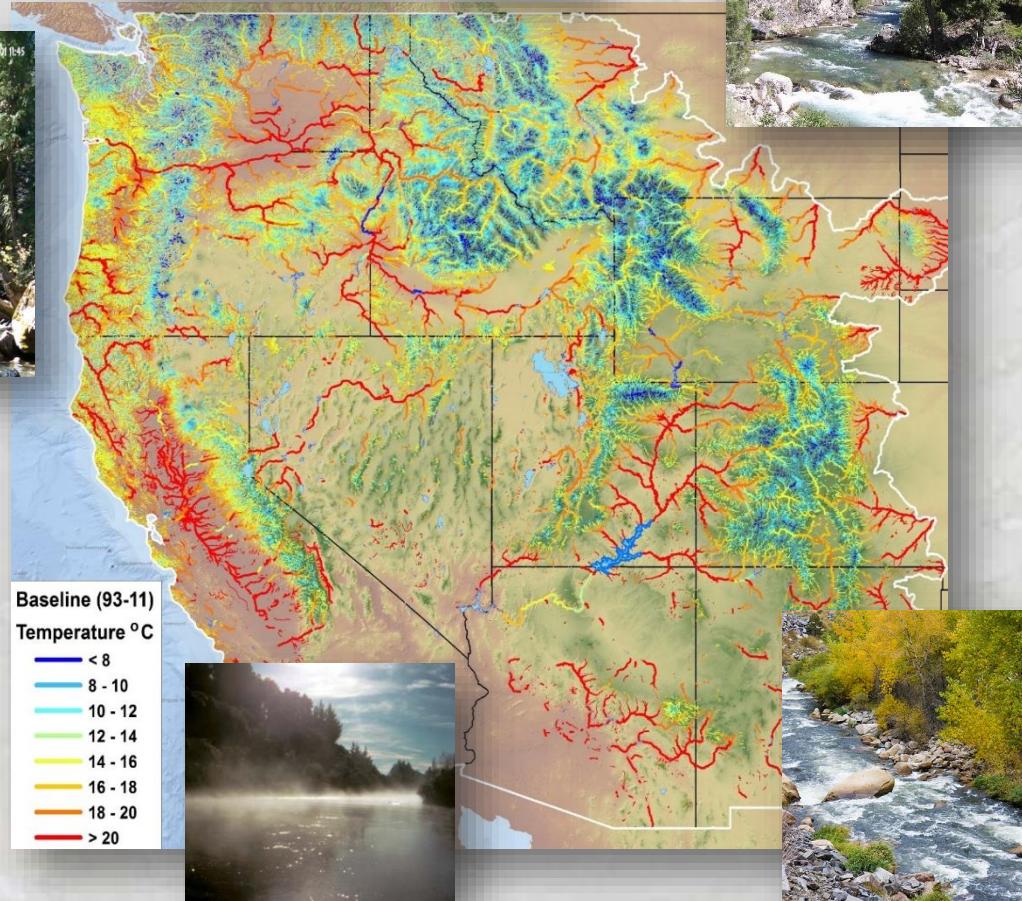
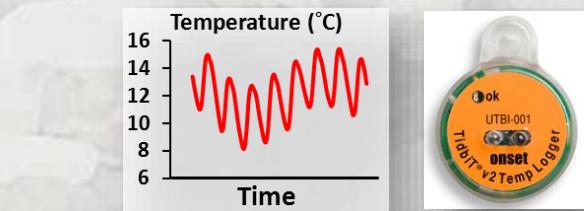


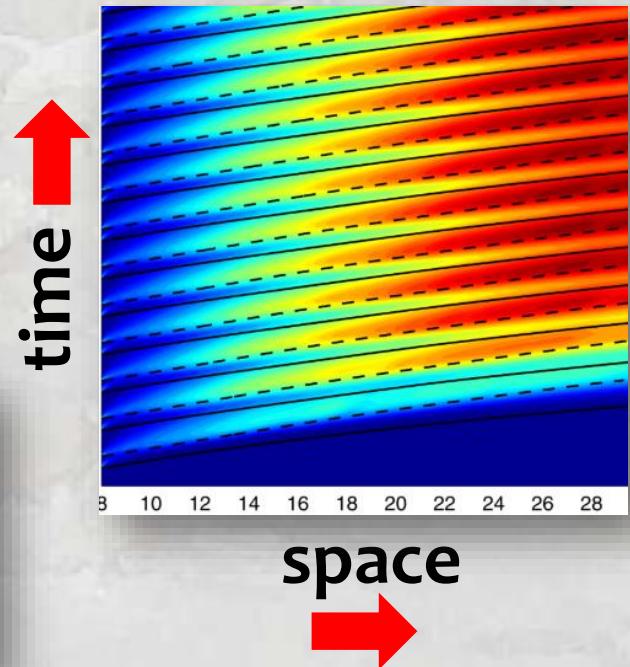
Thermal Regimes of Western Rivers & Streams

Dan Isaak, Charlie Luce, Dona Horan, Gwynne Chandler, Sherry Wollrab

Boise Aquatic Sciences Laboratory
US Forest Service, Boise, ID



Staab, AqS team
& R6 hydros &
fish bios



Flow Regimes as a Reference Point

The Natural Flow Regime

A paradigm for river conservation and restoration

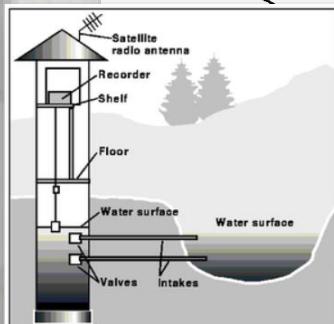
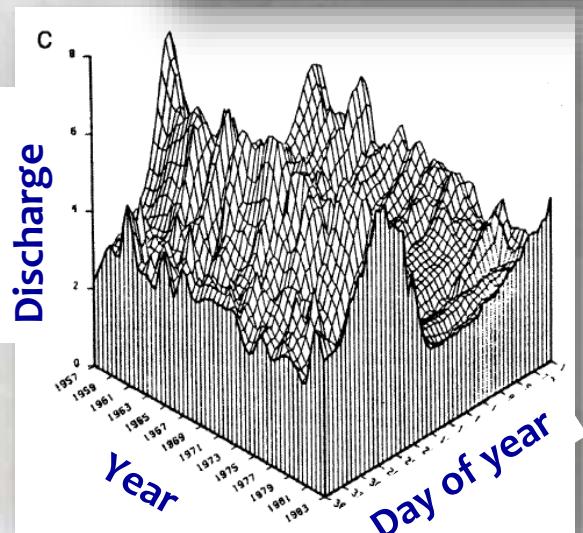
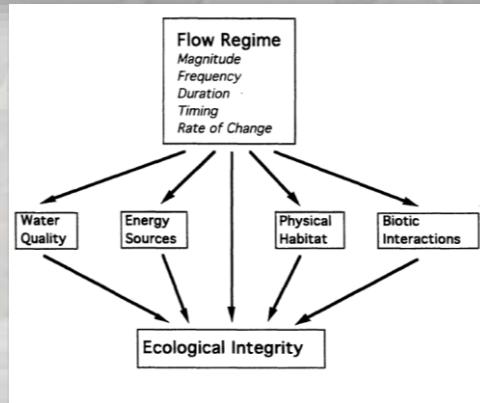
N. LeRoy Poff, J. David Allan, Mark B. Bain, James R. Karr, Karen L. Prestegard, Brian D. Richter, Richard E. Sparks, and Julie C. Stromberg



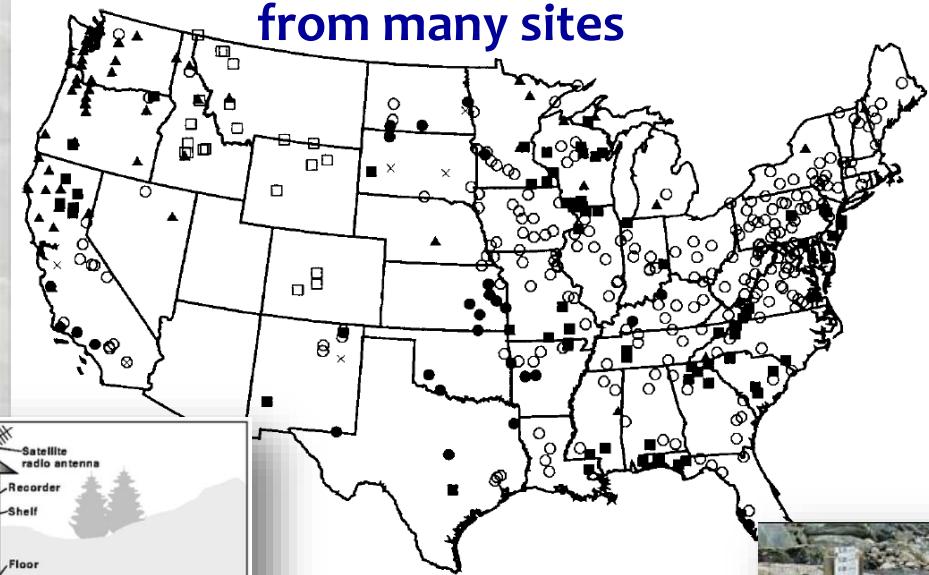
N LeRoy Poff

Professor, Colorado State University
Verified email at lamar.colostate.edu

riverine conservation hydro-ecology
freshwater climate adaptation

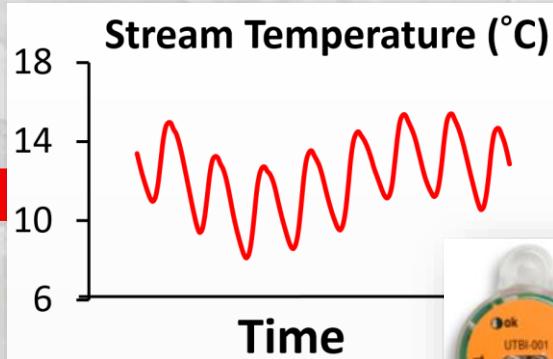
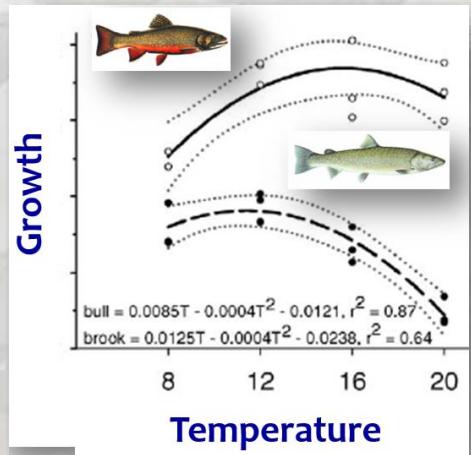


