# Macroinvertebrate Thermal Tolerance Index (MTTI)

Shannon Hubler, Sean Sullivan, Jen Stamp, Mark Fernandez

Western Maritime BCG Workgroup

April 1, 2022

### Background

 Goal: Develop an index to represent thermal tolerances at the assemblage-level

- What it is not: Inferring, or predicting stream temperature
  - There are better methods available, with less error in predictions
- What it is: Realized thermal niche, for an assemblage
  - If every taxon had a vote, what would the temperature be?
  - A single numerical value, on the same scale as state Water Quality Standards

### Building the dataset

- Geographic Area: all of Oregon and Washington
- Temperature: NorWeST modeled summer maximum temperature
  - MWMT = maximum weekly maximum temperature
  - Similar to OR and WA temperature water quality standards
  - 1993-2011 average MWMT vs Annual MWMT
- Bug data: local, state, federal, tribal
- Sites associated with NorWeST flowlines and MWMT (modeled temp)
  - Removed duplicates and non-wadeable sites
  - Calibration (CAL) = 3658 unique sites
  - Validation (VAL) = 603 unique sites
    - Independent sites from CAL
    - But on the same stream segments as CAL sites

### Taxonomy

- Started with 786 taxonomic names
- Operational Taxonomic Units: 332 unique taxa
  - No ambiguous taxa allowed
  - Explored multiple taxonomic scales, but highest resolution performed best
  - For each taxonomic group, we examined WA optima
    - Minimal differences: roll all children taxa (e.g., species) into parent (e.g., genus)
    - Differing thermal sensitivities: keep lowest level IDs for that group (e.g., species retained, while genus dropped)

### OTU Example: Baetis

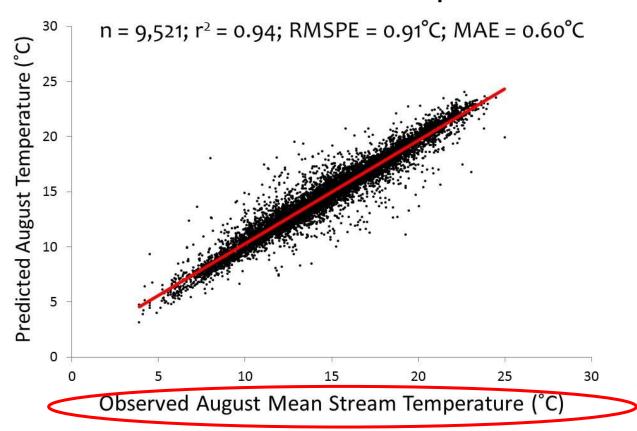
| Bio_ALL_TaxaID_v2          | ct_CAL | ct_VAL | ct_NOT | MTTI_OTU_highres_v2        | WAopt_nOcc_30plus |
|----------------------------|--------|--------|--------|----------------------------|-------------------|
| Baetidae                   | 480    | 83     | 484    | 666                        | 17.42             |
| Baetis                     | 1711   | 359    | 1410   | 666                        | 17.06             |
| Baetis alius               | 38     | 3      | 28     | Baetis alius               | 15.91             |
| Baetis bicaudatus complex  | 165    | 16     | 193    | Baetis bicaudatus complex  | 12.33             |
| Baetis flavistriga complex | 76     | 11     | 45     | Baetis flavistriga complex | 19.89             |
| Baetis notos               | 47     | 6      | 29     | Baetis notos               | 22.09             |
| Baetis piscatoris complex  | 42     |        | 38     | Baetis piscatoris complex  | 14.53             |
| Baetis rhodani group       | 38     | 3      | 42     | Baetis rhodani group       | 15.48             |
| Baetis tricaudatus complex | 1964   | 250    | 2366   | Baetis tricaudatus complex | 18.32             |

