



Environmental Factors Associated with Recreational Beach Water Quality in Canada

Johanna Sanchez, PhD
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Agence de la santé
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Public Health
Agency of Canada



Introduction

Swimming at public beaches is an increasingly popular recreational activity among Canadians, particularly during the pandemic

Other popular recreational water activities include kayaking, paddleboarding, waterskiing and canoeing



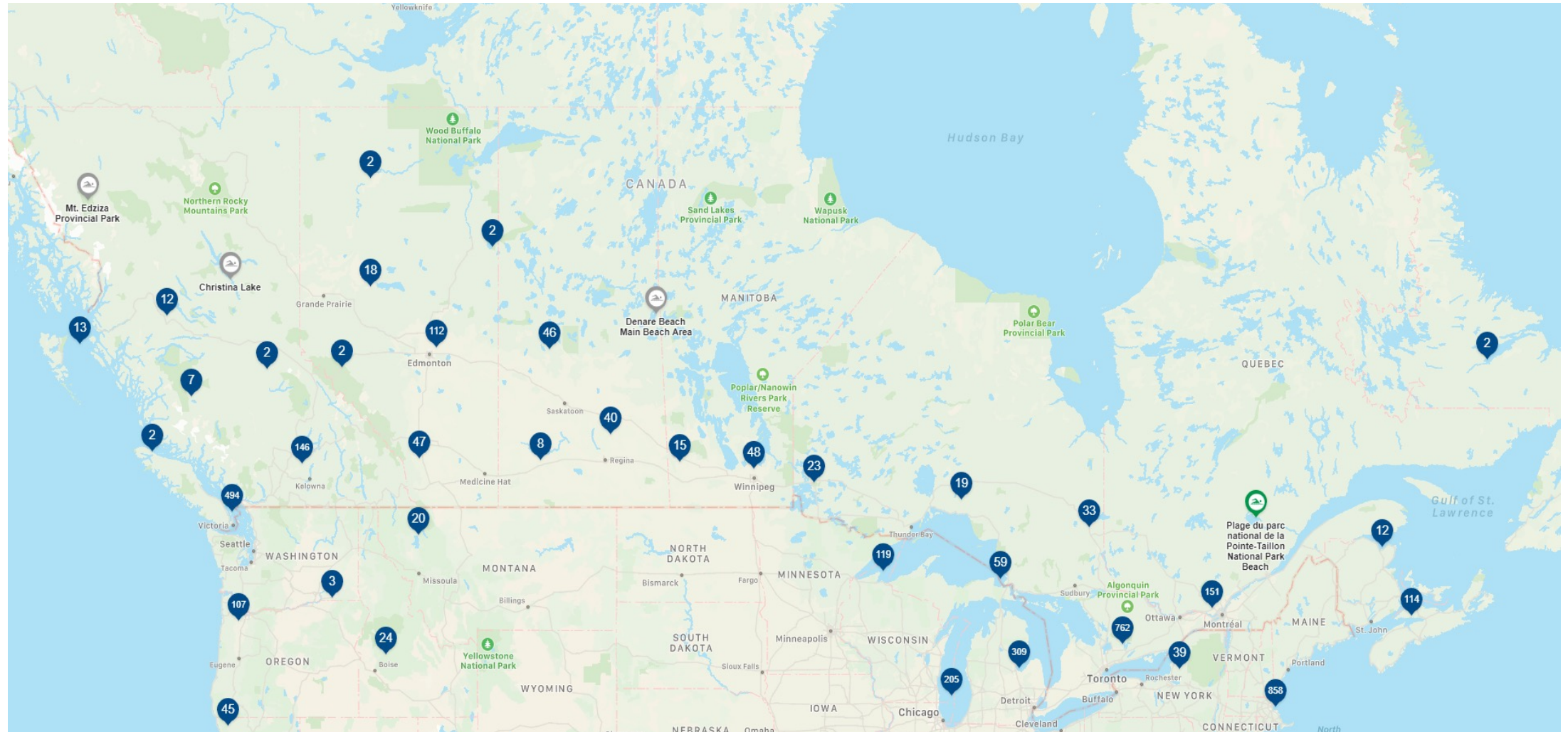
Outline

- Background
- Our Research Team
- Recreational Water Quality Projects
- Summary of Results
- Future Direction
- Questions



The Canadian Recreational Water
Quality Research Group

Canadian Beaches



Water Quality

Poor recreational water quality represents a risk of acute gastrointestinal illness (AGI) for those engaging in recreational water activities; however, it is highly undetected and underreported

AGI risk is higher in children 0-10 years of age

Bacterial, protozoal and viral waterborne pathogens are the primary etiological agents of concern in beaches – *Escherichia coli* (*E. coli*), *Enterococcus*, *Salmonella*, *Campylobacter*, *Giardia*, and *Cryptosporidium*

Beach managers monitor the presence of *E. coli*, which is a fecal indicator bacteria to indicate the presence of water pathogens

Environmental factors are involved with affecting water quality levels

Our research aims to understand the environmental factors associated with beach water quality

Research Team

Comprised of **public health researchers** at **Toronto Metropolitan University** specializing in epidemiology, burden of waterborne infection, and advanced analytic methods.

