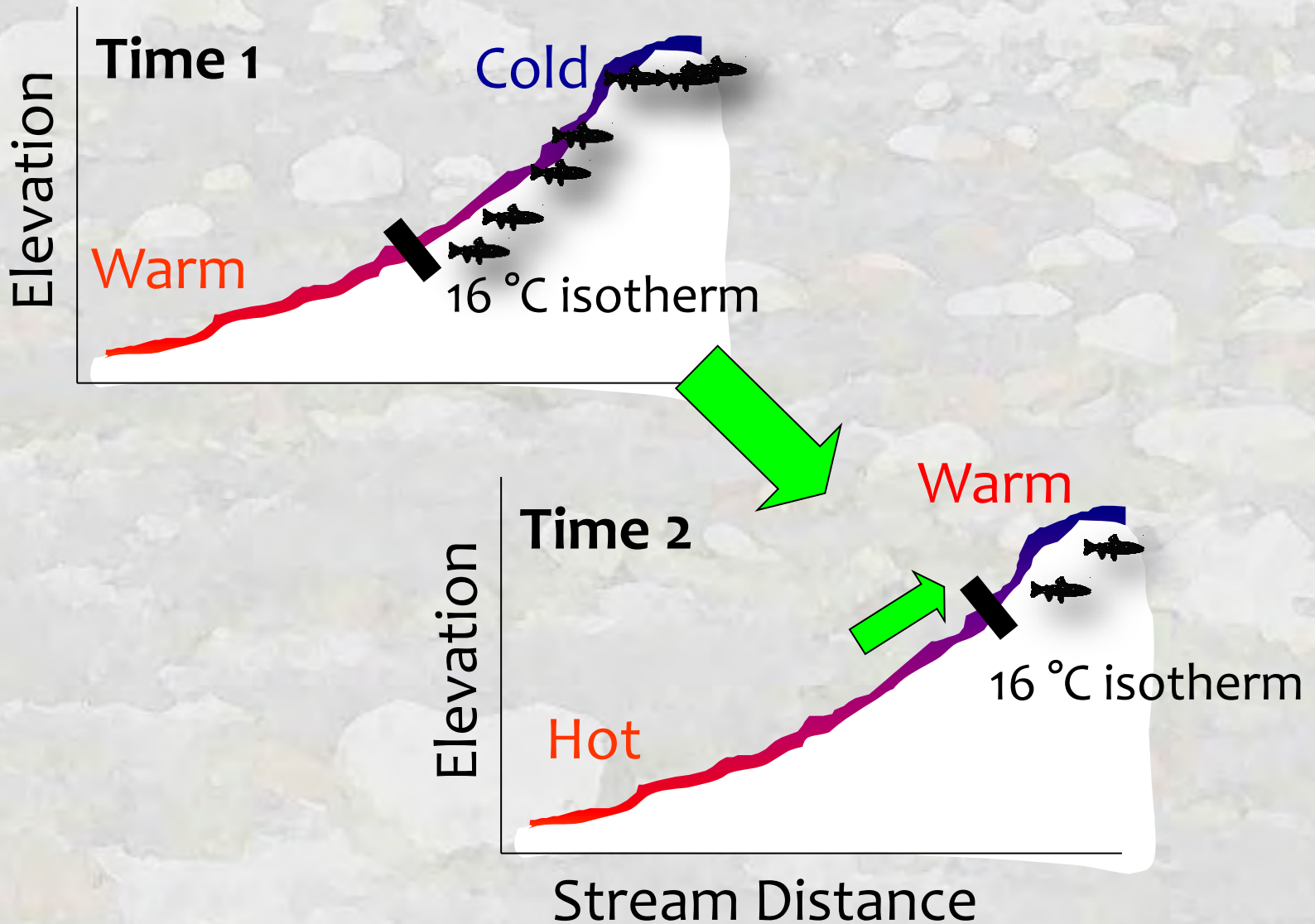
## Distributions are Shifting in Many Species

Average distribution shift  
6.1 km/decade poleward  
OR  
6.1 m/decade higher elevation



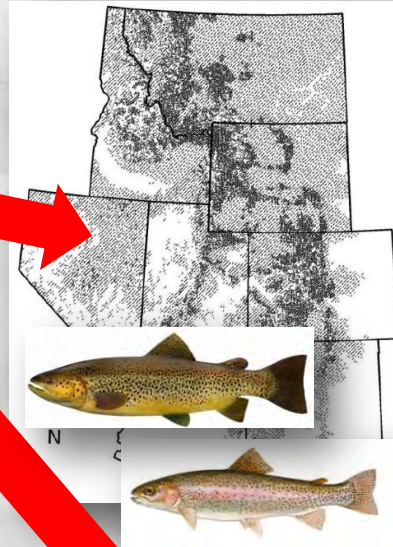
Parmesan and Yohe. 2003. *Nature* 421:37-42.