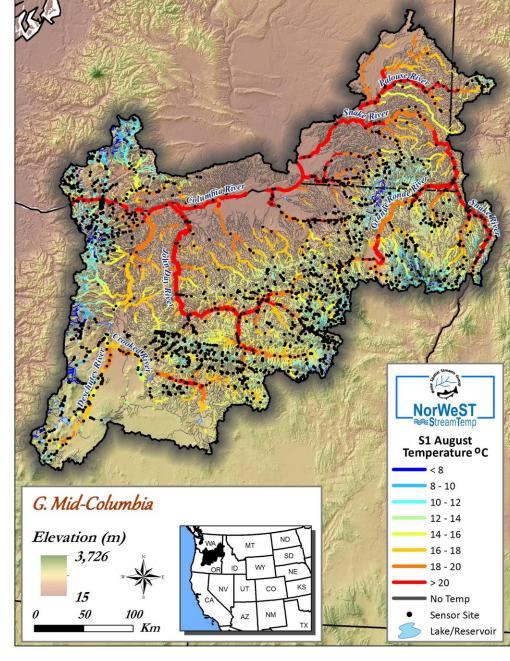
### OTU example: Orthocladius

| Bio_ALL_TaxaID_v2              | ct_CAL | ct_VAL | ct_NOT | MTTI_OTU_highres_v2            | WAopt_nOcc_30plus |
|--------------------------------|--------|--------|--------|--------------------------------|-------------------|
| Orthocladiinae                 | 1898   | 290    | 1809   | 666                            | 17.86             |
| Orthocladius                   | 640    | 111    | 614    | Orthocladius                   | 17.09             |
| Orthocladius (Euorthocladius)  | 6      |        | 8      | Orthocladius                   |                   |
| Orthocladius (Mesorthocladius) | 1      |        |        | Orthocladius                   |                   |
| Orthocladius (Orthocladius)    | 1      |        |        | Orthocladius                   |                   |
| Orthocladius (Symposiocladius) | 201    | 16     | 154    | Orthocladius (Symposiocladius) | 17.26             |
| Orthocladius complex           | 507    | 70     | 298    | Orthocladius complex           | 20.92             |

### Modeling a model???

#### MidColumbia Basin NorWeST Stream Temperature Model





Both figures from NorWeST website: <a href="https://www.fs.fed.us/rm/boise/AWAE/projects/NorWeST.html">https://www.fs.fed.us/rm/boise/AWAE/projects/NorWeST.html</a>

