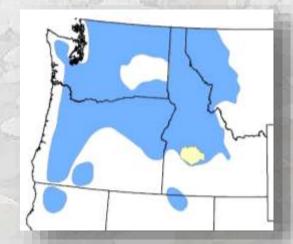
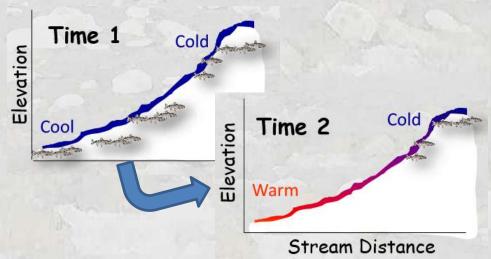
Bringing it All Together: Where to Prioritize Flow Restoration for an ESA Listed Fish?





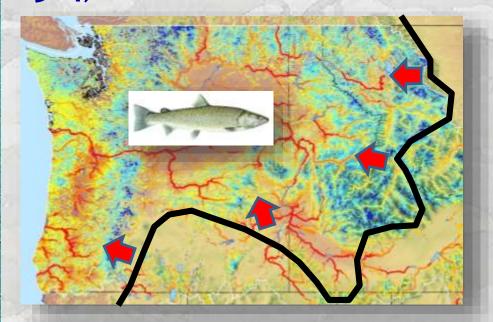
- Bull trout ESA listed as threatened in 1997
- Occurs at low densities throughout PNW
- Is climate/drought sensitive & restricted to cold headwaters
- Requires large interconnected habitat networks to persist
- Distribution is contracting as droughts & temperature increase





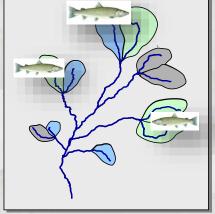
A Seemingly Overwhelming Task

384,000 kilometer network of streams

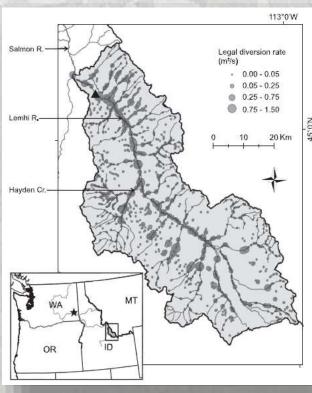


Local occurrence of bull trout often uncertain





Thousands of small water diversions



Walters et al. 2013. Conservation Biology **27**:1179-1189

How to Maximize Returns on Investments



Where to invest?

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

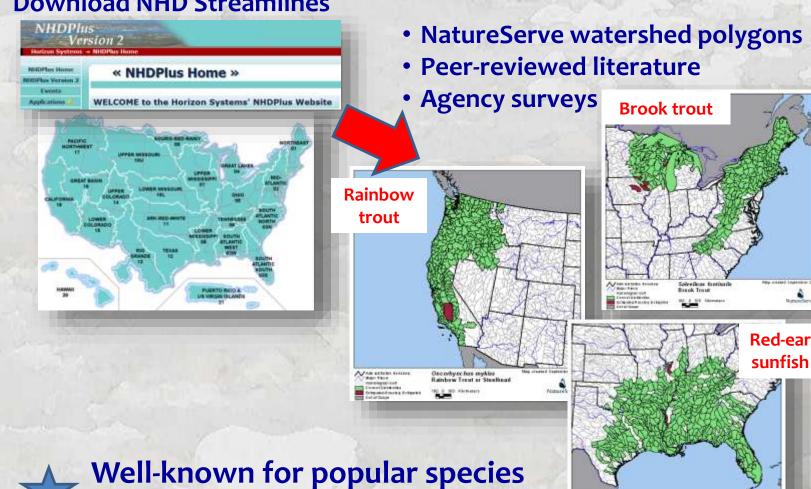




Step 1. Filter NHD to Match Species Range (i.e., define the universe)

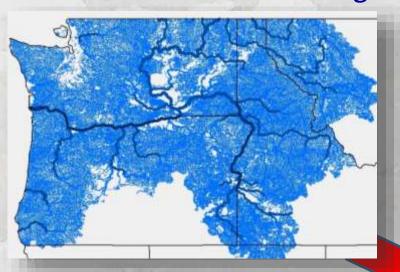
Download NHD Streamlines

Fuzzy for many others



Step 2. Filter NHD Based on Species Habitat Thresholds (i.e., refine the universe)