Annual monitoring datasets
from many sites



Thermal Regimes ~ Importance of Flow Regimes

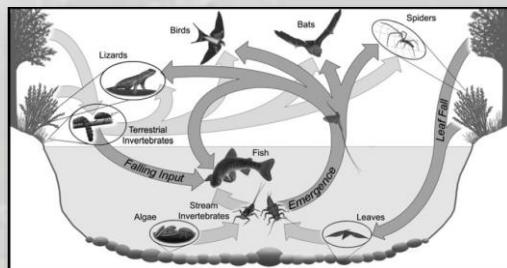
Ectotherm physiology



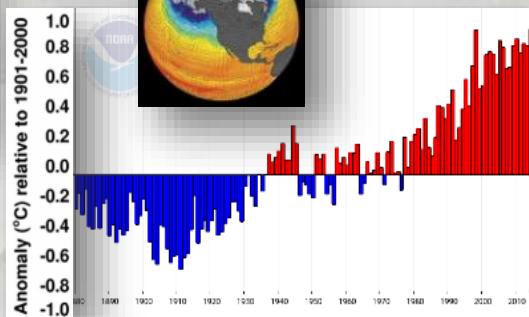
TMDL standards & regulations



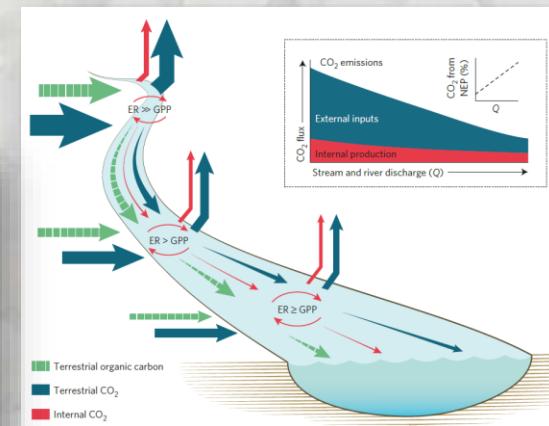
Stream metabolism & ecosystem function



Global warming



Greenhouse gas emissions from streams



Thermal Regimes Understood Conceptually but not Empirically

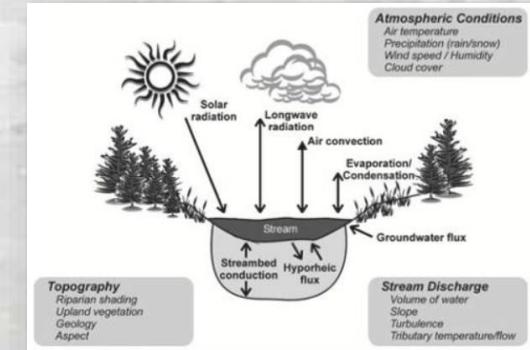
Freshwater Biology (2006) 51, 1389–1406

REVIEW ARTICLE

The thermal regime of rivers: a review

D. CAISSIE

Fisheries and Oceans, Oceans and Sciences Branch, Moncton,

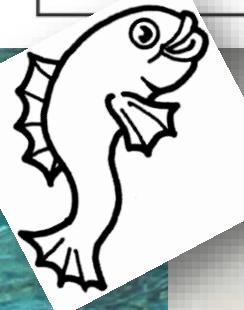
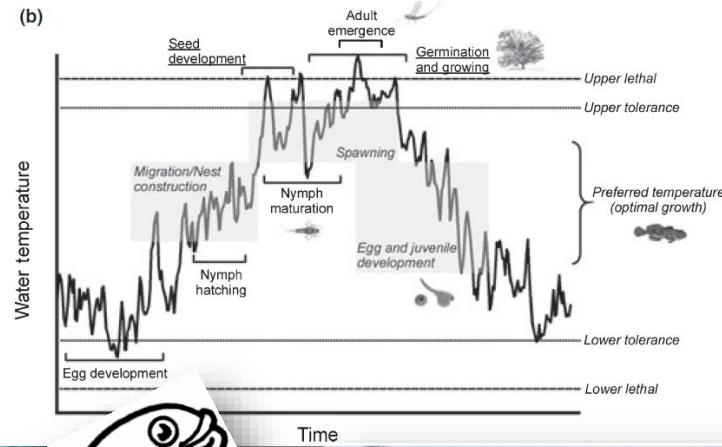


Thermal characteristics of running waters

J. V. Ward

Department of Zoology, Colorado State University, Fort Collins, CO 80253, USA

Hydrobiologia 125, 31–46 (1985).



Freshwater Biology (2009)

doi:10.1111/j.1365-2427.2009.02179.x

Incorporating thermal regimes into environmental flows assessments: modifying dam operations to restore freshwater ecosystem integrity

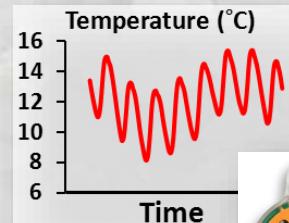
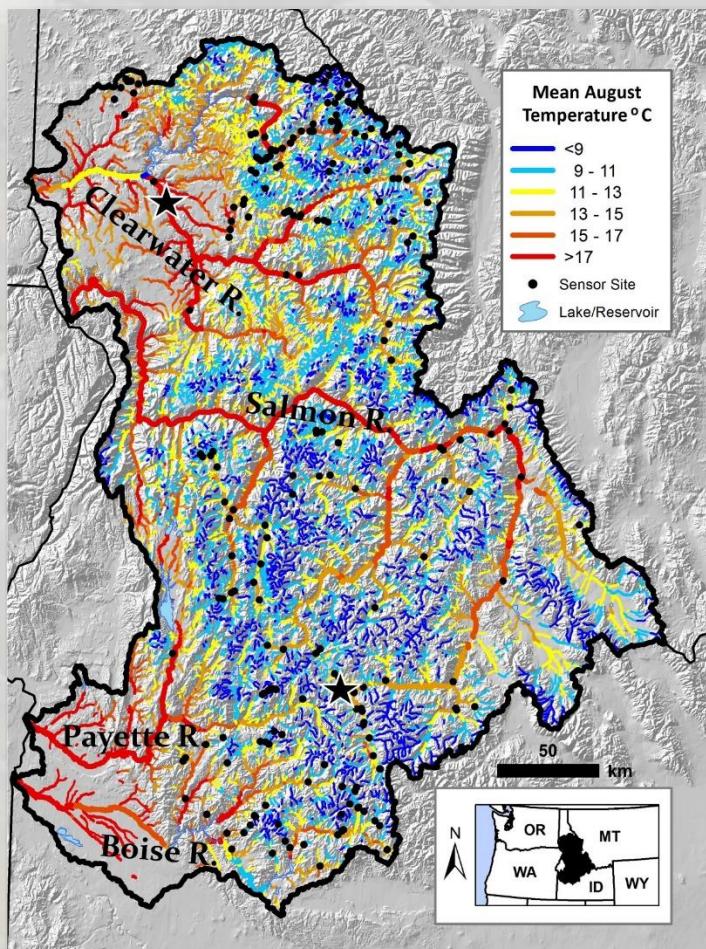
JULIAN D. OLDEN AND ROBERT J. NAIMAN

Empirical Descriptions Limited

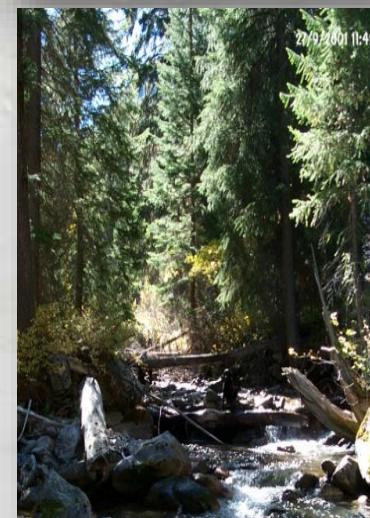
- Small, localized datasets
- Summer data primarily

Thermal Regime Study #1

- 226 stream & river sites
- Five-year annual records (2011-2015)
- Mountain networks in Idaho
- USFS lands, wilderness, <10% private

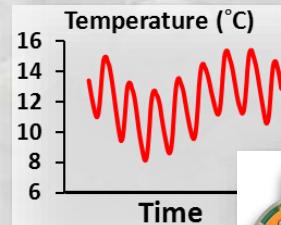


NorWeST
Stream Temp

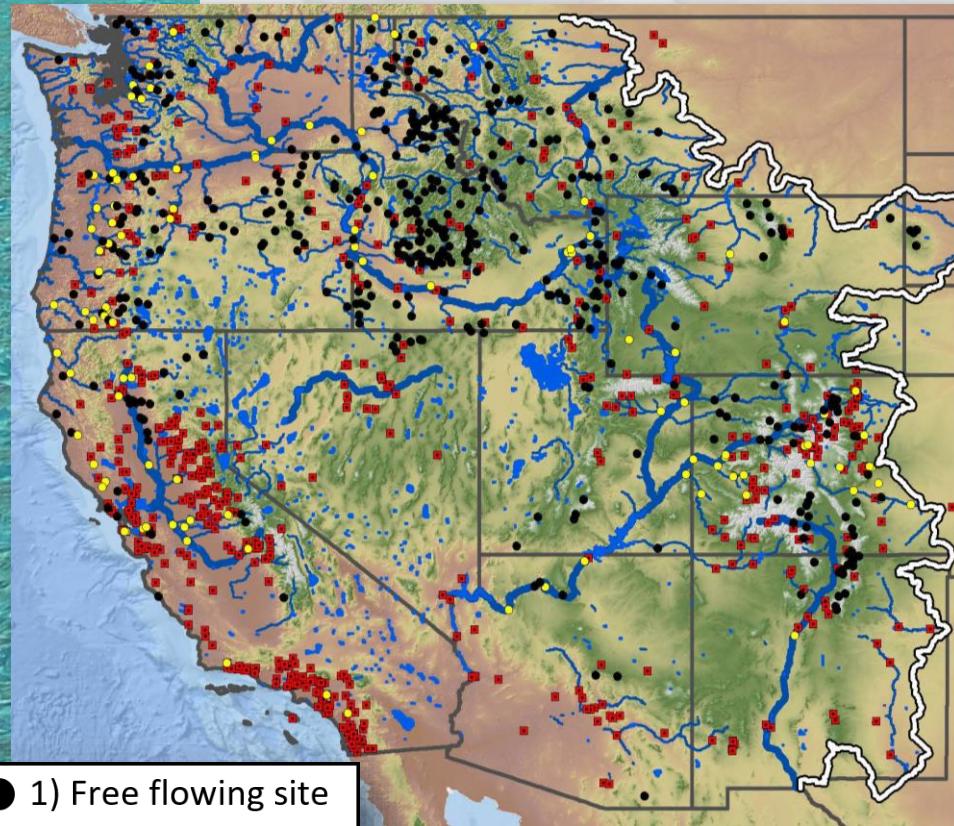


Thermal Regime Study #2

- 578 stream & river sites
- Five-year annual records (2011-2015)
- Networks across the western U.S.
- All lands, regulated and unregulated



NorWeST
Stream Temp



- 1) Free flowing site
- 2) Dam affected site
- 3) Dam > 30 m



Methods

Summarize temperature records via 34 descriptive metrics in five categories

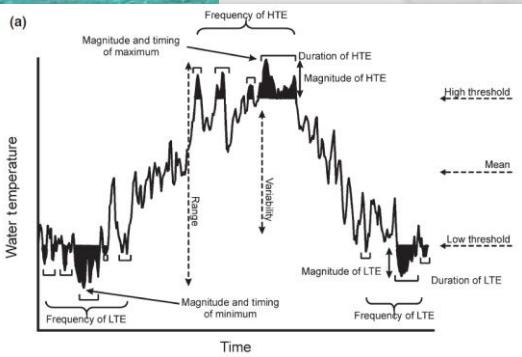
Magnitude (e.g., mean annual, mean summer, minimum weekly, maximum daily, etc.)

Variability (e.g., annual SD, spring SD, range in annual min/max, etc.)