We work in close collaboration with participating public health units to generate knowledge about Canadian freshwater beaches and further inform current beach monitoring programs.



Dr. Ian Young
Associate Professor



Dr. Jordan Tustin
Associate Professor



Dr. Johanna Sanchez
Senior Research Associate



Dr. Binyam Desta
Postdoctoral Fellow



Rachel Jardine
Research Assistant

Projects



The Canadian Beach Water
Research Group

1

Environmental predictors
of recreational water
quality

2

Canadian Beach Cohort
Study

3

Canadian Algal Blooms in
Recreational Waters

Fecal Indicator Bacteria (FIB)

- The presence of these bacteria are an indication of fecal material in the water
- *Escherichia coli* concentration is the indicator suggested for freshwater recreational water
- Enterococcus is the suggested FIB for marine waters
- This research focuses on *E. coli* concentration



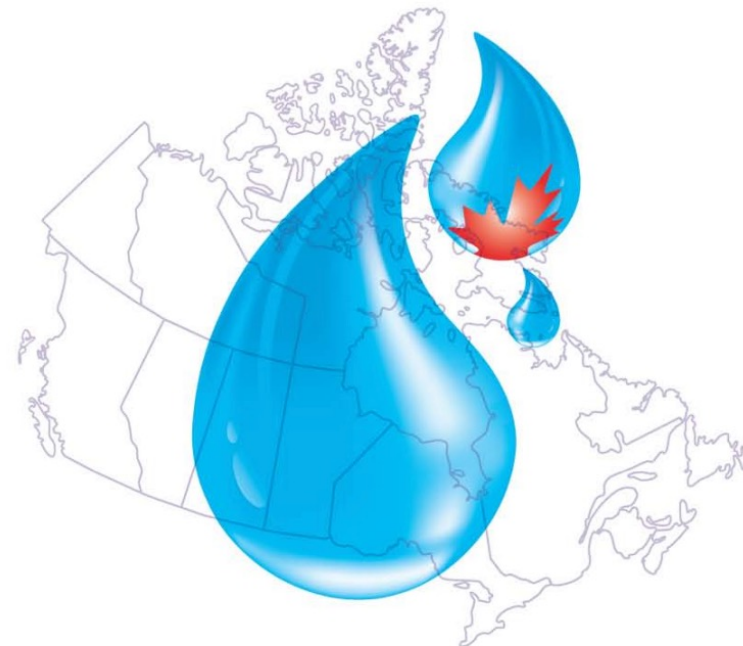


Guidelines for Canadian Recreational Water Quality

- 3rd edition published in 2012 is currently being revised
- Used by provinces/local public health authorities to guide beach surveillance policies/programs
- In 2012 edition, threshold values were developed to suggest an acceptable risk of gastrointestinal illness
 - *E. coli* single sample max. of 400 CFU/100mL
 - *E. coli* geometric mean of 200 CFU/100mL
- The new edition proposes to replace threshold values with "beach action values" (BAV):
 - *E. coli* single sample max. of 235 CFU/100mL

Guidelines for Canadian Recreational Water Quality

Third Edition



Beach Monitoring

- In Canada, beaches are regularly monitored by public health authorities through water sampling and beach assessments during the summer season
- Recreational water quality monitoring falls under provincial and territorial jurisdiction
- Sampling results are used to inform risk management and communication decisions, including beach postings or closures to reduce risks
- The frequency of water quality monitoring varies by jurisdiction and beach, and is determined based by various factors (e.g., popularity, historical results)



Limitations

- Culture based methods can take 18-24 hours to process
- Decisions about beach posting status are based on previous day *E. coli* concentration
- Delays can result in risk to swimmers as changes in environmental conditions can affect water quality in hours
- Understanding environmental factors associated with water quality can inform beach monitoring programs