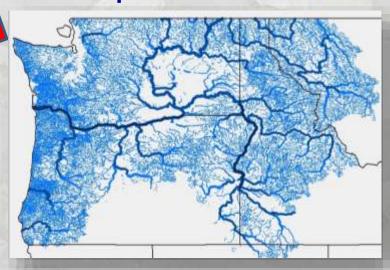
Initial network: 384,000 km of NHD streams in bull trout range



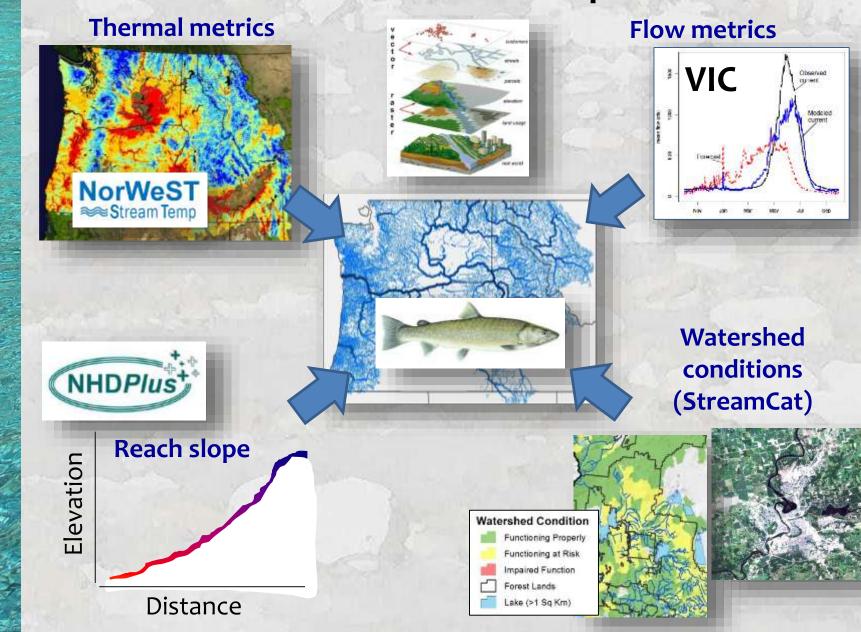
Bull trout don't occur where:

- Reach slope > 15%
- Mean flow < 1 cfs
- Flows are intermittent (NHD Fcode = 46003)

Refined network: 158,000 km of potential streams



Step 3. Attribute Remaining NHD Reaches with Relevant Habitat Descriptors



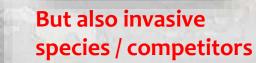
Step 4. Attribute NHD Reaches With Relevant Biological Data (species occurrence/abundance)

Existing databases (MFISH, MARIS, eDNAtlas, etc.)