Frequency (e.g., number of days $>20^{\circ}\text{C}$, $<2^{\circ}\text{C}$)

Timing (e.g., date of 5%, 25%, 50%, 75%, & 95% degree days)

Duration (e.g., growing season length, number of consecutive days $>20^{\circ}\text{C}$, $<2^{\circ}\text{C}$)



PCA (Principal components analysis) on metrics

PCA on mean daily temperatures at sites (S-mode PCA)

Hierarchical cluster analysis on metrics

Multiple linear regression models to predict PC scores from covariates & map regime characteristics

Study 1. Dataset Description

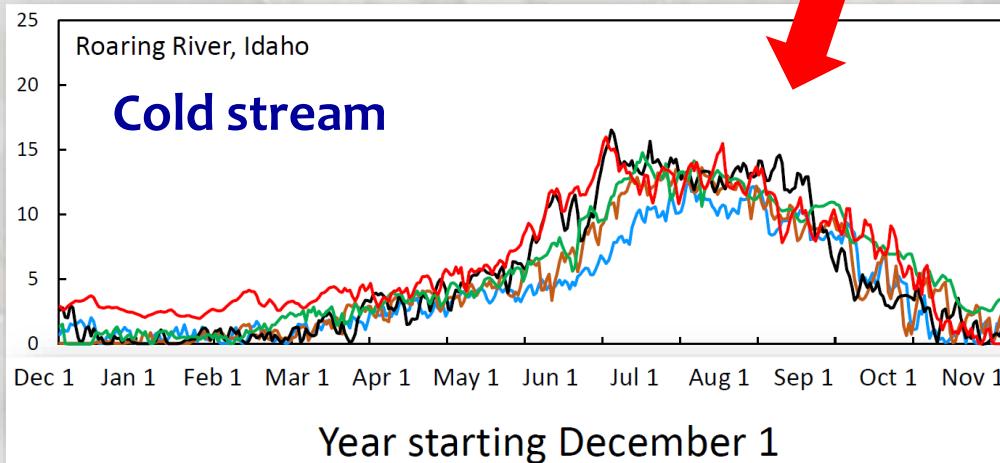
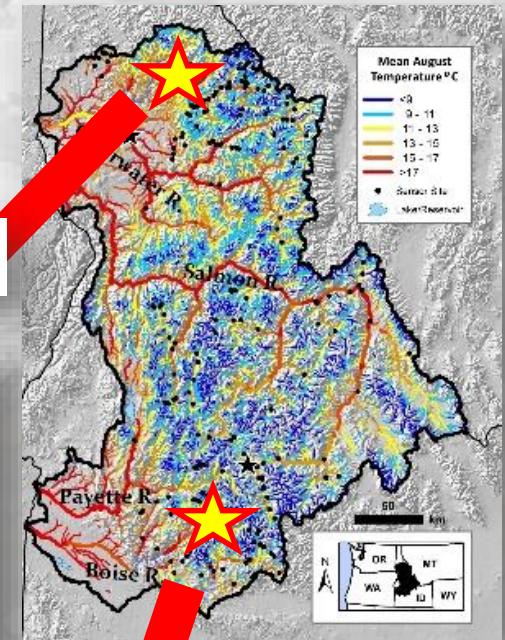
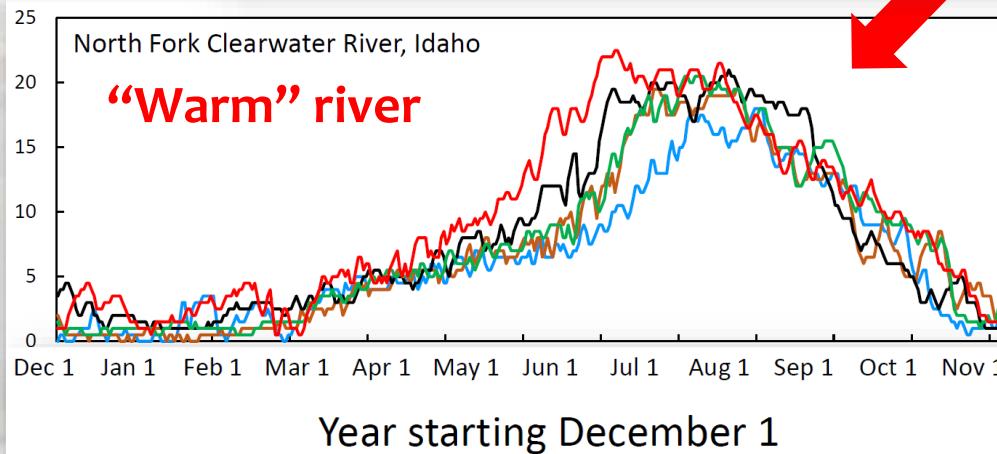
Thermal year: 2011: 2012:

2013:

2014:

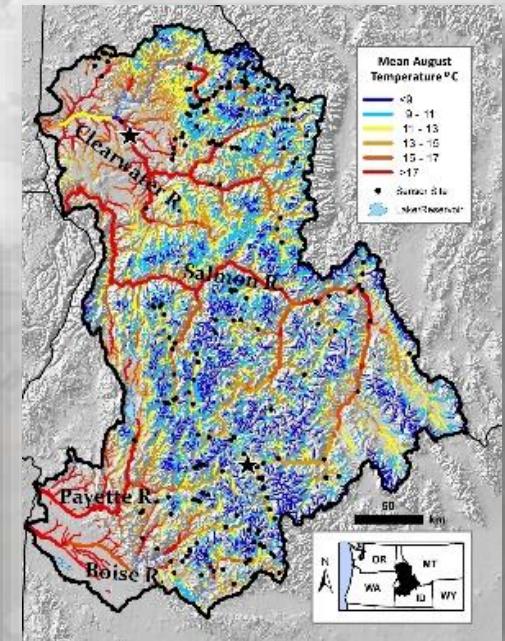
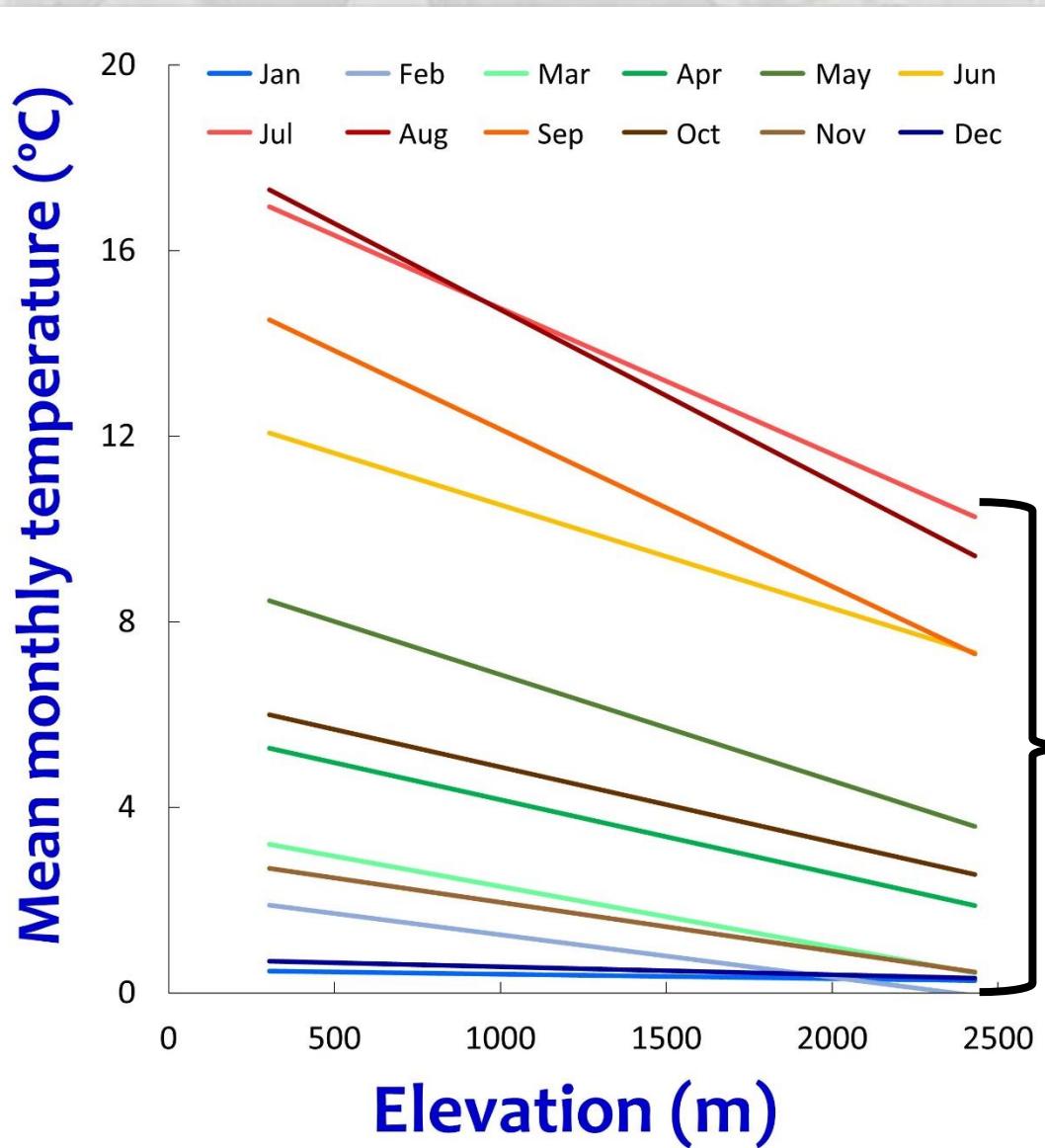
2015:

Mean Daily Temperature (°C)



Study 1. Dataset Description

Annual cycle @ 226 sites in 2013



Higher, colder sites
are less climatically
sensitive

PCA on Thermal Metrics

1) Three PCs account for 88% of total variation

2) Many metrics are highly redundant

3) Interpretations:

- PC1 (49.0%) = magnitude & variability
- PC2 (29.0%) = length of growing season & minimum winter temps

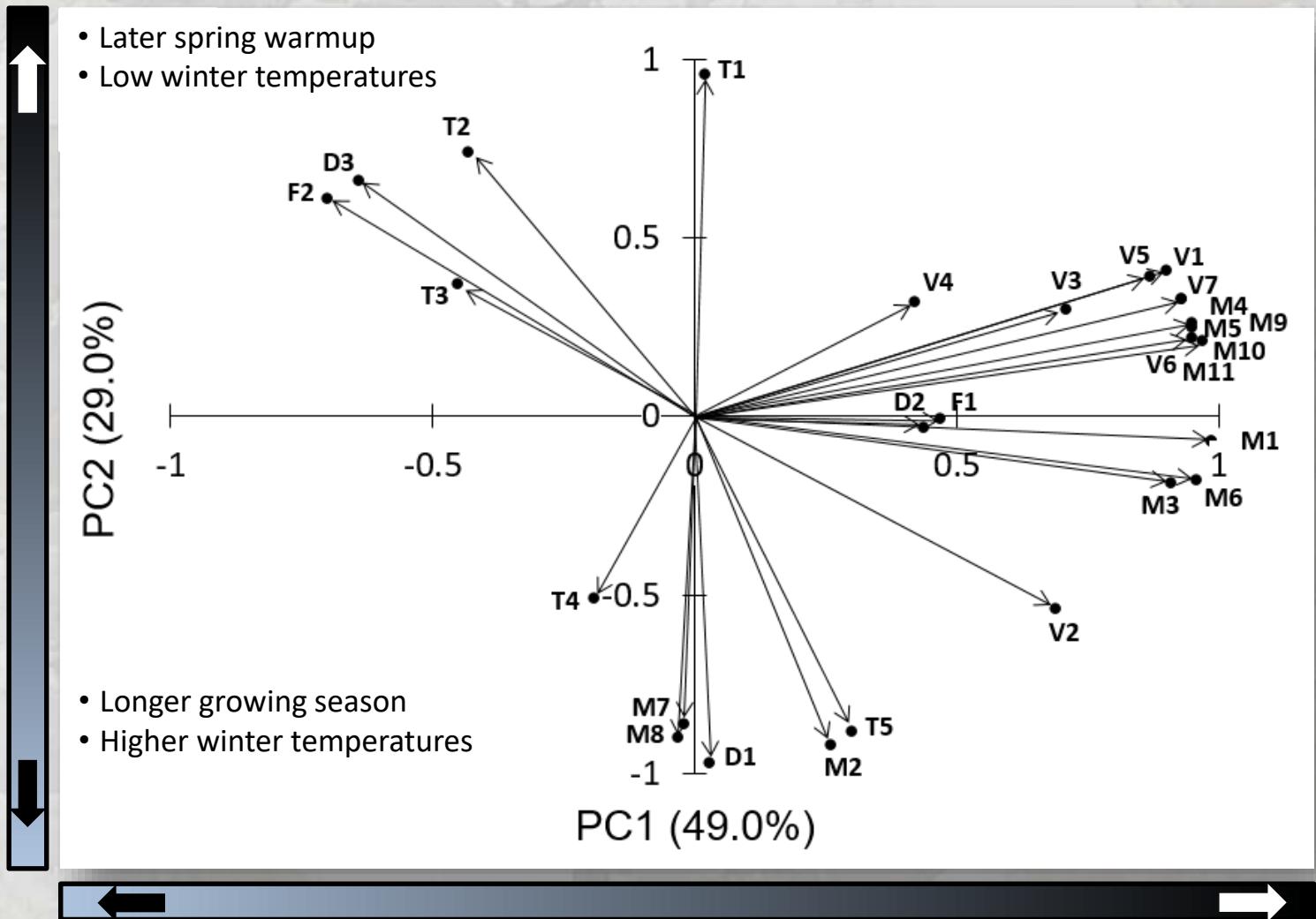
Temperature metric	PC1	PC2	PC3
M1. Mean annual temperature	0.99	-0.07	-0.05
M2. Mean winter temperature	0.26	-0.92	0.14
M3. Mean spring temperature	0.91	-0.19	-0.25
M4. Mean summer temperature	0.97	0.21	-0.06
M5. Mean August temperature*	0.95	0.22	0.16
M6. Mean fall temperature	0.96	-0.18	0.14
M7. Minimum daily temperature	-0.02	-0.86	0.08
M8. Minimum weekly average temperature	-0.03	-0.90	0.08
M9. Maximum daily temperature	0.95	0.26	0.09
M10. Maximum weekly average temperature	0.95	0.25	0.09
M11. Annual degree days	0.99	-0.07	-0.05
V1. Annual standard deviation	0.90	0.41	0.01
V2. Winter standard deviation	0.69	-0.54	0.16
V3. Spring standard deviation	0.71	0.30	-0.55
V4. Summer standard deviation	0.42	0.32	0.78
V5. Fall standard deviation	0.87	0.39	0.19
V6. Range in extreme daily temperatures	0.93	0.33	0.08
V7. Range in extreme weekly temperatures	0.93	0.33	0.08
F1. Frequency of hot days	0.47	-0.01	0.30
F2. Frequency of cold days	-0.70	0.61	0.09
T1. Date of 5% of degree days	0.02	0.96	-0.10
T2. Date of 25% of degree days	-0.43	0.74	0.46
T3. Date of 50% of degree days	-0.45	0.37	0.79
T4. Date of 75% of degree days	-0.19	-0.51	0.72
T5. Date of 95% of degree days	0.30	-0.88	0.12
D1. Growing season length	0.03	-0.97	0.11
D2. Duration of hot days	0.44	-0.03	0.32
D3. Duration of cold days	-0.64	0.66	0.07