# ... but how fast is it happening to fish?

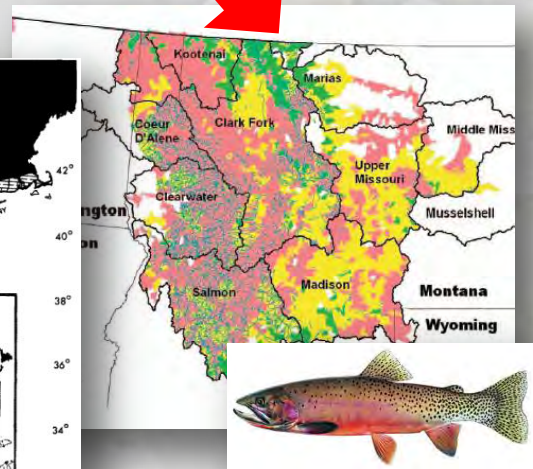
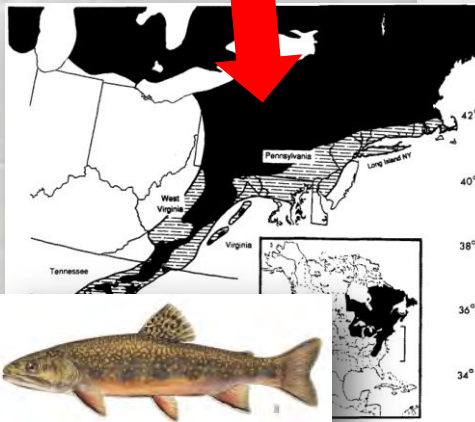


# Evidence for Freshwater Fish Populations is Weak

- Meisner 1988, 1990
- Eaton & Schaller 1996
- Keleher & Rahel 1996
- 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
- Etc.



Lots of predicting,  
not much validating

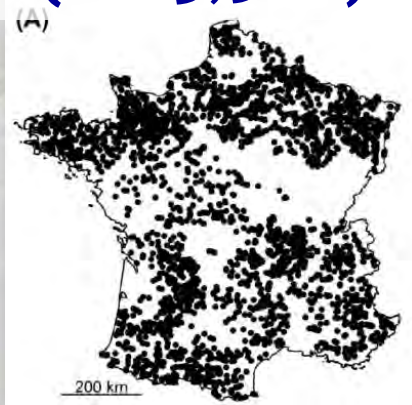




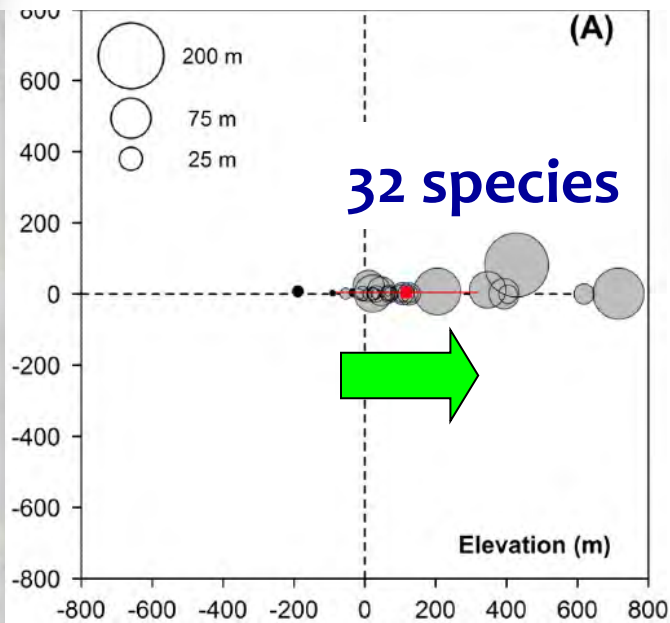
# Distribution Shifts in French Streams



Survey sites  
(n = 3,500)



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



Change in Elevation (m)



March of the fishes...



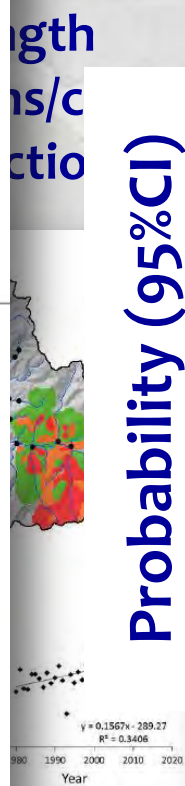
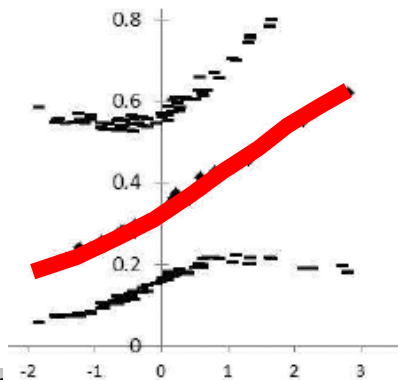
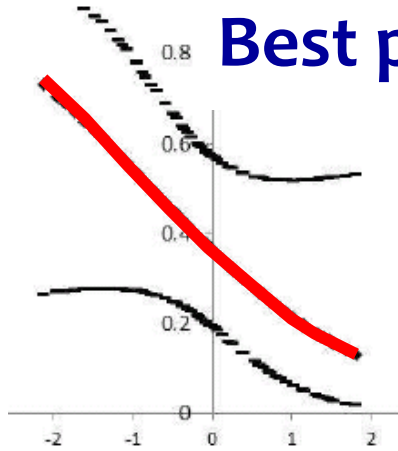
Comte & Grenouillet. 2013. Do stream fish track climate change? Assessing distribution shifts in recent decades. *Ecography* doi: 10.1111/j.1600-0587.2013.00282.x