Target species

eDNA sampling campaign to collect new data

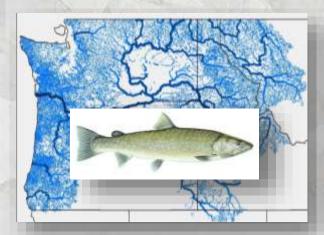




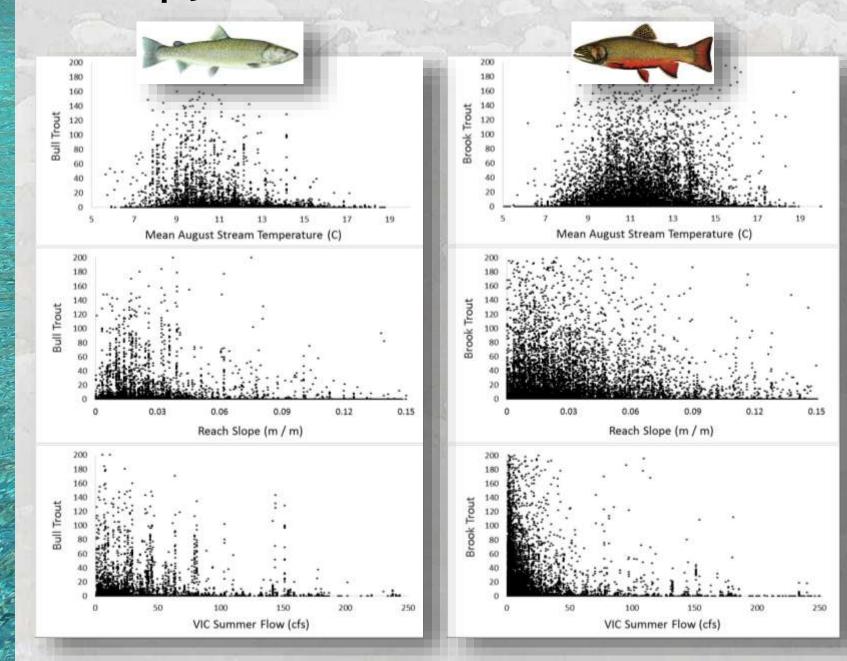




4,500 reach samples 512 streams

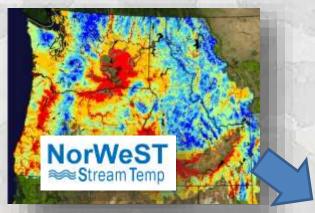


Step 5. Data Summaries and Visualization



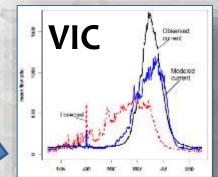
Step 6. Model Building to Assess Covariate Effects and Develop Predictive Relationships

Thermal metrics

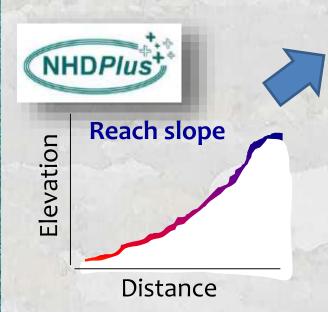


Models types:

- SSNs
- MaxEnt
- GLMM
- GLM
- Random forests



$$p = \frac{\exp(a + bx \dots ny)}{(1 + \exp[a + bx \dots ny])}$$











Watershed conditions (StreamCat)



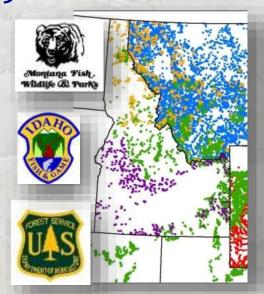


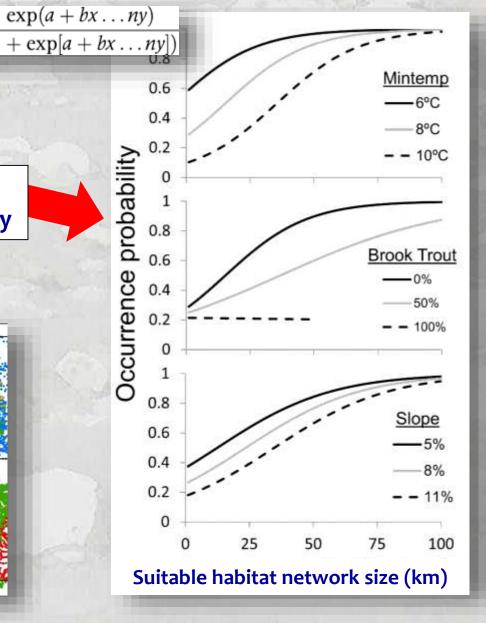
Step 7. Model Response Curves Describe Relationships & Enable Sensitivity Analysis