Environmental Factors

Rainfall

Air temperature

Water temperature

Stream discharge

Wave height

Wind speed

Ultraviolet radiation

Turbidity

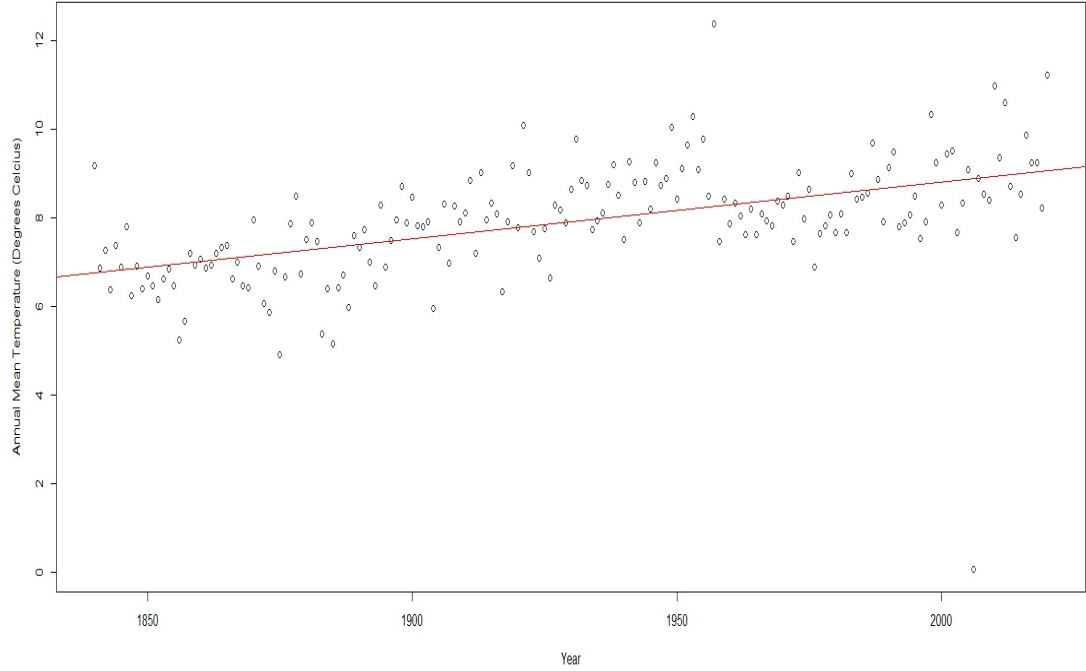
Salinity

Tides

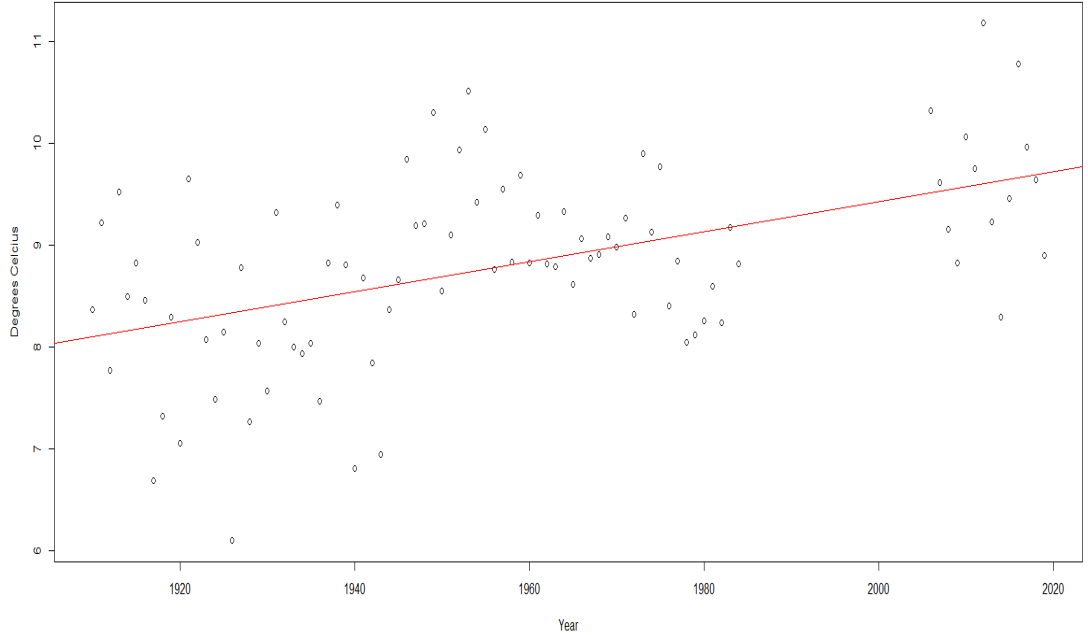


Air Temperature

Mean Annual Temperature on Toronto Island



Mean Annual Temperature at Grimsby 1910-2019



Research Objectives

1

Determine which climate- and weather-related factors are associated with higher levels of *E. coli* in public bathing beaches over time.