Variance explained (%): **49.0%** **29.0%** **9.8%**

Cumulative variance (%): **49.0%** **78.0%** **87.8%**

PCA on Thermal Metrics

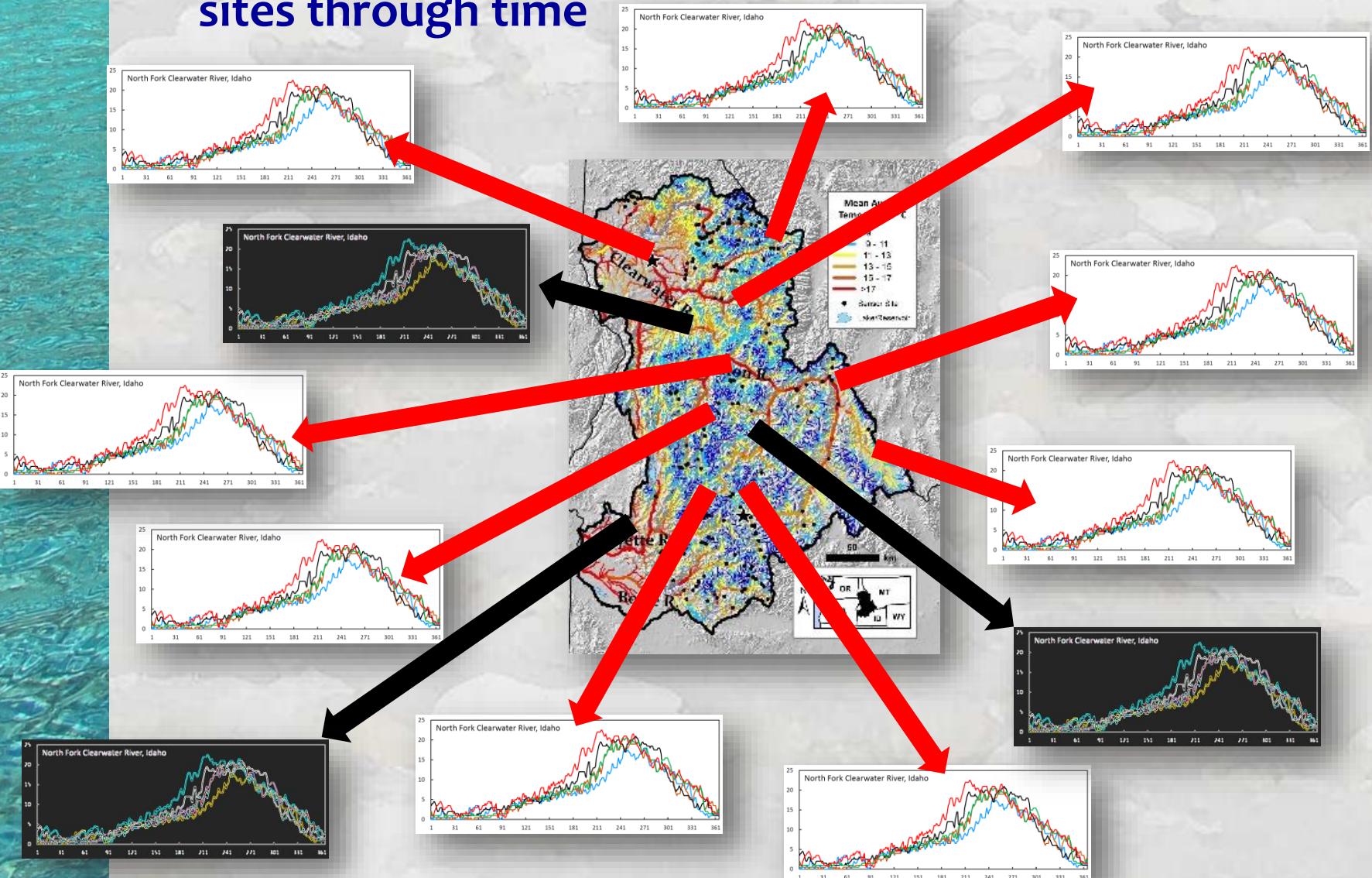
Ordination plot of metrics describing regimes



- Warmer
- More variable

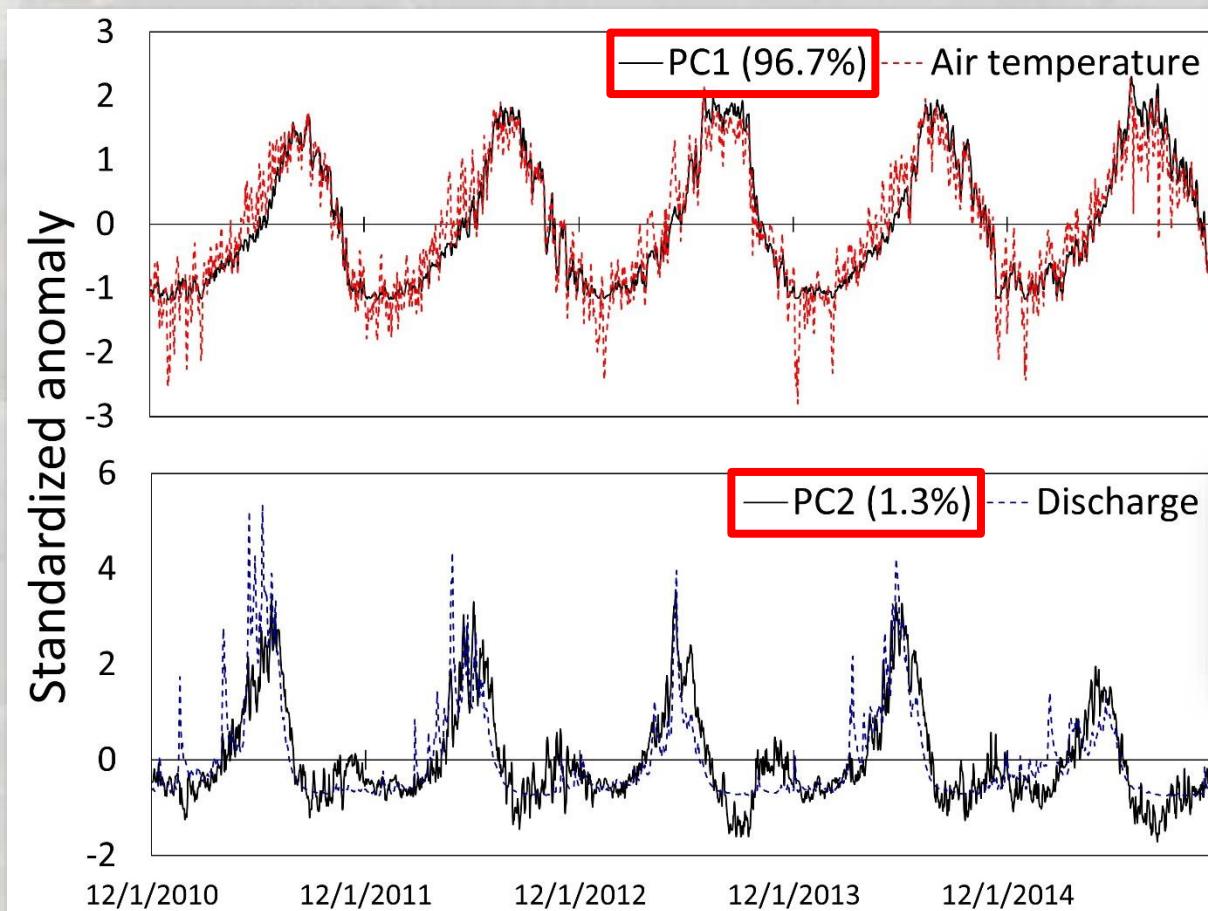
PCA on Mean Daily Temps @ 226 Sites

“S-mode” PCA describes covariation among sites through time



PCA on Mean Daily Temps @ 226 Sites

- Two PCs account for 98% of variation
- PC1 correlates with daily air temperature
- PC2 correlates with daily discharge