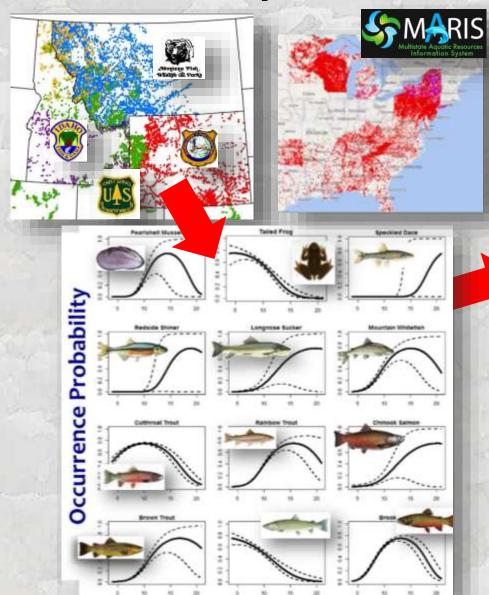
78% stream classification accuracy

4,500 reach samples
512 streams





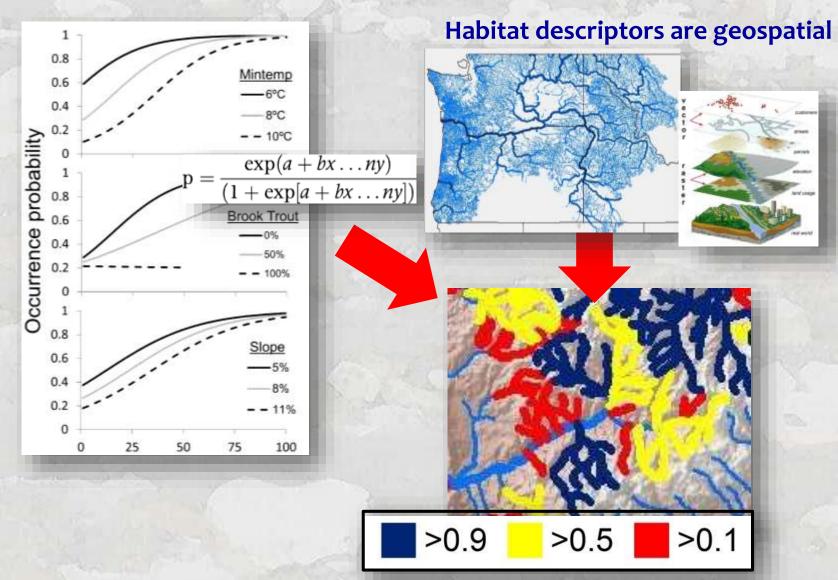
Process is Repeatable With Many Species



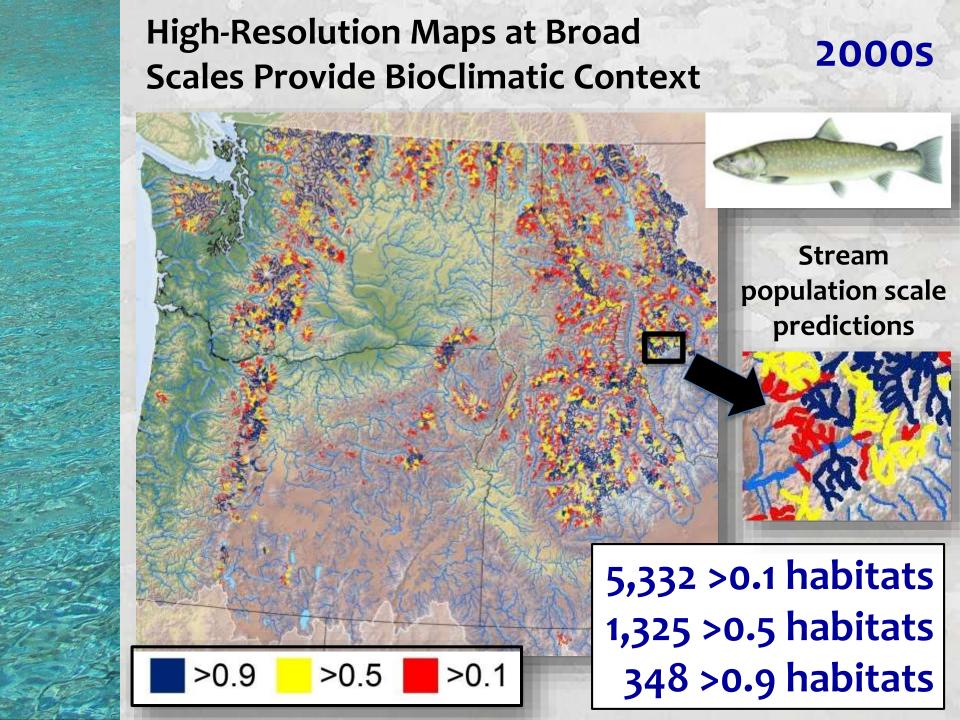
Species and model	AUC	ΔAIC
Longnose dace		
Simple	0.86	37
Multivariate	0.87	0
Speckled dace		
Simple	0.92	8
Multivariate	0.93	0
Redside shiner		
Simple	0.91	33
Multivariate	0.93	0
Longnose sucker		
Simple	0.81	65
Multivariate	0.86	0
Mountain whitefish		
Simple	0.76	380
Multivariate	0.90	0
Cutthroat trout		
Simple	0.56	37
Multivariate	0.56	0
Rainbow trout	0.00	
Simple	0.75	243
Multivariate	0.83	0
Chinook salmon		
Simple	0.62	63
Multivariate	0.73	0
Brown trout	0.75	
Simple	0.69	158
Multivariate	0.73	0
Bull trout	0.75	
Simple	0.60	474
Multivariate	0.75	0
Brook trout	0.75	
Simple	0.57	191
Multivariate	0.63	0
Slimy sculpin	0.03	U
Simple	0.67	17
Multivariate	0.73	0
Rocky Mountain tailed frog	0.73	U
Simple	0.65	4
Multivariate	0.65	0
	0.03	U
Columbia spotted frog Simple	0.63	0
Multivariate	0.64	3
Munivariate	0.04	3