# Distribution Shifts in Montana Bull Trout Populations

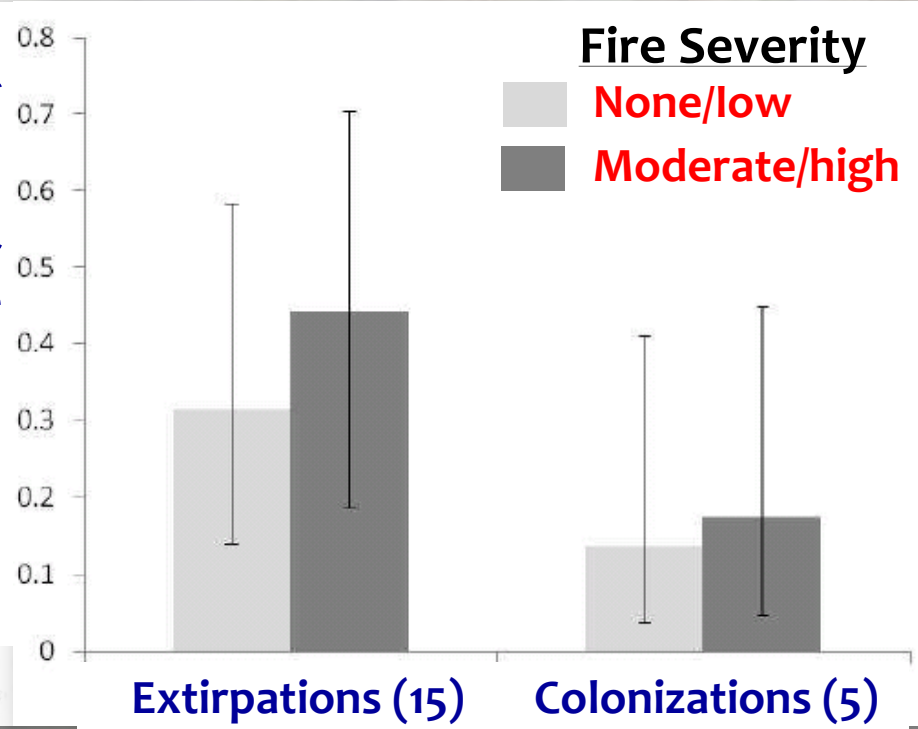


Extirpation probability (95%CI)

Best predictors



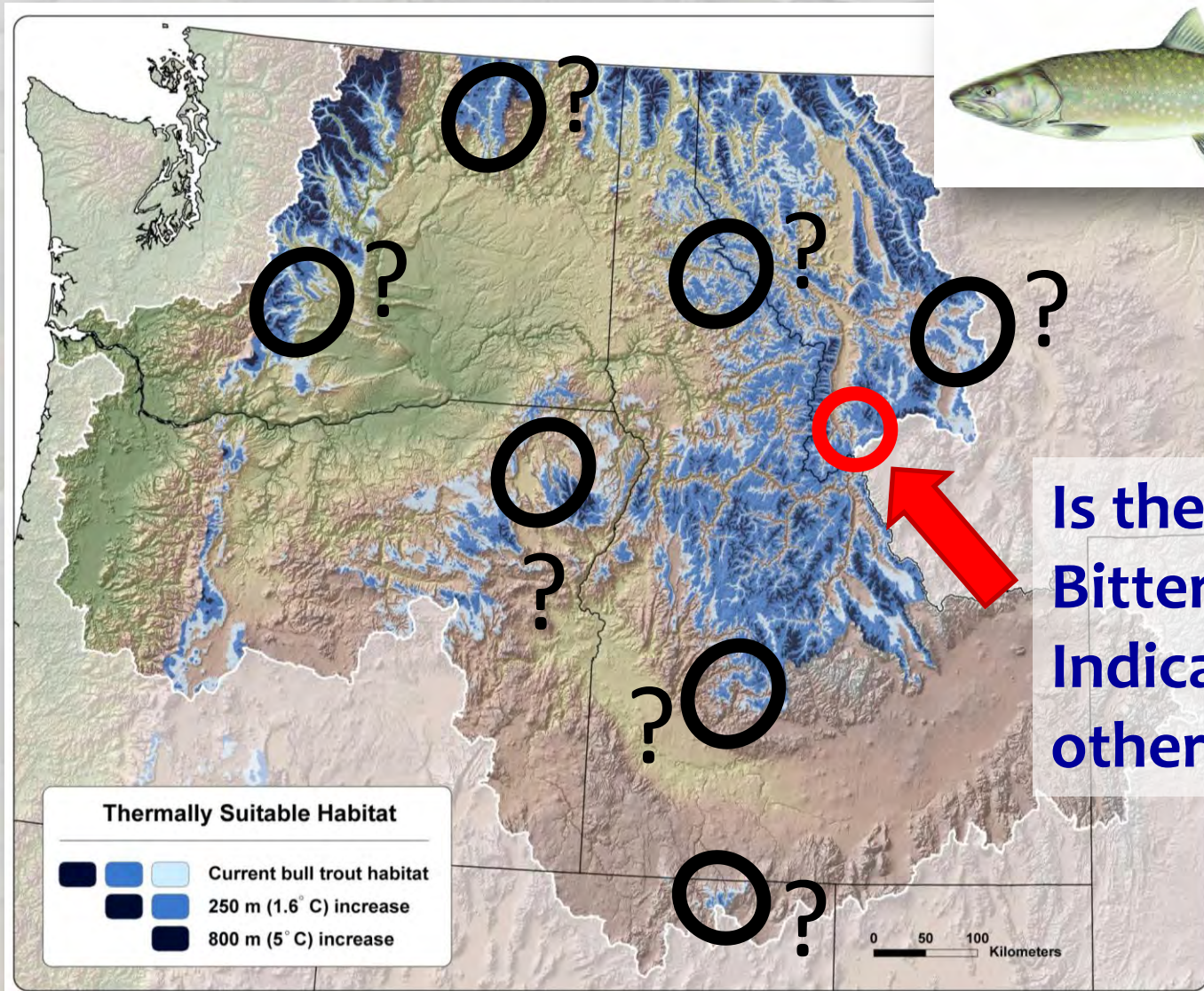
Probability (95%CI)