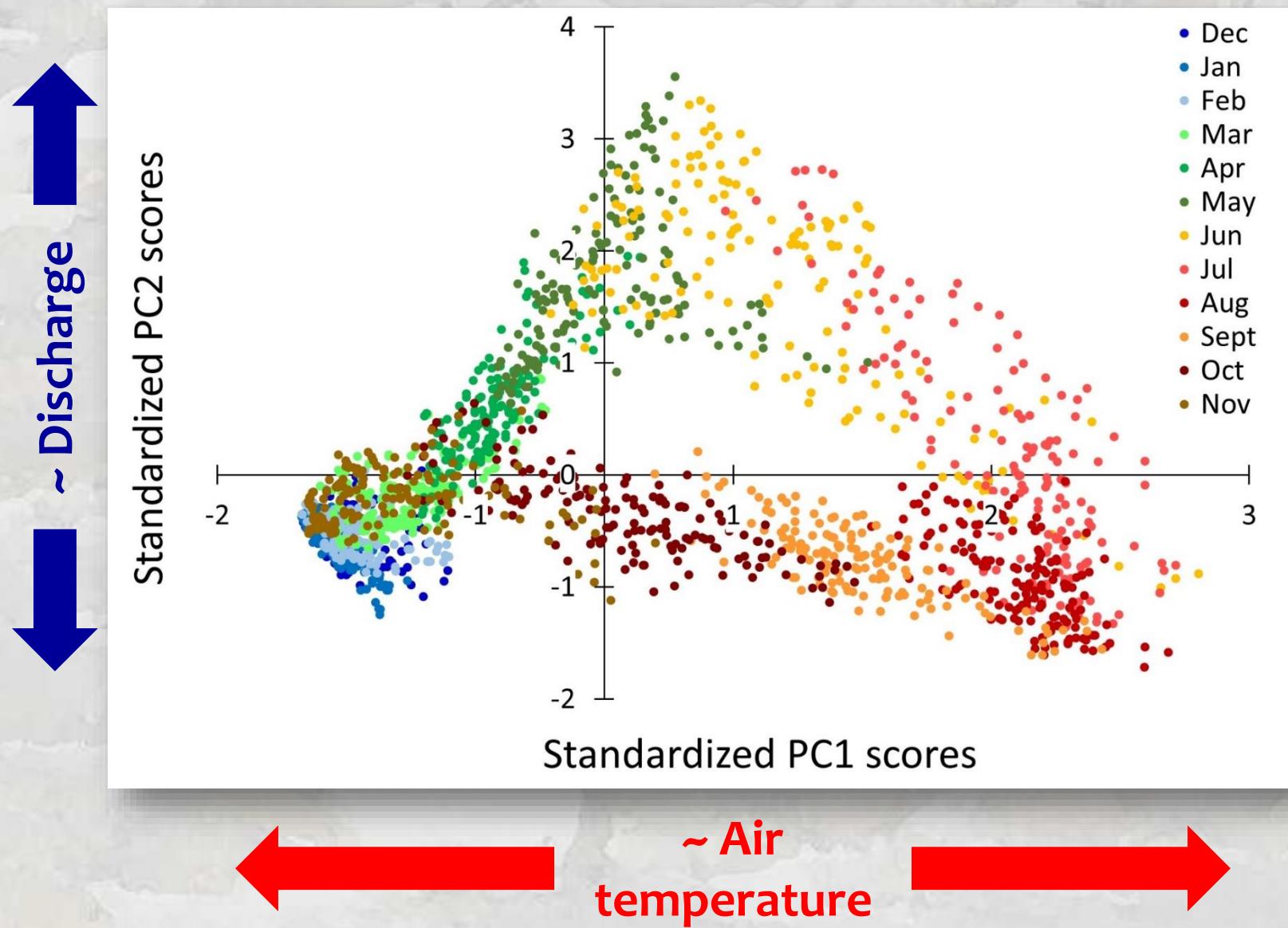


	Discharge	Air
Air	0.14	-
PC1	-0.05	0.94
PC2	0.83	0.18



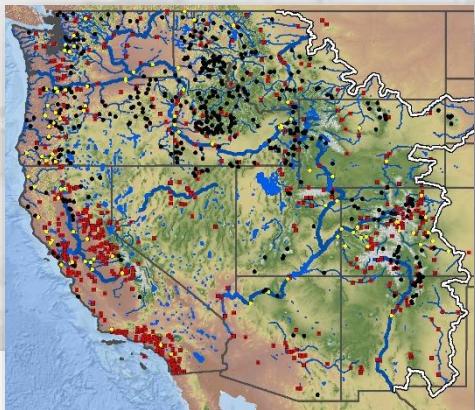
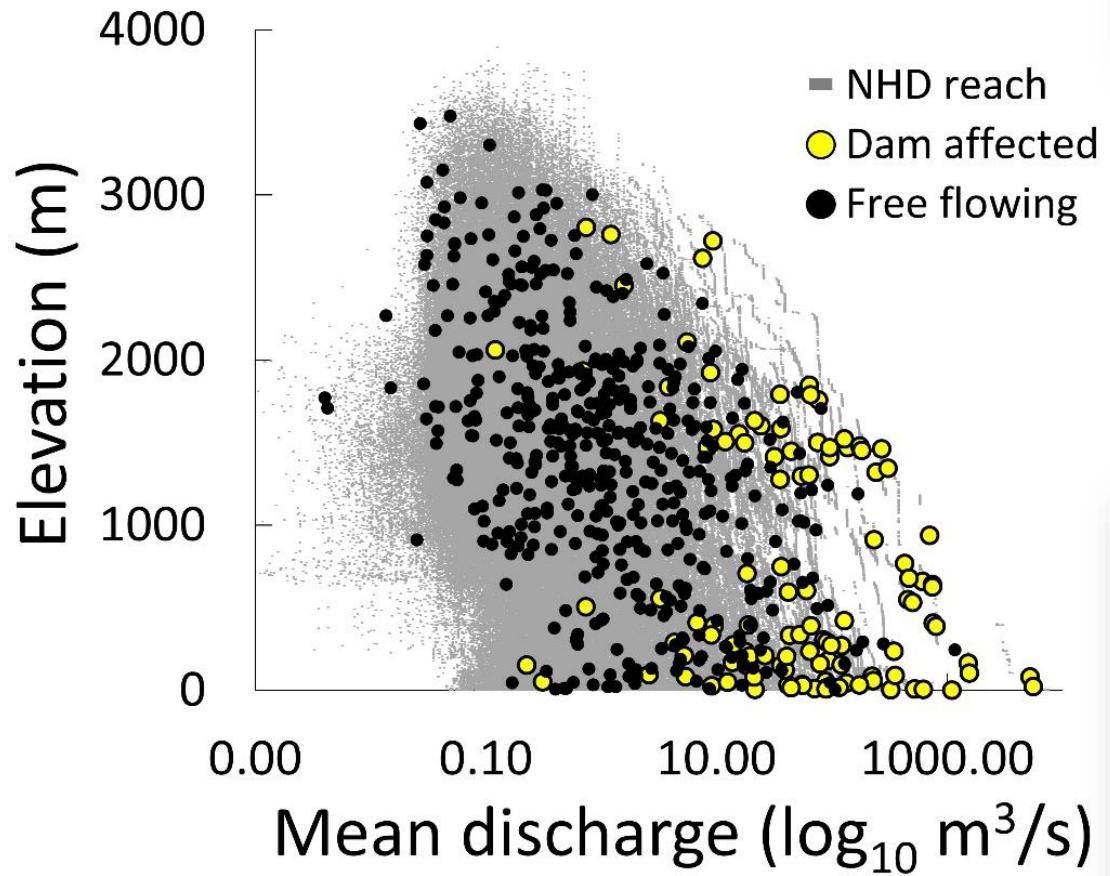
Five year period

PCA on Mean Daily Temps @ 226 Sites



Study 2. Dataset Description

- Same five year period of 2011-2015
- 578 stream & river sites



PCA on Thermal Metrics

1) Three PCs account for 81% of total variation

2) Many metrics are highly redundant

3) Interpretations:

- PC1 (46.1%) = magnitude, frequency, timing, & duration
- PC2 (27.9%) = variability
- PC3 (7.1%) = inter-annual variability in magnitude & timing



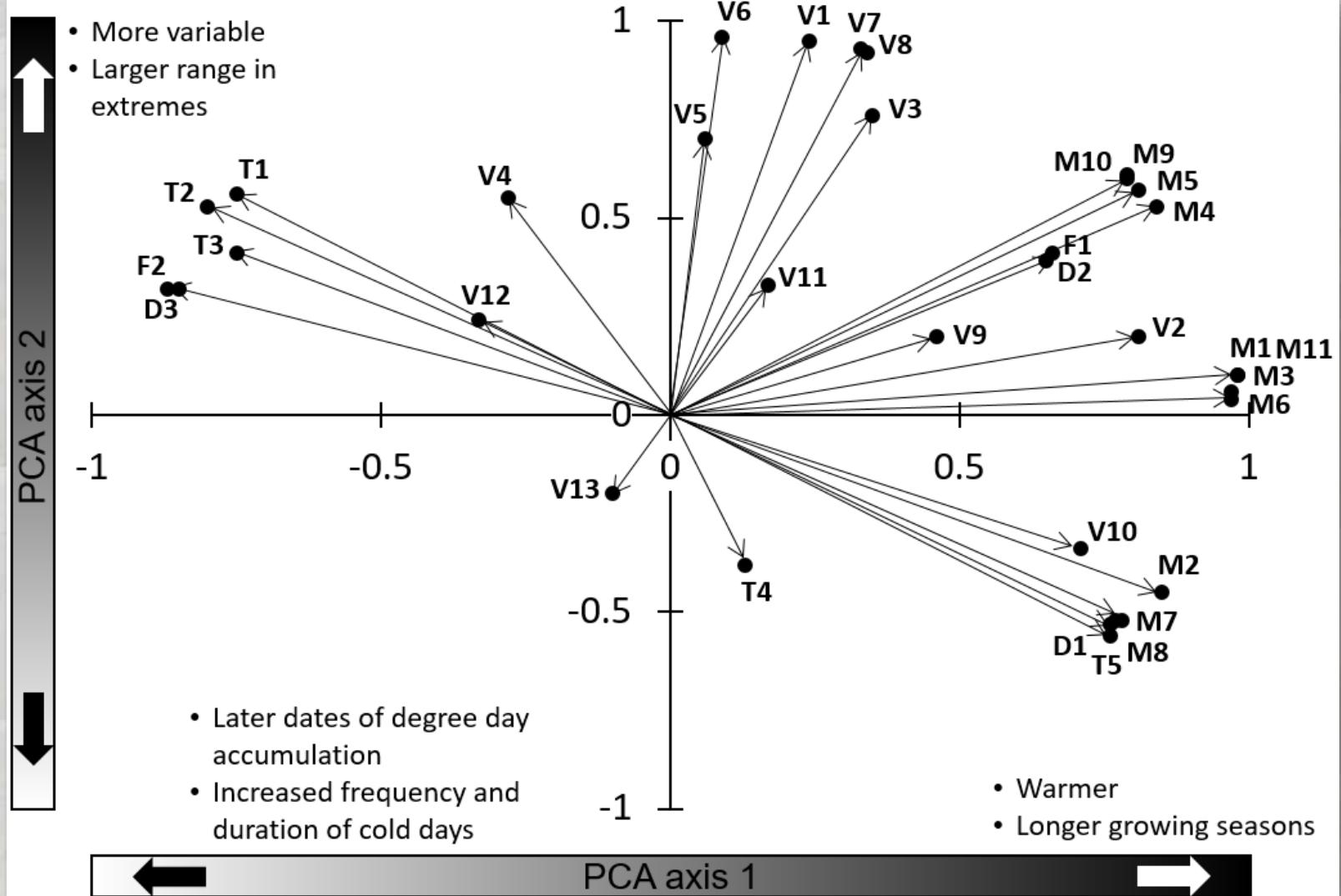
Temperature metric	PC1	PC2	PC3
M1. Mean annual temperature	0.98	0.10	-0.04
M2. Mean winter temperature	0.85	-0.45	0.02
M3. Mean spring temperature	0.97	0.06	-0.13
M4. Mean summer temperature	0.84	0.53	-0.07
M5. Mean August temperature	0.81	0.57	0.05
M6. Mean fall temperature	0.97	0.03	0.06
M7. Minimum daily temperature	0.77	-0.53	0.01
M8. Minimum weekly average temperature	0.78	-0.53	0.02
M9. Maximum daily temperature	0.79	0.60	0.02
M10. Maximum weekly average temperature	0.79	0.60	0.02
M11. Annual degree days	0.98	0.10	-0.04
V1. Annual SD	0.24	0.95	-0.03
V2. Winter SD	0.82	0.19	0.05
V3. Spring SD	0.36	0.76	-0.27
V4. Summer SD	-0.29	0.55	0.54
V5. August SD	0.06	0.71	0.15
V6. Fall SD	0.10	0.96	-0.01
V7. Range in extreme daily temperatures	0.34	0.92	0.02
V8. Range in extreme weekly temperatures	0.33	0.93	0.02
V9. Inter-annual SD of mean annual temperature	0.46	0.21	0.74
V10. Inter-annual SD of minimum weekly temperature	0.71	-0.34	0.18
V11. Inter-annual SD of maximum weekly temperature	0.16	0.34	0.45
V12. Inter-annual SD of 5% degree days	-0.34	0.26	0.42
V13. Inter-annual SD of 50% degree days	-0.12	-0.19	0.75
F1. Frequency of hot days	0.66	0.43	-0.14
F2. Frequency of cold days	-0.87	0.32	-0.06
T1. Date of 5% degree days	-0.75	0.56	-0.11
T2. Date of 25% degree days	-0.80	0.53	0.11
T3. Date of 50% degree days	-0.75	0.41	0.31
T4. Date of 75% degree days	0.13	-0.38	0.52
T5. Date of 95% degree days	0.76	-0.53	0.17
D1. Growing season length	0.76	-0.56	0.12
D2. Duration of hot days	0.65	0.40	-0.14
D3. Duration of cold days	-0.85	0.32	-0.07