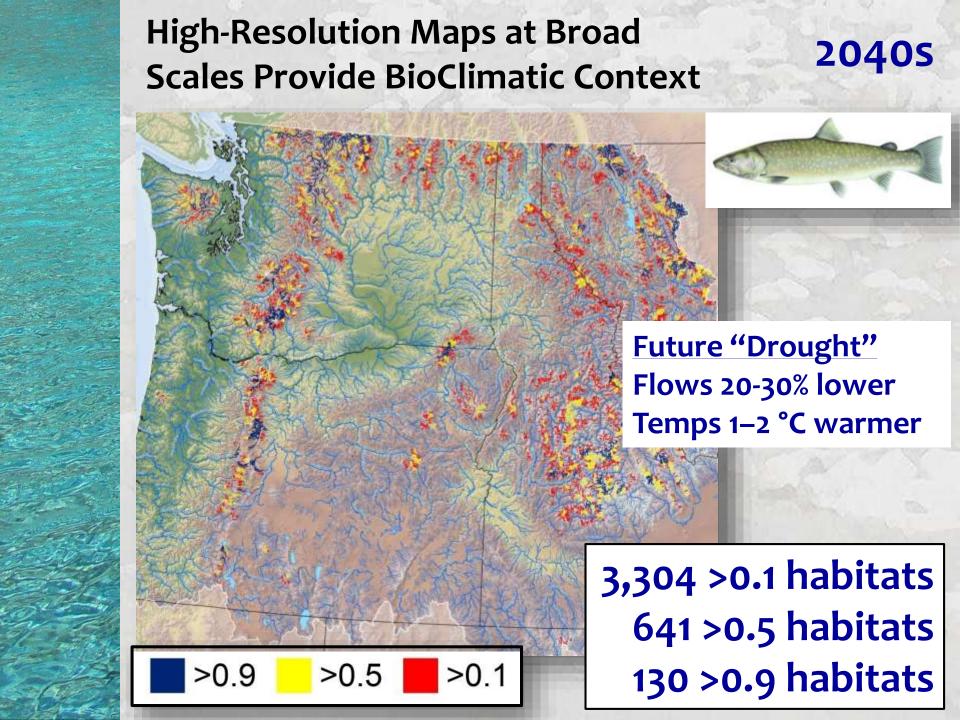
Isaak et al. 2017. Big biology meets microclimatology. Ecological Applications. 27:977-990.