Eby et al.  
to  
Ch...

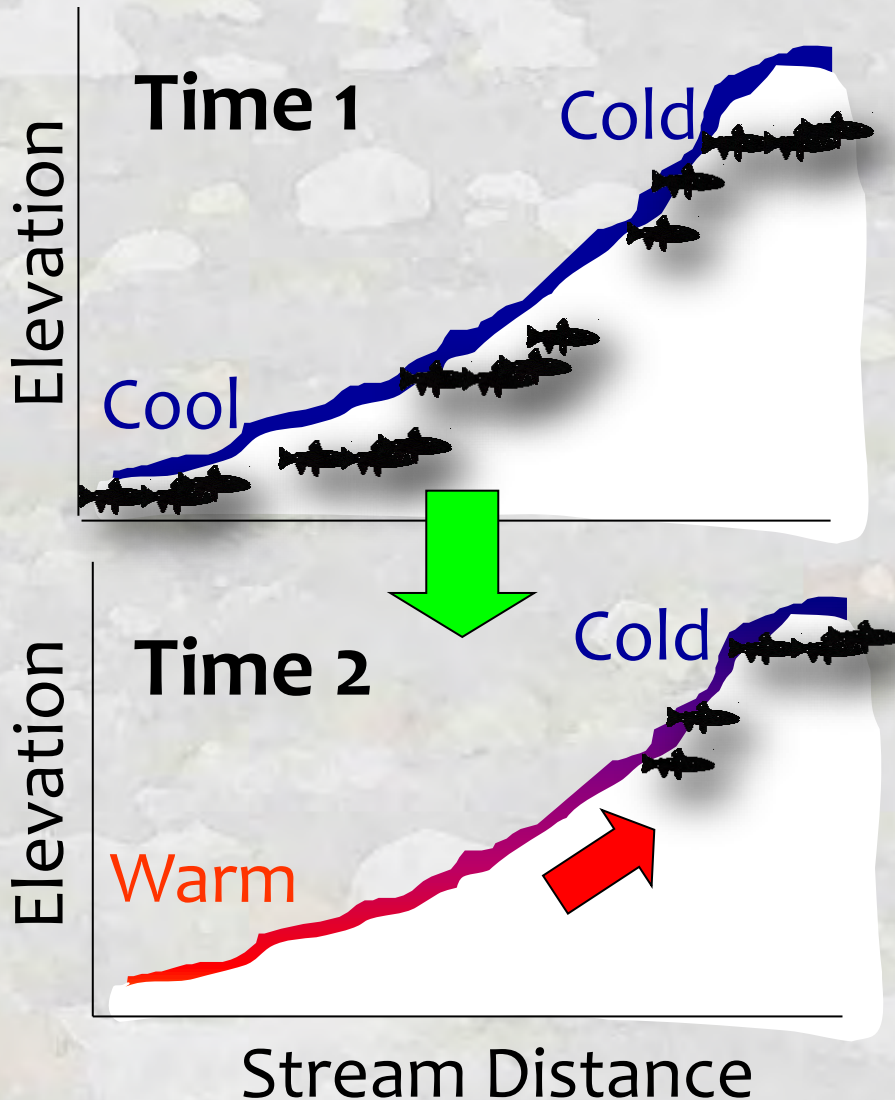
... of climate-induced range contractions for bull trout  
... ion sites in a Rocky Mountain watershed, U.S.A. *Global*

# More Resurveys Needed to Understand Potential Breadth of Declines



# Additional Questions:

At what rate are bull trout distributions shifting?