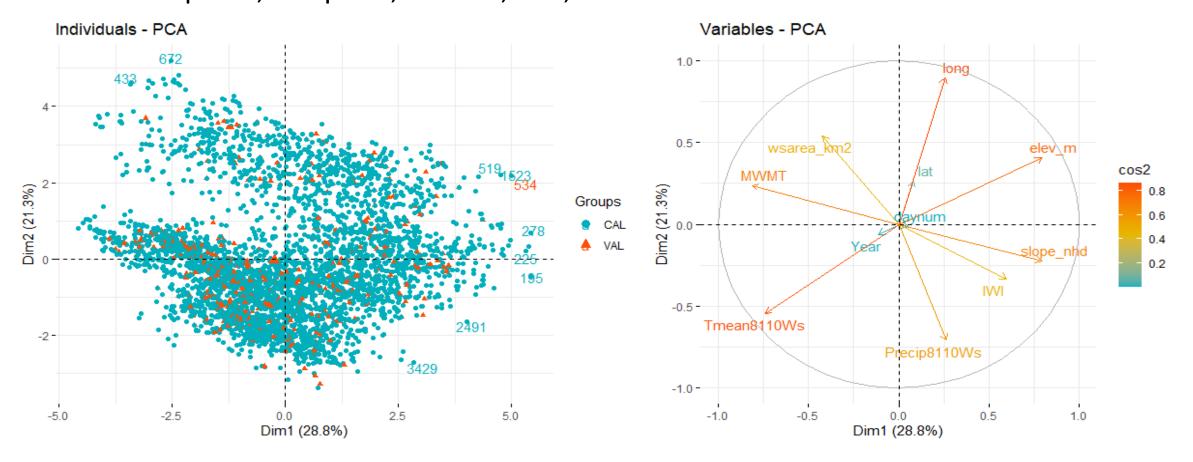
### Data sources

| Level III Ecoregion      | state | CAL  | VAL | %CAL | %VAL |
|--------------------------|-------|------|-----|------|------|
| Coast Range              | both  | 906  | 134 | 25   | 22   |
| Cascades                 | both  | 785  | 104 | 21   | 17   |
| Puget Lowlands           | WA    | 518  | 166 | 14   | 28   |
| North Cascades           | WA    | 337  | 26  | 9    | 4    |
| Blue Mountains           | both  | 281  | 77  | 8    | 13   |
| Klamath Mountains        | both  | 213  | 35  | 6    | 6    |
| Columbia Plateau         | both  | 182  | 12  | 5    | 2    |
| Willamette Valley        | OR    | 169  | 22  | 5    | 4    |
| East Cascades            | both  | 146  | 22  | 4    | 4    |
| Northern Rockies         | WA    | 86   | 4   | 2    | 1    |
| Northern Basin and Range | OR    | 34   | 1   | 1    | 0    |
| Snake River Plains       | OR    | 1    | 0   | 0    | 0    |
| TOTAL                    |       | 3658 | 603 |      |      |

| Source Type          | %   |
|----------------------|-----|
| Tribal               | < 1 |
| Federal              | 44  |
| State                | 43  |
| Local (county, city) | 12  |

### Are CAL and VAL similar populations?

- Principal Components Analysis
  - Spatial, temporal, climate, size, disturbance



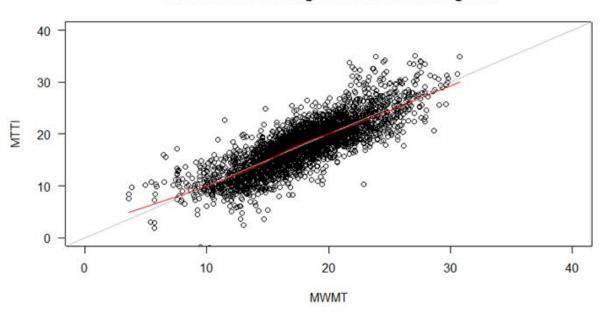
### Statistical Methods: Weighted Averaging (WA)

- Paleolimnology: predict past conditions, based on taxa found in sediments
  - We use the same methods, but we apply them differently
- Developed in R, 'rioja' package
- First step: calculate thermal **optima** for all **taxa** 
  - Across all sites where a taxon is present
  - Abundances are weighted by temperatures
  - $\Sigma_{sites}((RA * TEMPmwmt)/RA)$
  - All taxa have an optimum
    - Even the eurythermal taxa
- Second step: calculate the assemblage-level thermal response (MTTI) for a <u>site</u>
  - Across all taxa, within a site
  - Taxa abundances are weighted by their respective thermal optima
  - $\Sigma_{taxa}((RA * OPTIMAmwmt)/RA)$
- Tolerance down-weighting, deshrinking
- Taxonomy: Highest resolution model

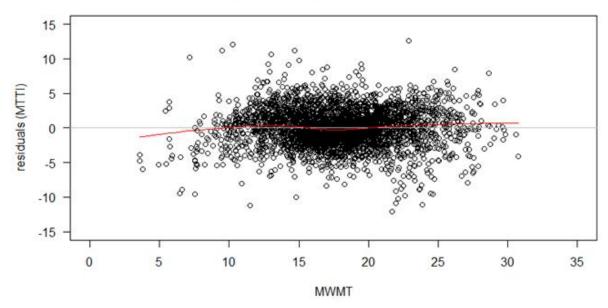
### Modeling Results

|          | Calib   | Validation                                      |   |  |
|----------|---|---|---|--|
|          | Classical deskrinking, tolerance downweighted | Cross validation:<br>bootstrapped<br>(n = 1000) | Classical deskrinking, tolerance downweighted |  |
| RMSE     | 2.7   | 2.7   | 2.4   |  |
| R2       | 0.69  | 0.67  | 0.66  |  |
| Max.Bias | 2.6   | 2.8   |   |  |