Step 8. Map Species Occurrence Probabilities Back to Stream Network



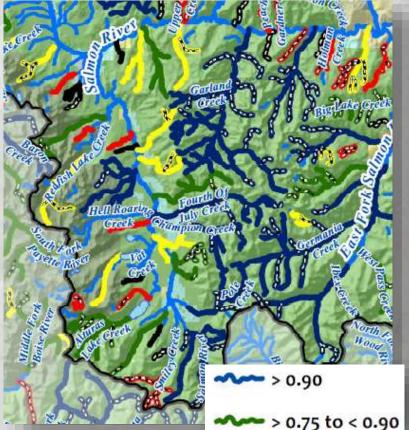
Isaak et al. 2015. The cold-water climate shield: Delineating refugia for preserving native trout through the 21st Century. Global Change Biology 21: 2540-2553





Step 9. Conduct Local Drought Sensitivity Analysis

2000S



Occupancy probability

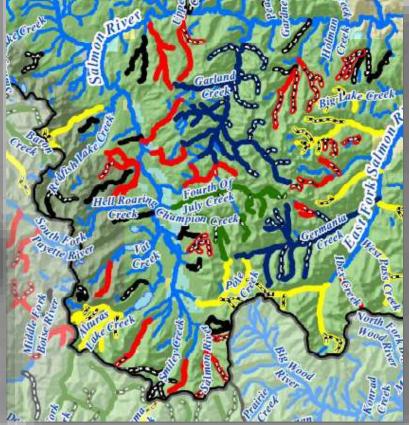
> 0.25 to < 0.50

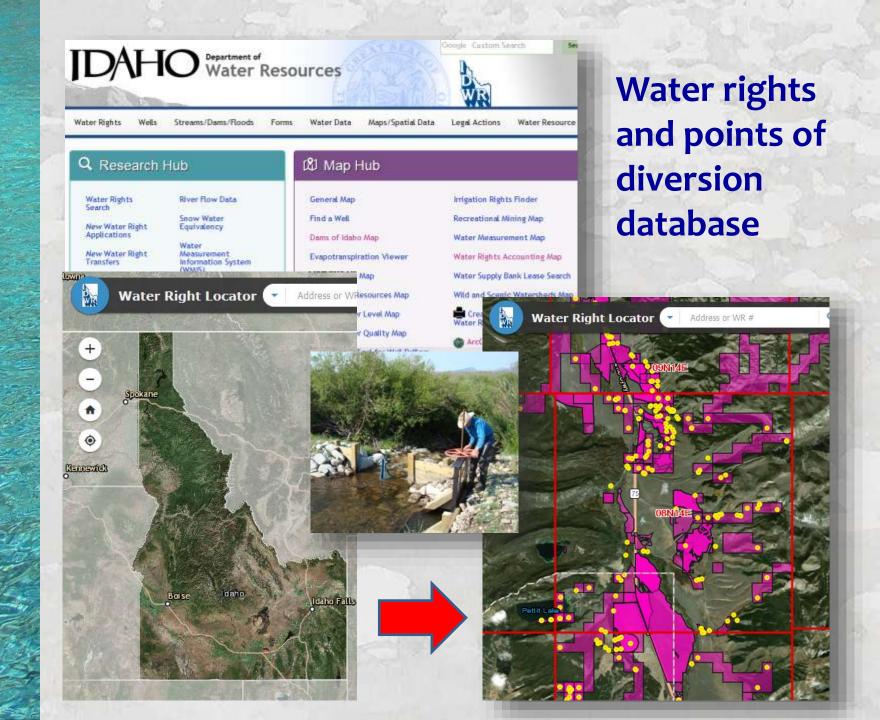
> 0.50 to < 0.75

< 0.25

Where does it make sense to invest?