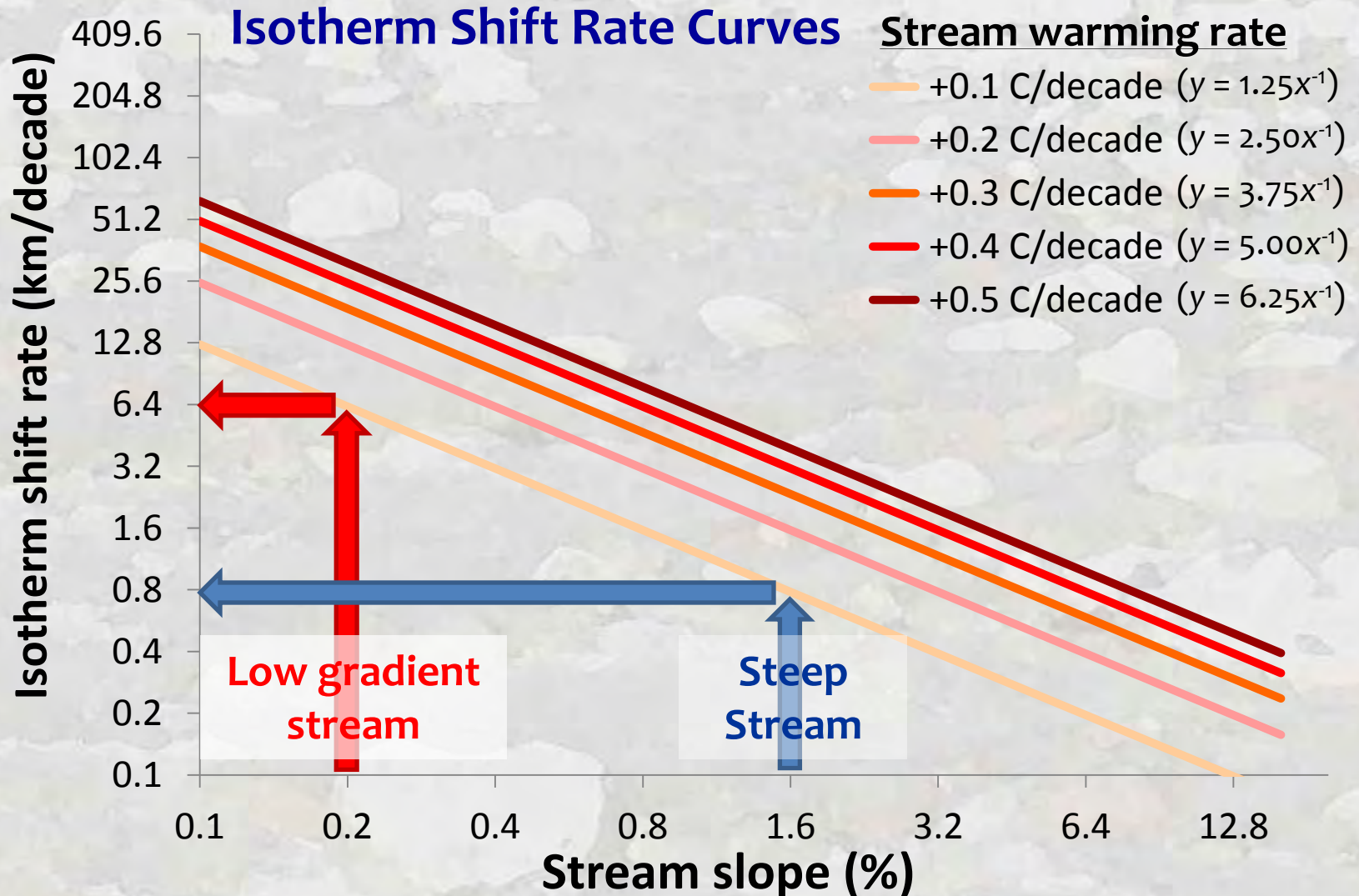


Average distribution shift  
across taxa =  
6.1 km/decade poleward OR  
6.1 m/decade higher

Parmesan and Yohe. 2003.  
*Nature* 421:37-42.



# How do biological shifts relate to isotherm shifts?



Isaak & Rieman. 2013. Stream isotherm shifts from climate change and implications for distributions of ectothermic organisms. *Global Change Biology* 19:742-751.