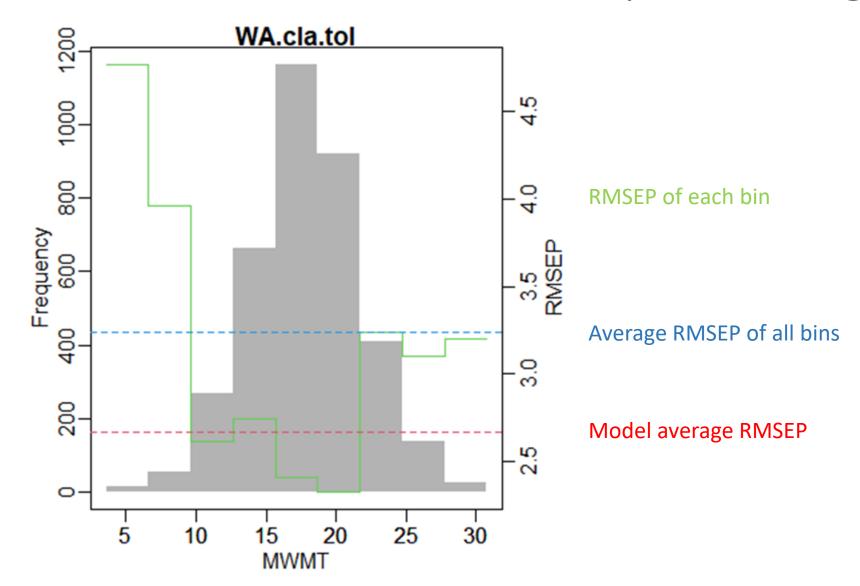
#### Classical deshrinking: tolerance downweighted



#### Classical deshrinking: tolerance downweighted



### Model errors across the temperature gradient



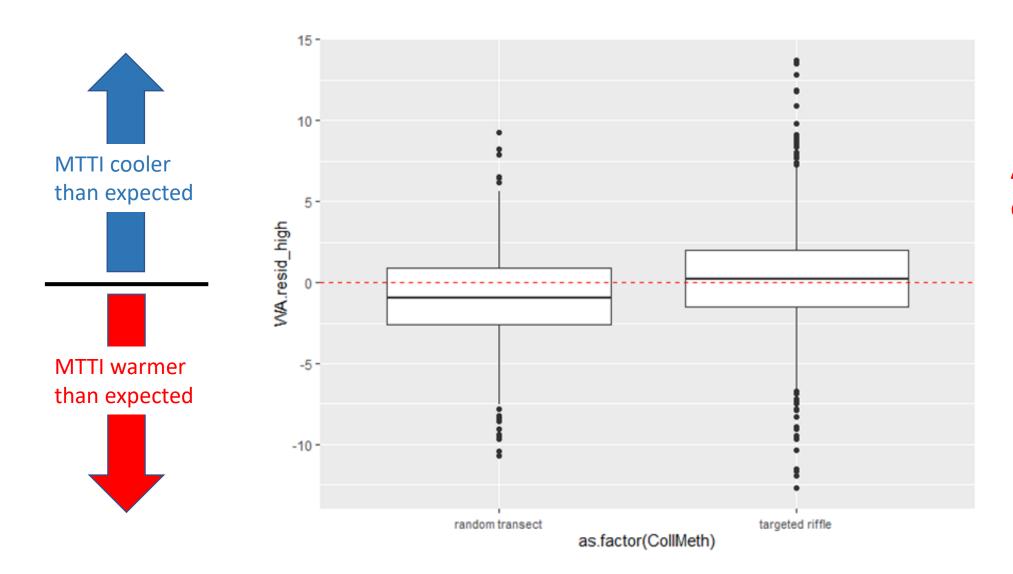
## How do these results compare to previous efforts?

- Huff, Hubler, Pan, Drake (2006): Oregon, statewide
  - Weighted averaging, inverse deshrinking
  - 7-day average maximum temperature (OR WQS, equivalent to MWMT)

| Model           | Temperature<br>source     | Taxa<br>(n)        | CAL<br>(n) | VAL<br>(n) | Cross Validation |      | Independent<br>Validation |      |      |          |
|-----------------|---------------------------|--------------------|------------|------------|------------------|------|---------------------------|------|------|----------|
|                 |                           |                    |            |            | RMSE             | r²   | Max Bias                  | RMSE | r²   | Max Bias |
| Huff et al 2006 | Field                     | 235 <mark>*</mark> | 328        | 50         | 2.1              | 0.73 | 3.7                       | 2.7  | 0.66 | 3.2      |
| MTTI            | Modeled stream<br>network | 332                | 3685       | 603        | 2.7              | 0.67 | 2.8                       | 2.4  | 0.66 |          |