Variance explained (%): **46.1** **27.9** **7.1**

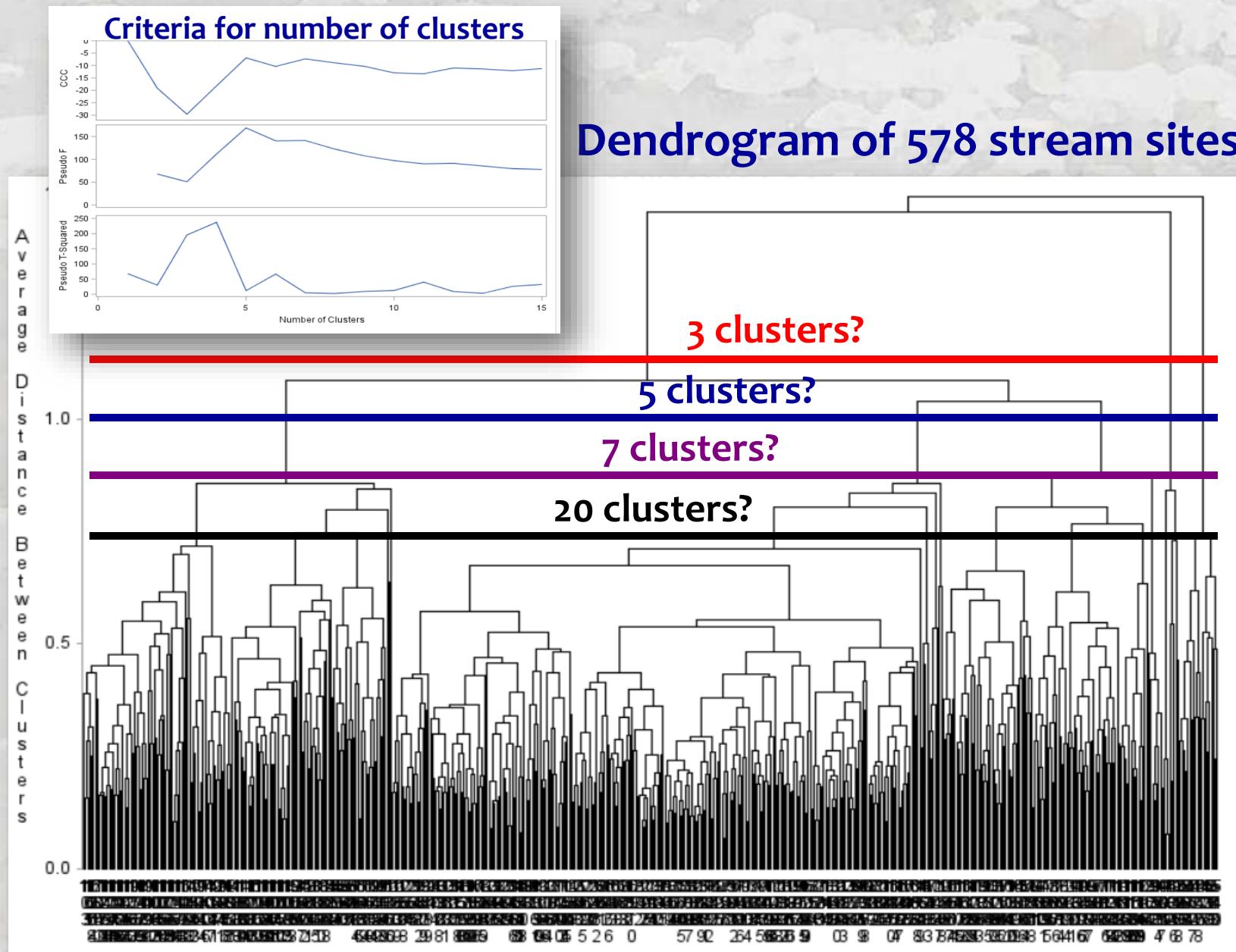
Correlation coefficients (PC1): **0.98** **0.85** **0.97**