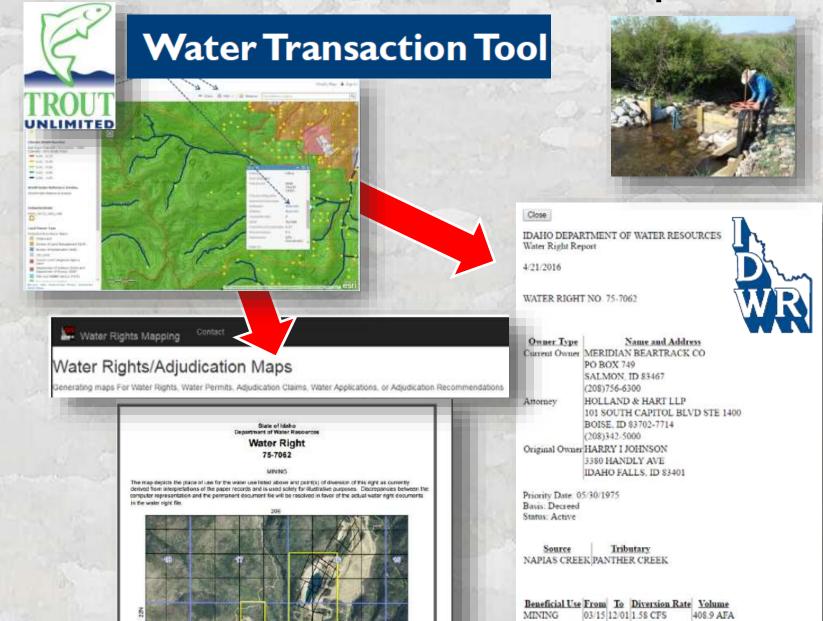
2040s: Warmer & drier





Step 10. Interface Water Diversion Infrastructure With Bull Trout Distribution Maps Water Transaction Tool Princip of Diversity Climate Shield Seaches Bull Front Probability Occurrence - 2300 - B36 - 630 - 0.21 - 0.49 6.41 - 6.68 - AS1-030 633 - 130 World Hydro Telerance Overlay World Hydro Reference Overlag Splinistersheds ldsho_nect2_bbs_web Land Owner Type Photostical Arms Chamer history Exercis of Land Hanagement (SLH) Bureau of Rectamation (MOR) Experiment of Delivery (SCED and Department of Emergy (DOE) Plack and tribible Genitre (PWN)

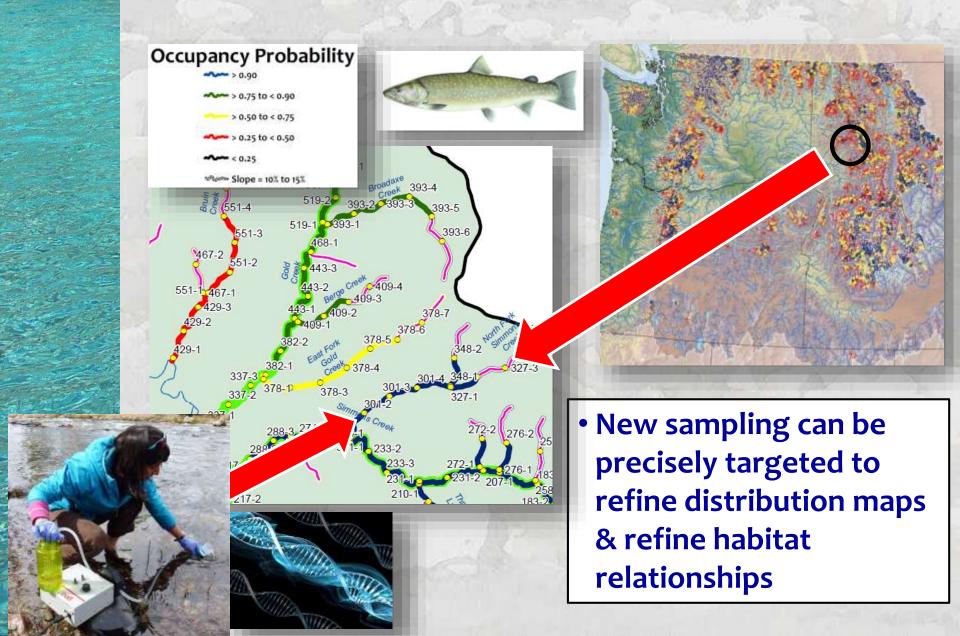
Step 10. Interface Water Diversion Infrastructure With Bull Trout Distribution Maps



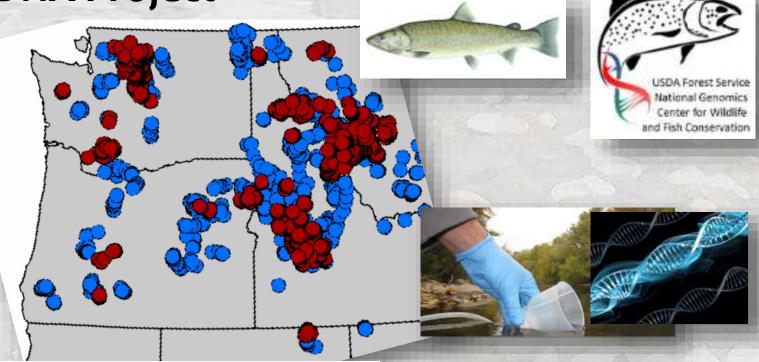
Total Diversion

1.58 CFS

Framework Can be Updated with New Data



Crowd-Sourced Rangewide Bull Trout eDNA Project



Project partners sampled...