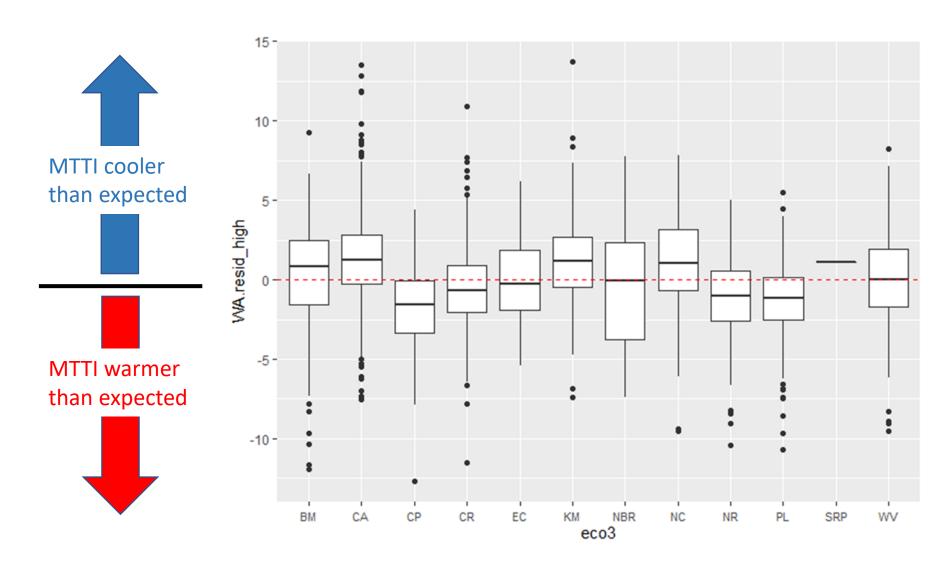
<sup>\*</sup> No restrictions on number of occurrences. Only 87 taxa with 30 or more occurrences.

