

Appendix: listing of all available surrogate variables

Table 1: Listing of the variables used in the regression models at Hika Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Sheboygan River Discharge	Diff			x					
Manitowoc River Discharge	Diff			x					
log Manitowoc River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
log Sheboygan River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x	x		
Lake level	Mean	x				x			
	Max	x				x			
	Min	x				x			
	Diff					x			
Surface current, perpendicular	Mean	x	x	x	x	x	x	x	x
Surface current, parallel	Mean	x	x	x	x	x	x	x	x
Subsurface current, perpendicular	Mean	x	x	x	x	x	x	x	x
Subsurface current, parallel	Mean	x	x	x	x	x	x	x	x
Wave height	Mean	x	x	x	x	x			
Wave height speed, perpendicular	Mean	x	x	x	x	x			
Wave height speed, parallel	Mean	x	x	x	x	x			
Wave speed, perpendicular	Mean	x	x	x	x	x			
Wave speed, parallel	Mean	x	x	x	x	x			
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
Water temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.			x	x	x	x	x	x
sqrt Rainfall over Manitowoc River	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Hika	Sum	x	x	x	x	x	x	x	x
log Turbidity	Manual								
Wind speed, perpendicular	Manual								
Wind speed, perpendicular	Manual								
People in water	Manual								
People on beach	Manual								
Air temperature	Manual								
Water temperature	Manual								
Wave height	Manual								
Algae near shore	Manual								
Algae on beach	Manual								
Julian date	Manual								

Table 2: Listing of the variables used in the regression models at Kreher Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Whittlesley Creek Discharge	Diff	x							
log Whittlesley Creek Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x			
Lake level	Mean	x	x	x	x	x			
	Diff					x			
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
sqrt Rainfall over Kreher	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Maslowski	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Whittlesley Creek	Sum	x	x	x	x	x	x	x	x
log Turbidity	Manual								
Wind speed, perpendicular	Manual								
Wind speed, perpendicular	Manual								
Number of people in water	Manual								
Number of people on beach	Manual								
Number of geese present	Manual								
Number of gulls present	Manual								
Air temperature	Manual								
Water temperature	Manual								
Wave height	Manual								
Lakeshore current velocity	Manual								
Beach specific conductance	Manual								
Bay City Creek specific conductance	Manual								
Algae near shore	Manual								
Algae on beach	Manual								
Julian date	Manual								

Table 3: Listing of the variables used in the regression models at Maslowski Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Whittlesley Creek Discharge	Diff			x					
log Whittlesley Creek Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x			
Lake level	Mean	x	x	x	x	x			
	Diff					x			
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
sqrt Rainfall over Maslowski	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Whittlesley Creek	Sum	x	x	x	x	x	x	x	x
log Turbidity		Manual							
Wind speed, perpendicular		Manual							
Wind speed, perpendicular		Manual							
Number of people in water		Manual							
Number of people on beach		Manual							
Number of geese present		Manual							
Number of gulls present		Manual							
Air temperature		Manual							
Water temperature		Manual							
Wave height		Manual							
Lakeshore current velocity		Manual							
Beach specific conductance		Manual							
Fish Creek (north) specific conductance		Manual							
Fish Creek (south) specific conductance		Manual							
Whittlesley Creek specific conductance		Manual							
Fish Creek (south) water elevation		Manual							
Algae near shore		Manual							
Algae on beach		Manual							
Julian date		Manual							

Table 4: Listing of the variables used in the regression models at the Point beaches. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Manitowoc River Discharge	Diff			x					
Sheboygan River Discharge	Diff			x					
log Manitowoc River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
log Sheboygan River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x	x		
Lake level	Mean	x				x			
	Max	x				x			
	Min	x				x			
	Diff					x			
Surface current, perpendicular	Mean	x	x	x	x	x	x	x	x
Surface current, parallel	Mean	x	x	x	x	x	x	x	x
Current at depth, perpendicular	Mean	x	x	x	x	x	x	x	x
Current at depth, parallel	Mean	x	x	x	x	x	x	x	x
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Wave direction, perpendicular	Mean	x	x	x	x	x			
Wave direction, parallel	Mean	x	x	x	x	x			
Wave height	Mean	x	x	x	x	x			
Wave height direction, perpendicular	Mean	x	x	x	x	x			
Wave height direction, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
Water temperature	Mean		x	x	x	x	x	x	x
	St. Dev.			x	x	x	x	x	x
sqrt Rainfall over Point beaches	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Twin Rivers	Sum	x	x	x	x	x	x	x	x
log Turbidity	Manual								
Wind speed, perpendicular	Manual								
Wind speed, perpendicular	Manual								
Number of people in water	Manual								
Number of people on beach	Manual								
Air temperature	Manual								
Water temperature	Manual								
Wave height	Manual								
Lakeshore current velocity	Manual								
Algae near shore	Manual								
Algae on beach	Manual								
Julian date	Manual								