2016: 3,000 stream sites surveyed

2017: 2,000 stream sites surveyed

>2018: ? additional sites surveyed





















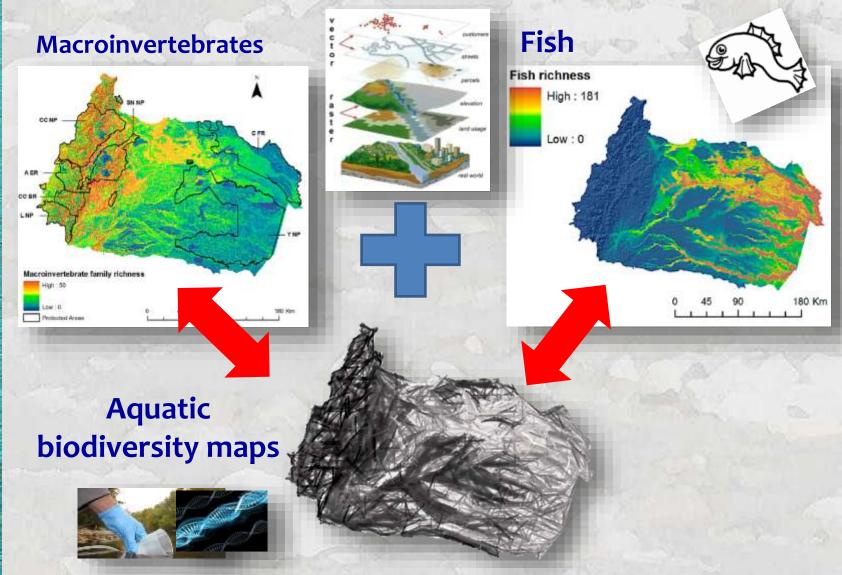






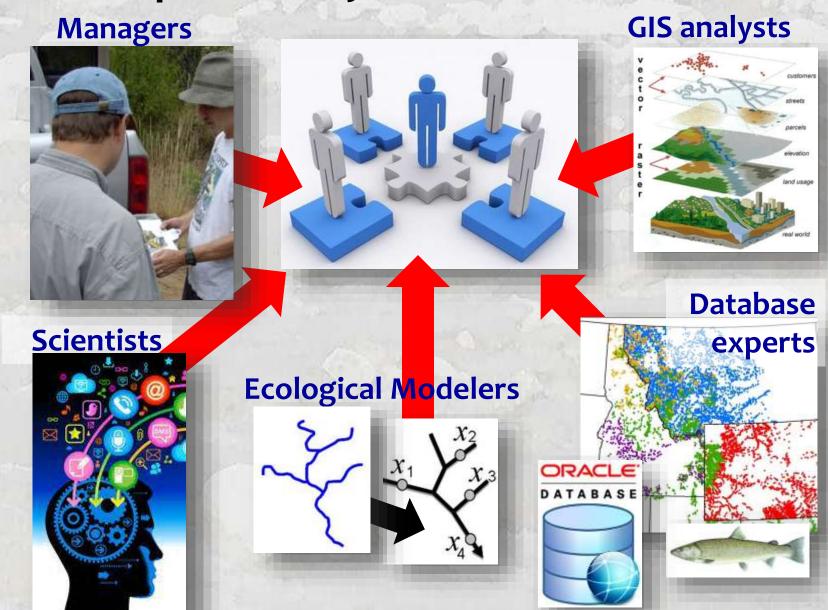


Future: Multispecies Datasets and Map Capabilities to Enable Community/Biodiversity Based Assessments



Lessmann et al. 2016. Freshwater vertebrate and invertebrate diversity patterns in an Andean-Amazon basin: implications for conservation efforts. *Neotropical Biodiversity* 2: 99-114.

Challenges: Teams of People With Complementary Skillsets are Essential



Trajectory is Clear: NHD, New Sensing Technologies, and Precise Datasets Can Reduce Uncertainty & Increase Restoration Efficiency