### Is the MTTI biased? Sampling method

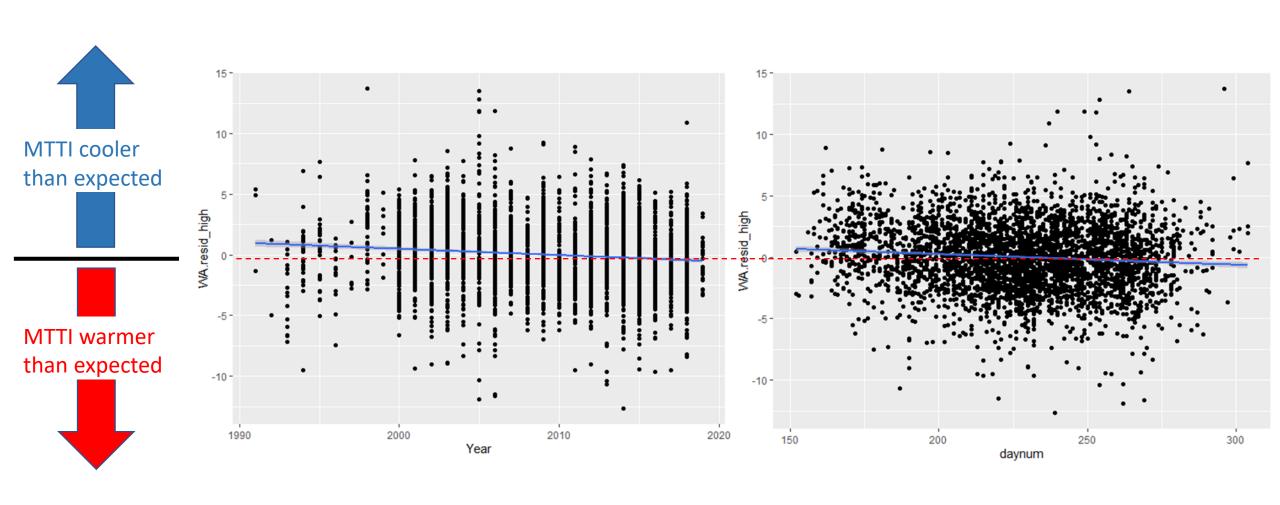


Also: No LAB effect observed

### Spatial bias? Ecoregion

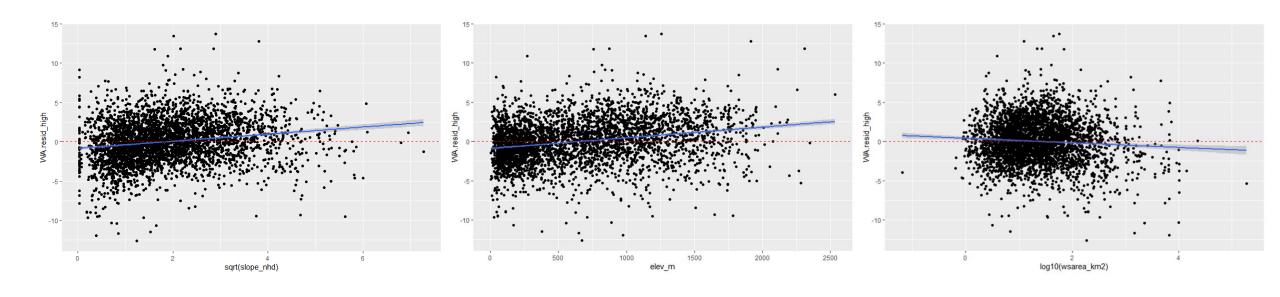


### Temporal bias? Year, day of year



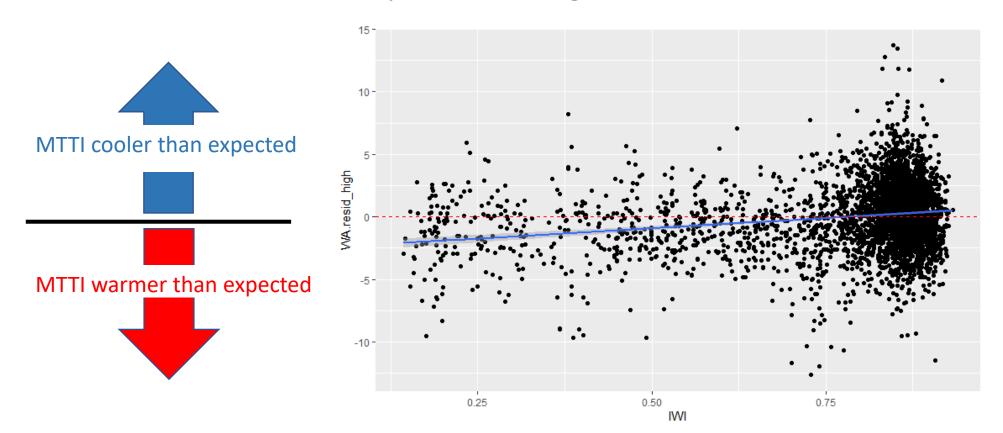
### Natural gradients bias? Slope, elevation, size

- Cooler than expected: higher slopes and elevations, smaller watersheds
- Warmer than expected: lower slopes and elevations, larger watersheds



### Is the MTTI biased? Disturbance

- IWI = Index of Watershed Integrity (source = StreamCat)
- MTTI warmer than expected at higher levels of disturbance



### Other biases?

- ID Laboratory: minor
- Collection entity: minor

- Differences observed more likely due to study areas/monitoring designs
  - E.g., National Park Service MTTI tended to be cooler than modeled MWMT
  - Higher elevations, higher gradients, lower disturbances?

### MTTI: Next Steps

- Incorporate feedback from PNW-BCG workgroup!
- Bias leave as is
  - Natural gradients to be factored out in setting reference expectations (later work)
- Repeatability
- Case study
  - Restoration project? (hopefully already included in Jen's database)
  - How does MTTI relate to thermal tolerance metrics?
  - Using MTTI (or thermal metrics?) to identify the appropriate Dissolved Oxygen standard in OR
- Validate R-code, input data files
  - Distributable R package
- Peer-reviewed journal article

### Other stressors?

- Fine sediment: Macroinvertebrates
  - PNW = Fine Sediment Biotic Index (Relyea et al. 2012, Environmental Management)
  - Oregon = Biological Sediment Tolerance Index (Hubler et al. 2016, Ecological Indicators)
  - Use BCG Thermal database to update the model to cover OR & WA?
    - Are habitat protocols the same?
- Nutrients: Periphyton
  - Nutrient Scientific Technical Exchange Partnership & Support (N-STEPS)
  - Diatom tolerance index used in the National Rivers and Streams Assessment
  - Tetra Tech support (Mike Paul) to apply to data from ecoregions in Oregon and neighboring states
  - TAXONOMY LIMITATIONS!!!!!!!