PCA on Thermal Metrics

Ordination plot of metrics describing regimes

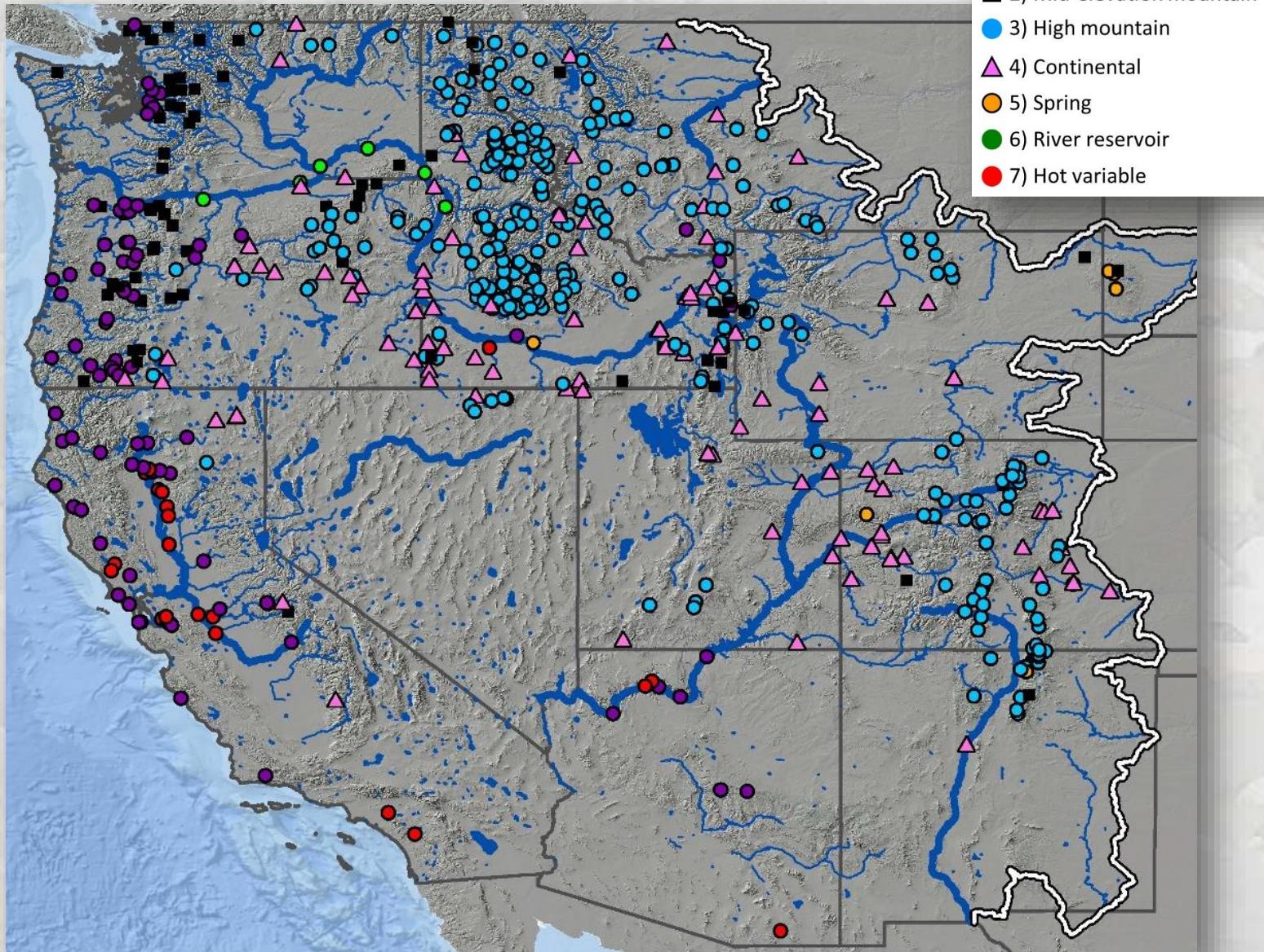


Cluster Analysis on Thermal Metrics



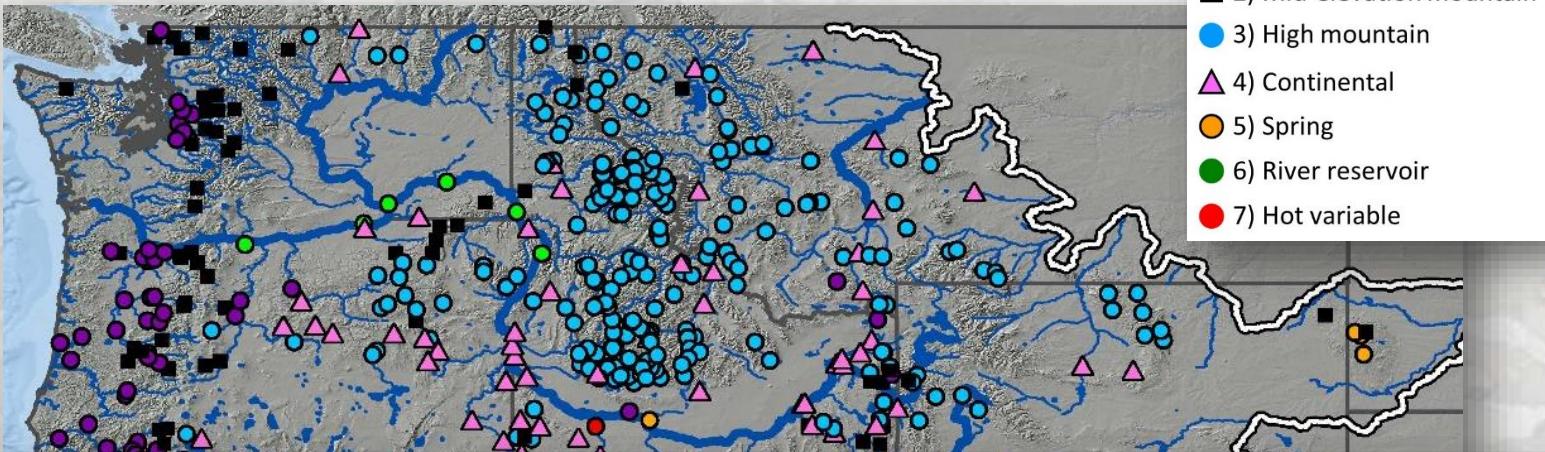
Cluster Analysis on Thermal Metrics

7 cluster regime map

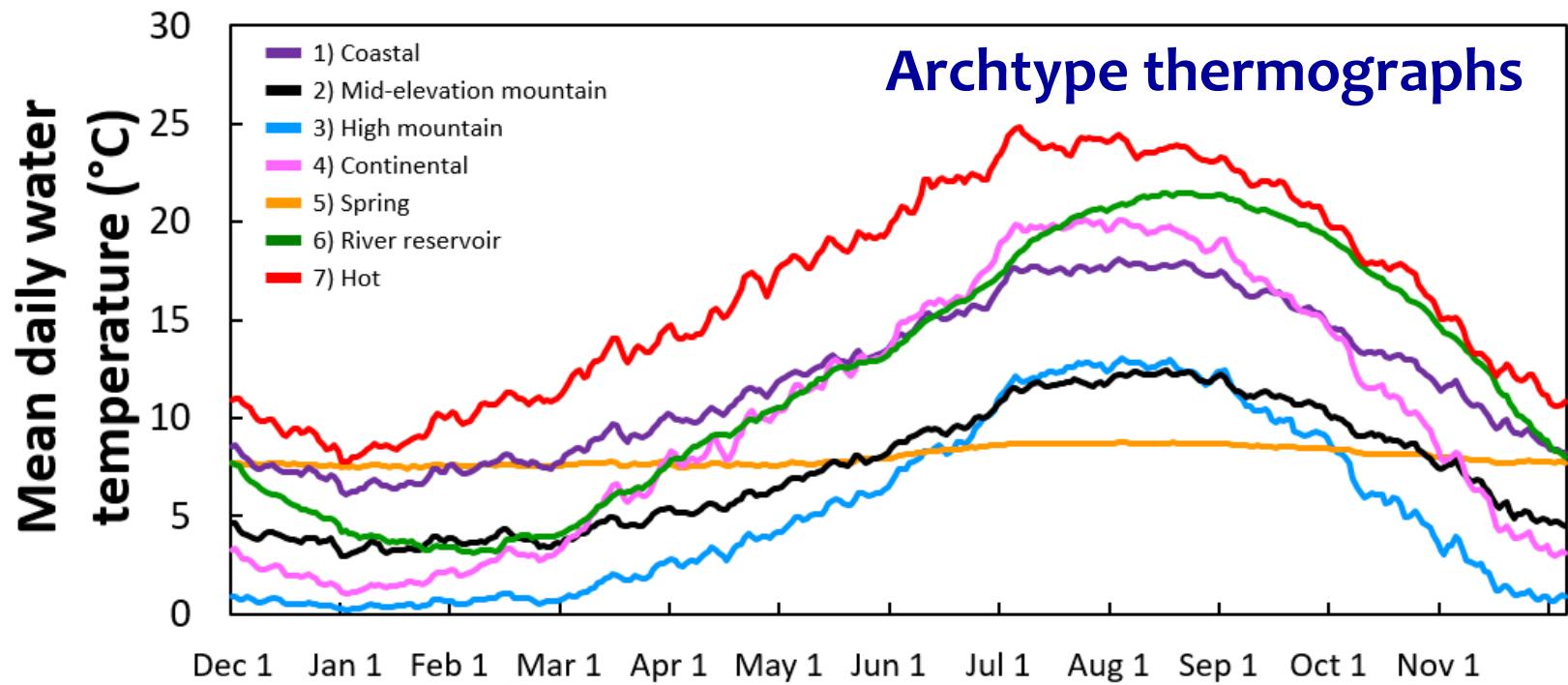


Cluster Analysis on Thermal Metrics

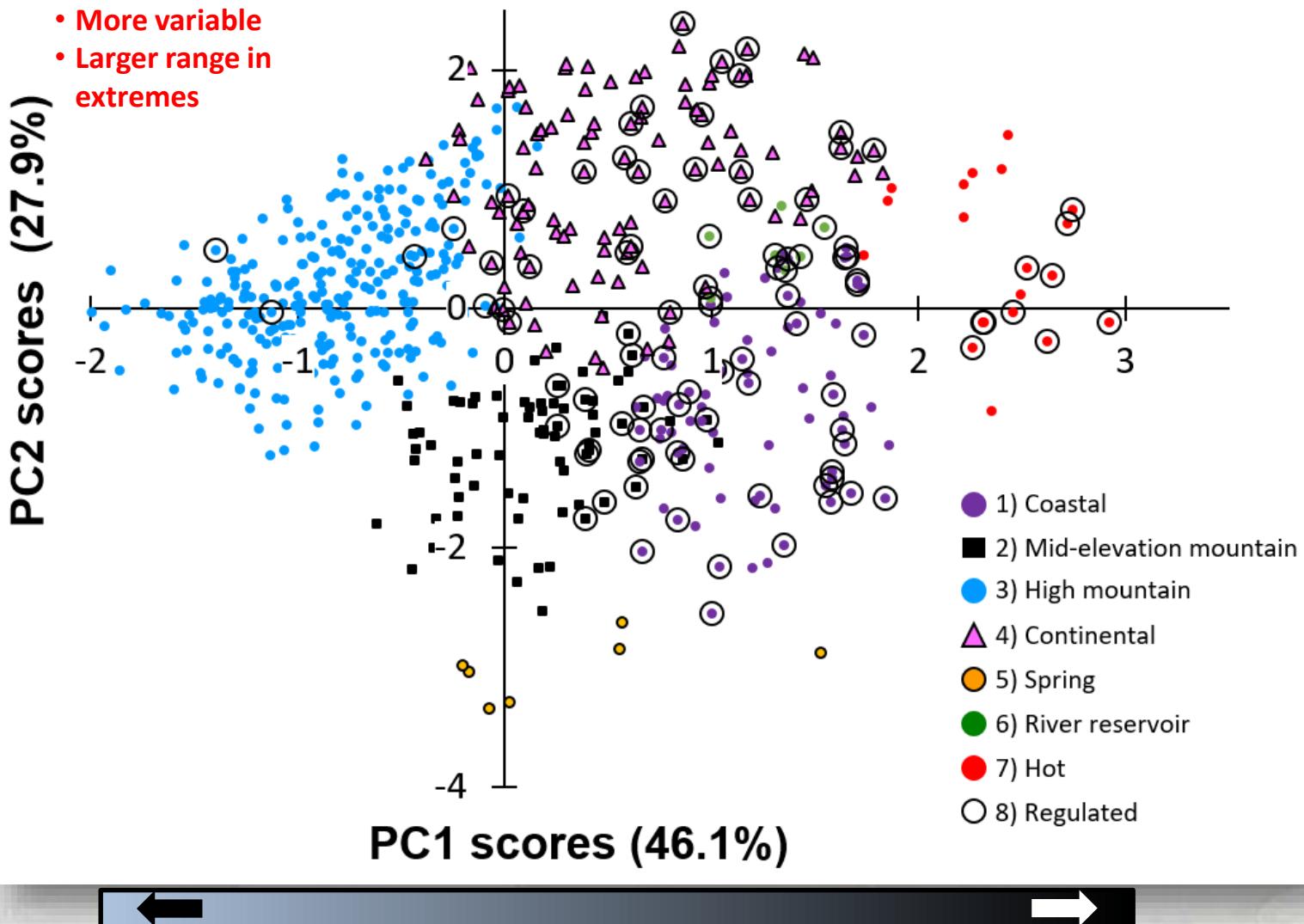
7 cluster regime map



Archetype thermographs



Ordination plot of Site PC scores by Cluster



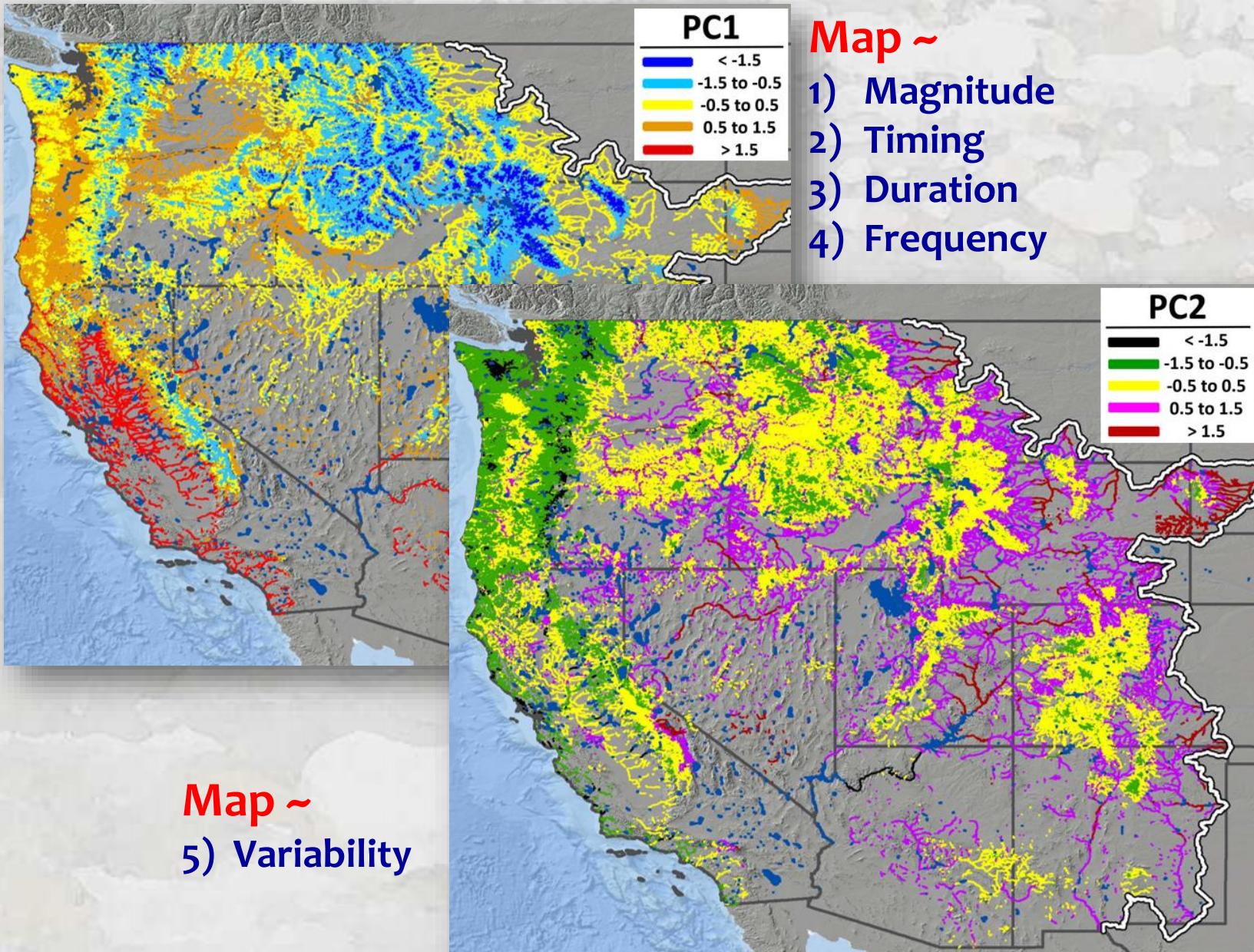
- Later dates of degree day accumulation
- Increased frequency and duration of cold days