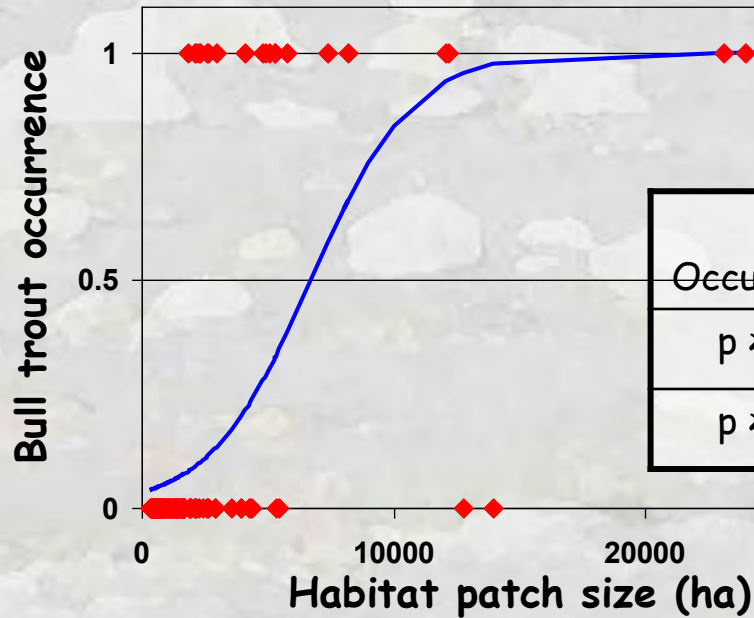
# How Much Habitat is Needed to Persist?

Rieman & McIntyre 1995

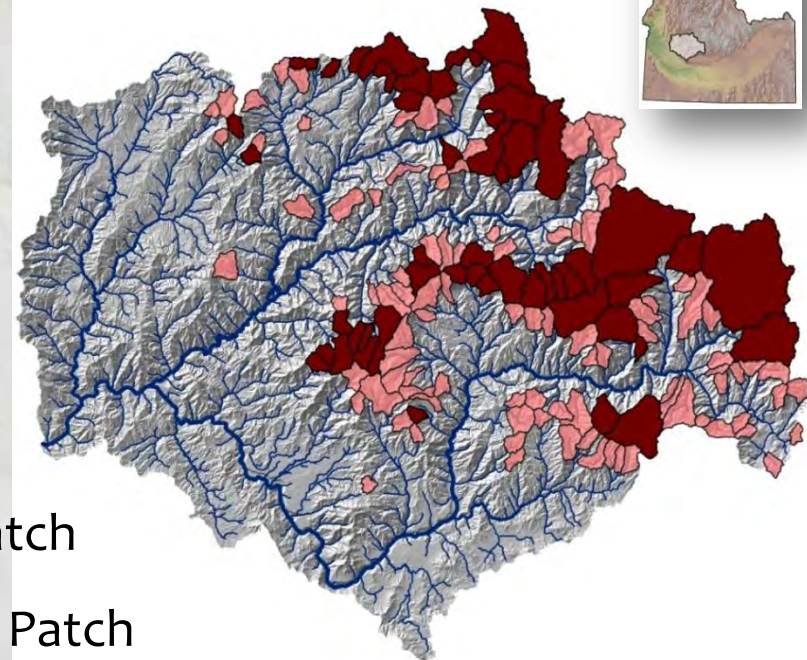
Dunham and Rieman 1999

Dunham et al. 2002

Isaak et al. 2010



Occurrence	Watershed area (ha)	Stream length (km)
$p > 0.5$	~3,000	~13
$p > 0.9$	~10,000	~40