Table 5: Listing of the variables used in the regression models at Thompson Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Whittlesley Creek Discharge	Diff			x					
log Whittlesley Creek Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x			
Lake level	Mean	x	x	x	x	x			
	Diff					x			
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
sqrt Rainfall over Whittlesley Creek	Sum	x	x	x	x	x	x		
sqrt Rainfall over Thompson Creek	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Maslowski	Sum	x	x	x	x	x	x	x	x
log Turbidity		Manual							
Wind speed, perpendicular		Manual							
Wind speed, perpendicular		Manual							
Number of people in water		Manual							
Number of people on beach		Manual							
Beach specific conductance		Manual							
Thompson Creek specific conductance		Manual							
Air temperature		Manual							
Water temperature		Manual							
Wave height		Manual							
Lakeshore current velocity		Manual							
Algae near shore		Manual							
Algae on beach		Manual							
Julian date		Manual							

Table 6: Listing of the variables used in the regression models at Neshotah Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Manitowoc River Discharge	Diff			x					
Kewaunee River Discharge	Diff			x					
log Manitowoc River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
log Kewaunee River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x	x		
Lake level	Mean	x				x			
	Max					x			
	Min					x			
	Diff					x			
Surface current, perpendicular	Mean	x	x	x	x	x	x	x	x
Surface current, parallel	Mean	x	x	x	x	x	x	x	x
Current at depth, perpendicular	Mean	x	x	x	x	x	x	x	x
Current at depth, parallel	Mean	x	x	x	x	x	x	x	x
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Wave direction, perpendicular	Mean	x	x	x	x	x			
Wave direction, parallel	Mean	x	x	x	x	x			
Wave height	Mean	x	x	x	x	x			
Wave height direction, perpendicular	Mean	x	x	x	x	x			
Wave height direction, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.			x	x	x	x	x	x
Water temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.			x	x	x	x	x	x
sqrt Rainfall over Neshotah	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Twin Rivers	Sum	x	x	x	x	x	x	x	x
log Turbidity	Manual								
Wind speed, perpendicular	Manual								
Wind speed, perpendicular	Manual								
Number of people in water	Manual								
Number of people on beach	Manual								
Number of gulls present	Manual								
Air temperature	Manual								
Water temperature	Manual								
Wave height	Manual								
Lakeshore current velocity	Manual								
Algae near shore	Manual								
Algae on beach	Manual								
Julian date	Manual								

Table 7: Listing of the variables used in the regression models at Red Arrow Beach. For each variable, the listing indicates which summary statistics were computed, and over what time scales.

Covariate	Statistic	1h	2h	6h	12h	24h	48h	72h	120h
Manitowoc River Discharge	Diff			x					
log Manitowoc River Discharge	Mean	x	x	x	x	x	x	x	x
	Min	x	x	x	x	x	x	x	x
	Max					x			
Cloud cover	Mean	x	x	x	x	x	x		
Lake level	Mean	x				x			
	Max	x				x			
	Min	x				x			
	Diff					x			
Surface current, perpendicular	Mean	x	x	x	x	x	x	x	x
Surface current, parallel	Mean	x	x	x	x	x	x	x	x
Current at depth, perpendicular	Mean	x	x	x	x	x	x	x	x
Current at depth, parallel	Mean	x	x	x	x	x	x	x	x
Wind speed, perpendicular	Mean	x	x	x	x	x			
Wind speed, parallel	Mean	x	x	x	x	x			
Wave direction, perpendicular	Mean	x	x	x	x	x			
Wave direction, parallel	Mean	x	x	x	x	x			
Wave height	Mean	x	x	x	x	x			
Wave height direction, perpendicular	Mean	x	x	x	x	x			
Wave height direction, parallel	Mean	x	x	x	x	x			
Air temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.		x	x	x	x	x	x	x
Water temperature	Mean	x	x	x	x	x	x	x	x
	St. Dev.			x	x	x	x	x	x
sqrt Rainfall over Manitowoc River	Sum	x	x	x	x	x	x	x	x
sqrt Rainfall over Red Arrow beach	Sum	x	x	x	x	x	x	x	x
log Turbidity		Manual							
Wind speed, perpendicular		Manual							
Wind speed, perpendicular		Manual							
Number of people in water		Manual							
Number of people on beach		Manual							
Number of gulls present		Manual							
Air temperature		Manual							
Water temperature		Manual							
Wave height		Manual							
Lakeshore current velocity		Manual							
Algae near shore		Manual							
Algae on beach		Manual							
Julian date		Manual							