- Warmer
- Longer growing seasons

Multiple Regressions of PC1 and PC2 Scores

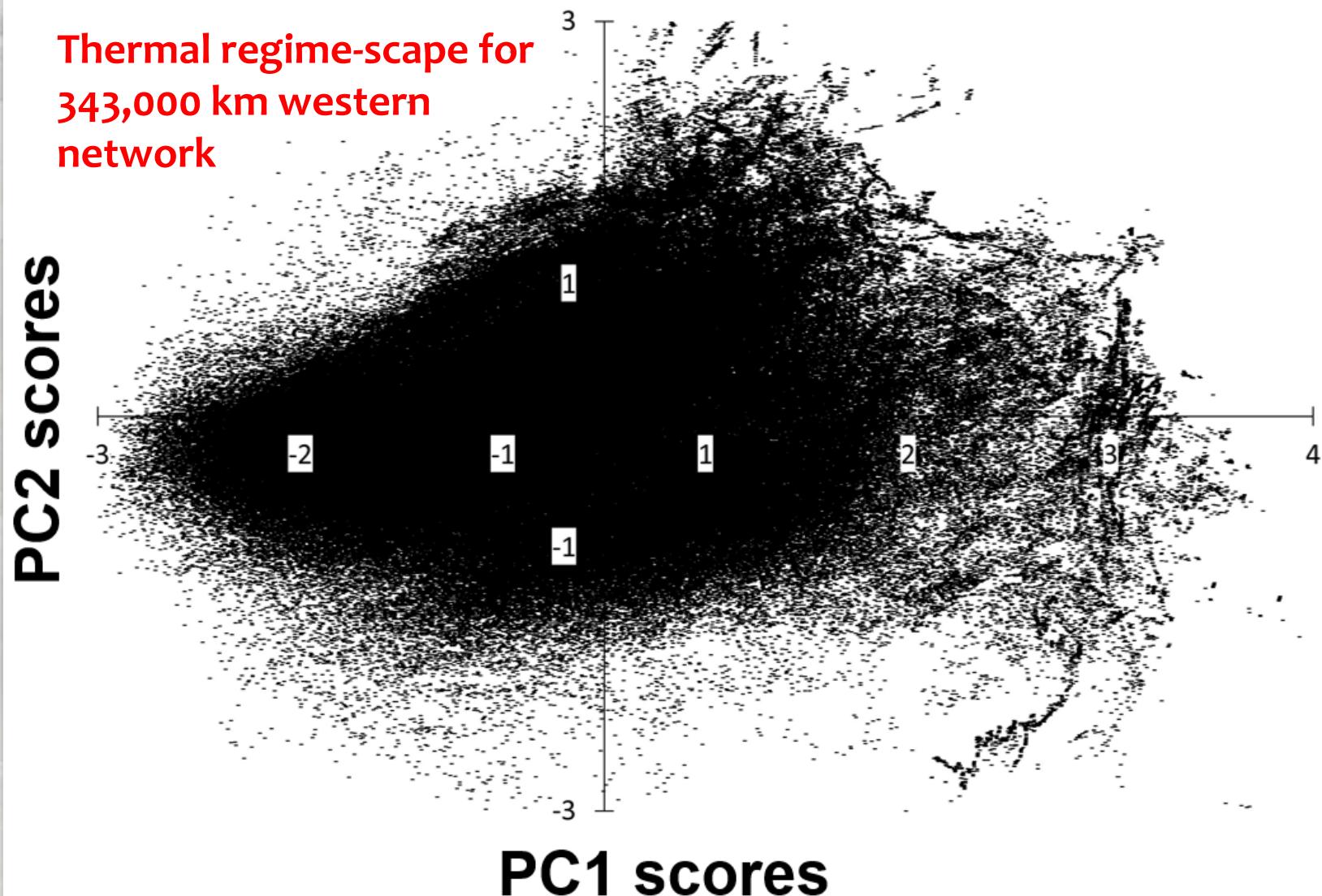
Model	Covariate	b (SE)	t	p-value	r^2
PC1	Intercept	7.36 (0.23)	31.4	< 0.01	0.87
	Elevation	-0.00104 (0.0000239)	-43.6	< 0.01	
	Latitude	-0.129 (0.00528)	-24.5	< 0.01	
	Riparian canopy	-0.00593 (0.000683)	-8.68	< 0.01	
	Reach slope	-3.32 (0.584)	-5.69	< 0.01	
	Annual precipitation	-0.000200 (0.0000385)	-5.20	< 0.01	
	Lake	0.0671 (0.0153)	4.38	< 0.01	
	Dam height	0.00213 (0.00114)	1.88	< 0.01	
	Dam height²	-0.0000203 (7.02 x 10⁻⁶)	-2.89	0.06	
PC2	Intercept	-11.1 (0.567)	-19.5	< 0.01	0.63
	August stream temperature	0.276 (0.010)	27.6	< 0.01	
	Elevation	0.00107 (0.0000518)	20.7	< 0.01	
	Latitude	0.120 (0.0115)	10.4	< 0.01	
	August SD of air temperature	0.381 (0.125)	3.04	< 0.01	
	Riparian canopy	0.00275 (0.00117)	2.34	0.02	
	Drainage area	-1.24 x 10 ⁻⁶ (6.18 x 10 ⁻⁷)	-2.01	0.05	
	Lake	-0.0498 (0.0254)	-1.96	0.05	
	Dam height	-0.00124 (0.000837)	-1.48	0.14	

Prediction Maps of PC1 and PC2 Scores



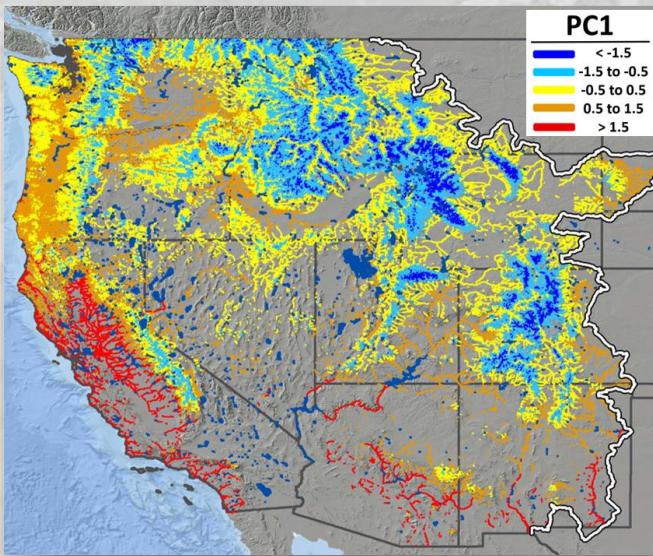
Prediction Maps of PC1 and PC2 Scores

Thermal regime-scape for
343,000 km western
network

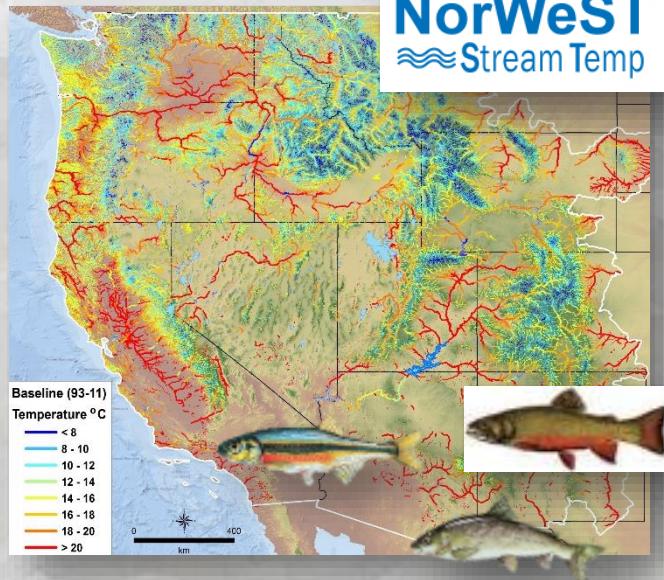
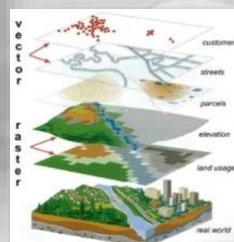


Ecological Relevance of Regime Maps

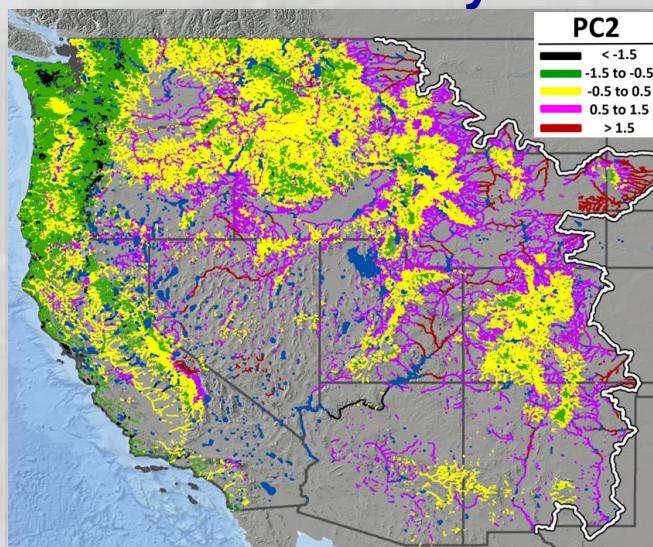
PC1 ~ NorWeST Mean August Scenario



$r = 0.81$



ECOSPHERE



esa

Beyond the mean: The role of variability in predicting ecological effects of stream temperature on salmon

E. ASHLEY STEEL,^{1,†} ABBY TILLOTSON,² DONALD A. LARSEN,² AIMEE H. FULLERTON,² KEITH P. DENTON,² AND BRIAN R. BECKMAN²

Transactions of the American Fisheries Society 132:92–99, 2003
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Assessing Temperature Tolerance of Bonneville Cutthroat Trout
Based on Constant and Cycling Thermal Regimes

HELENE C. JOHNSTONE AND FRANK J. RAHEL*

Key Take Homes:

- 1) Thermal regimes are relatively simple (especially in mountain headwaters). 2-4 PCs or metrics can capture most of the unique “information” about a regime**
- 2) Annual monitoring data capture important regime information missed by summer monitoring**
- 3) Strong temporal covariation among sites suggest monitoring networks can be sparse.**
- 4) Thermal regimes at broad scales largely controlled by geoclimatic factors. Local land-use effects add “residual noise” that is important to understand & jointly consider**
- 5) Next step could be synthetic assessments of stream hydroclimates via integration of flow & thermal regimes (a.k.a. icthyographs writ large)**

For More Information...

Hydrol. Earth Syst. Sci., 22, 6225–6240, 2018
<https://doi.org/10.5194/hess-22-6225-2018>
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Hydrology and
Earth System
Sciences
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Principal components of thermal regimes in mountain river networks

Daniel J. Isaak, Charles H. Luce, Gwynne L. Chandler, Dona L. Horan, and Sherry P. Wollrab
U.S. Forest Service, Rocky Mountain Research Station, Aquatic Sciences Lab, Boise, ID 83702, USA

In review...

Freshwater Biology

Thermal Regimes of Flowing Waters in the Western United States and Their Ecological Implications

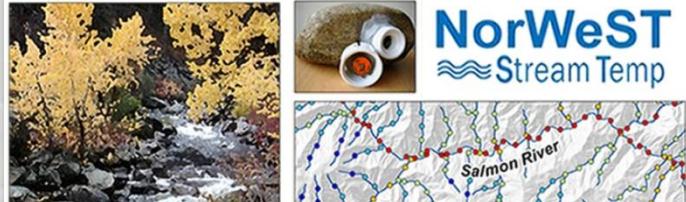
Daniel J. Isaak, Charles H. Luce, Gwynne L. Chandler, Dona L. Horan, and Sherry P. Wollrab
U.S. Forest Service, Rocky Mountain Research Station, Aquatic Sciences Lab, Boise, ID 83702, USA

Websites:

UNITED STATES DEPARTMENT OF AGRICULTURE - U.S. FOREST SERVICE

Rocky Mountain Research Station
Air, Water, & Aquatic Environments Program

ABOUT AWAEE RESEARCH PROJECTS, TOOLS, & DATA PUBLICATIONS CONTACT US



Regional Database and Modeled Stream Temperatures

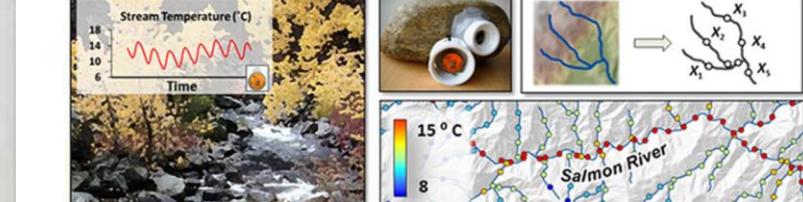
NorWeST Stream Temp

&

UNITED STATES DEPARTMENT OF AGRICULTURE - U.S. FOREST SERVICE

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Stream Temperature Modeling and Monitoring



Much thanks to R6 bios, hydros, & Brian Staab