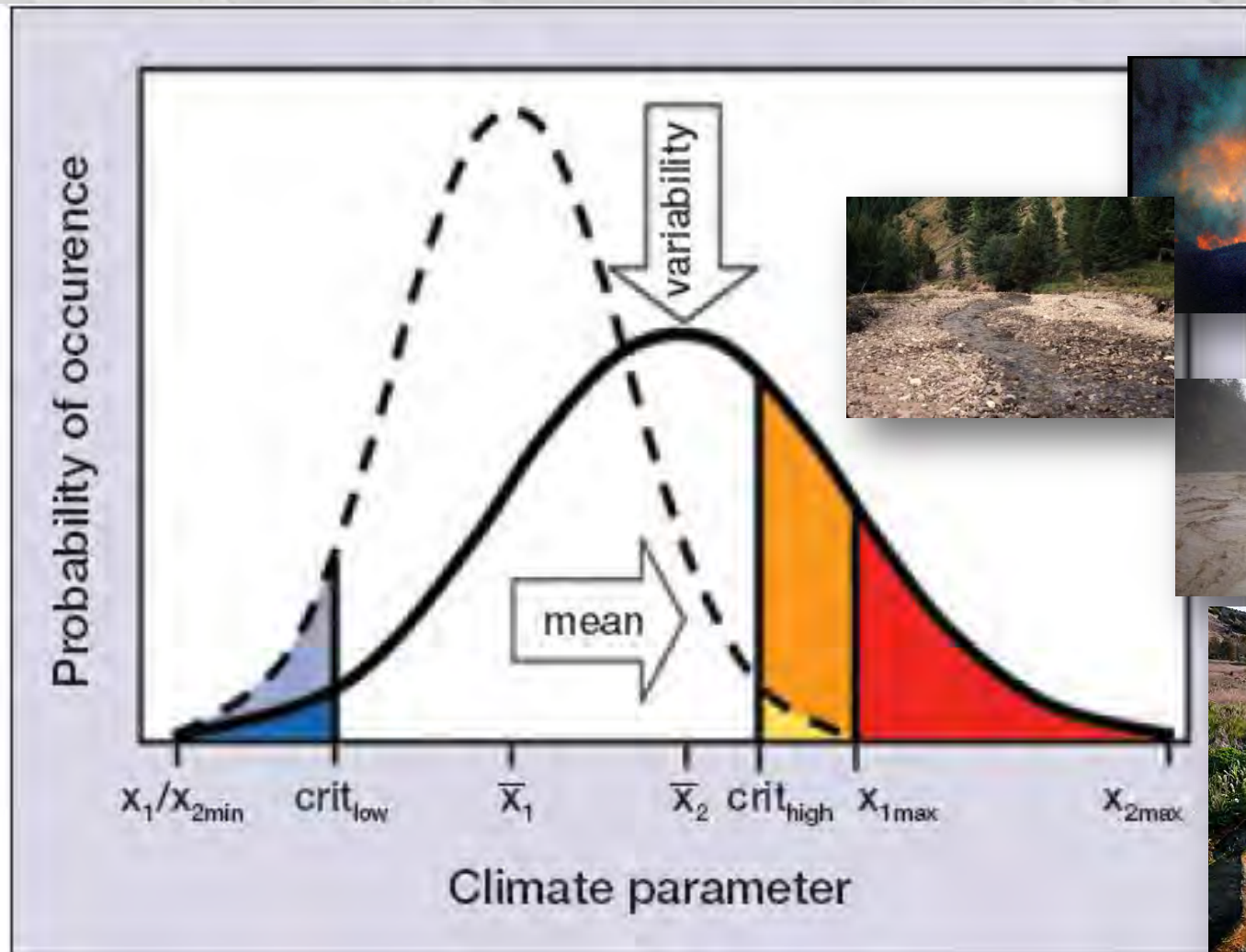


Occupied Patch

Unoccupied Patch

# What's our Future Habitat Fudge Factor?

Larger Habitats Needed to Accommodate Larger Disturbances



# How Will Climate Factors Interact?

Warmer temperatures  
Reduced summer flows  
Fire & debris flows  
Winter flooding  
Non-native invasions



**The Bull Trout Vise**



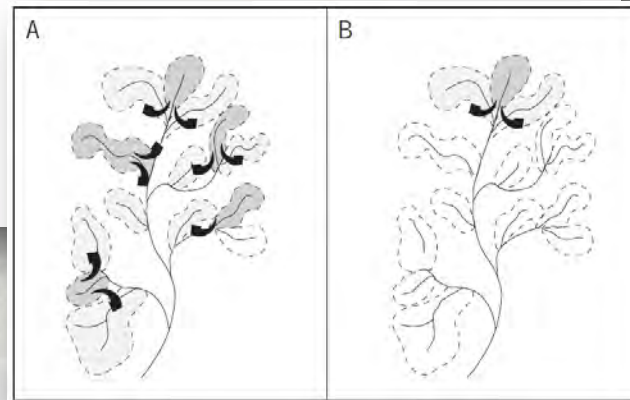
# Where Are the “Bombproof” Habitats? Should These Have Additional Protections to Provide a Foundation for a Bull Trout Reserve System?

## Feature: FISHERIES MANAGEMENT



### Native Fish Conservation Areas: A Vision for Large-Scale Conservation of Native Fish Communities

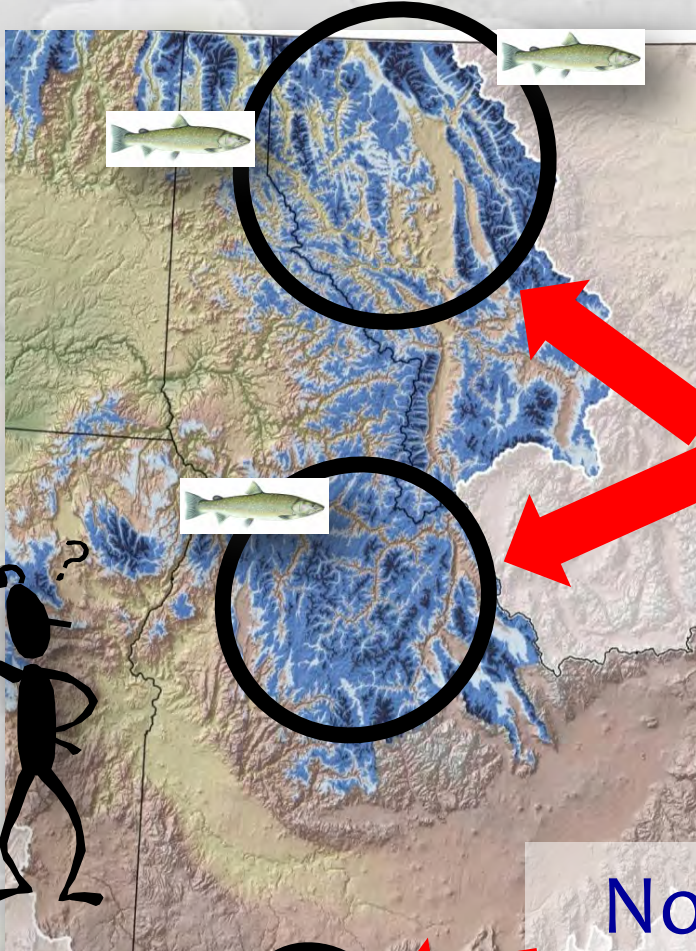
Jack E. Williams, Richard N. Williams, Russell F. Thurow, Leah Elwell, David P. Philipp, Fred A. Harris, Jeffrey L. Kershner, Patrick J. Martinez, Dirk Miller, Gordon H. Reeves, Christopher A. Frissell, and James R. Sedell



### The Past as Prelude to the Future for Understanding 21st-Century Climate Effects on Rocky Mountain Trout

Isaak et al. 2012. *Fisheries* 37: 542-556.

# We'll Soon Have The Necessary Information but...



Invest Here

Not here?

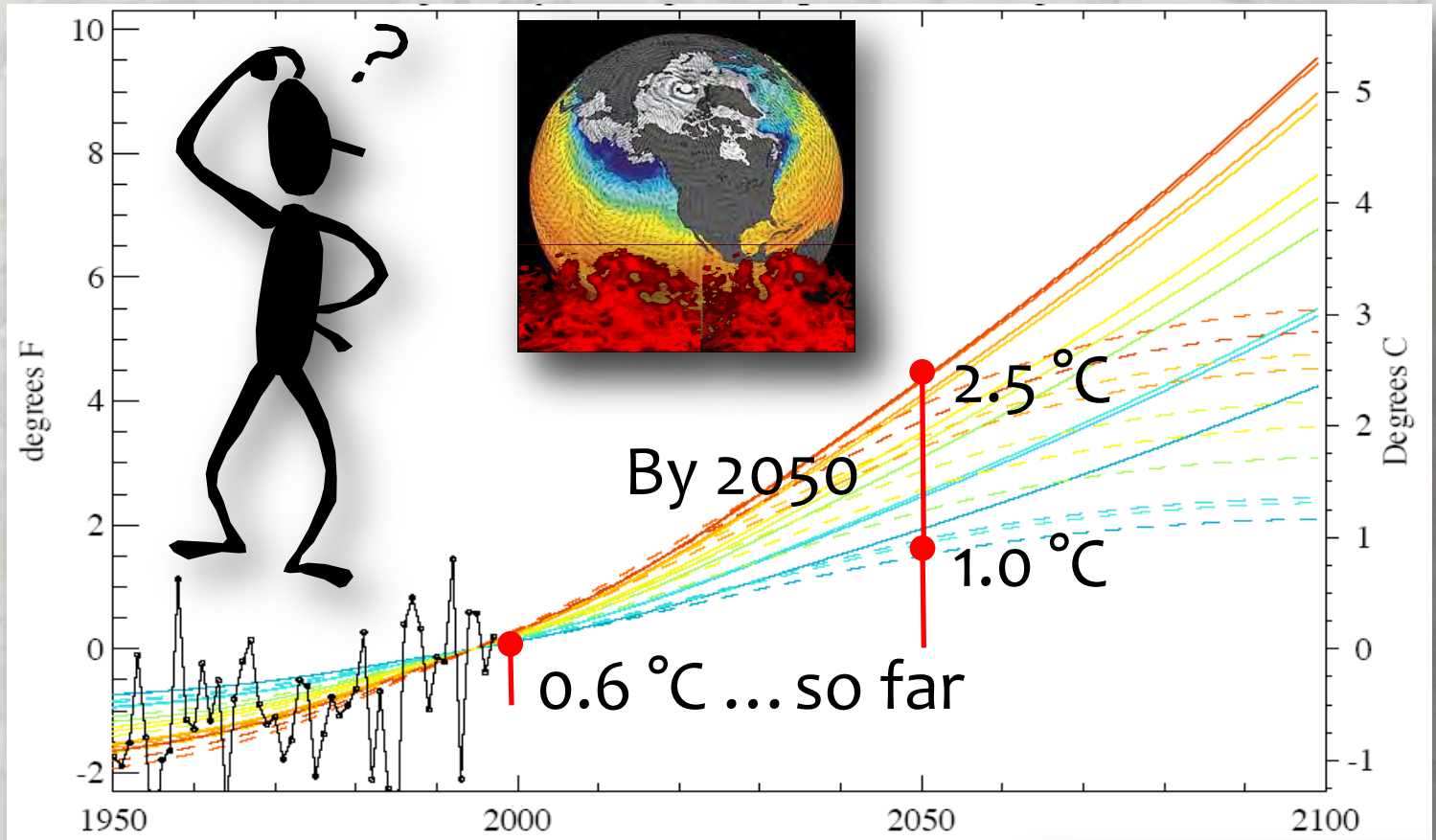
**Sorry Charlie**



...no guarantees humans are rational creatures



& future uncertainties will be large...



**We can't save everything, but the sooner (& smarter) we act, the bigger the long-term impact**





The End