2

Develop user-friendly predictive models, using a novel Bayesian network approach, for selected beaches to assist public health authorities in their risk management decisions.

Research Objectives

1

Determine which climate- and weather-related factors are associated with higher levels of *E. coli* in public bathing beaches over time.

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Study Sites



Toronto

Largest city in Canada
Opportunity to study beaches in an urban setting in a Great Lake (Lake Ontario)



Niagara Region

One of the most popular tourist areas
Large geographic area
Beaches in two great lakes



Manitoba

Lake Winnipeg
Sixth largest freshwater lake in Canada

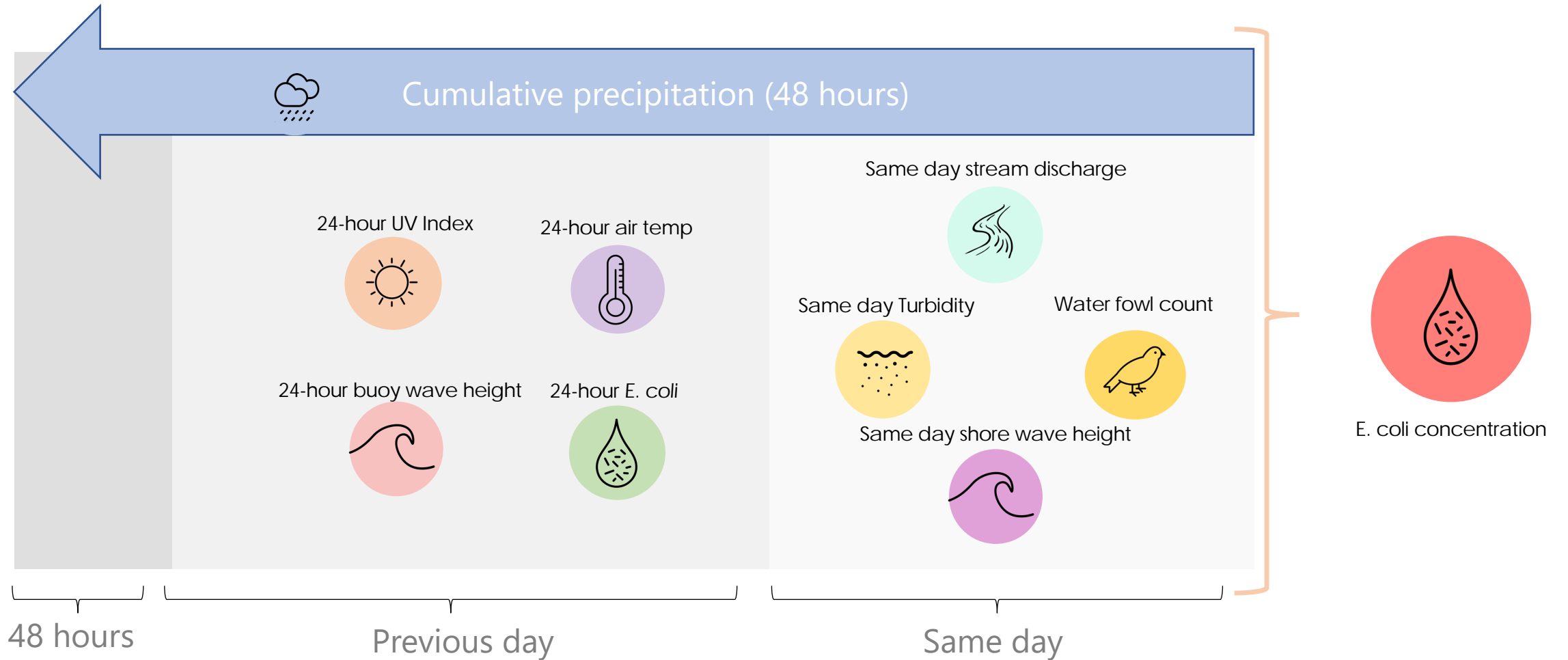


Vancouver

Coastal city (Pacific Ocean)
One of the largest cities in Canada.
Opportunity to explore marine beaches



Environmental variables



Toronto

- 11 beaches on Lake Ontario – 10 included in our study
- Grimsby buoy
- Streamflow data – 3 rivers
- UV station TRCA

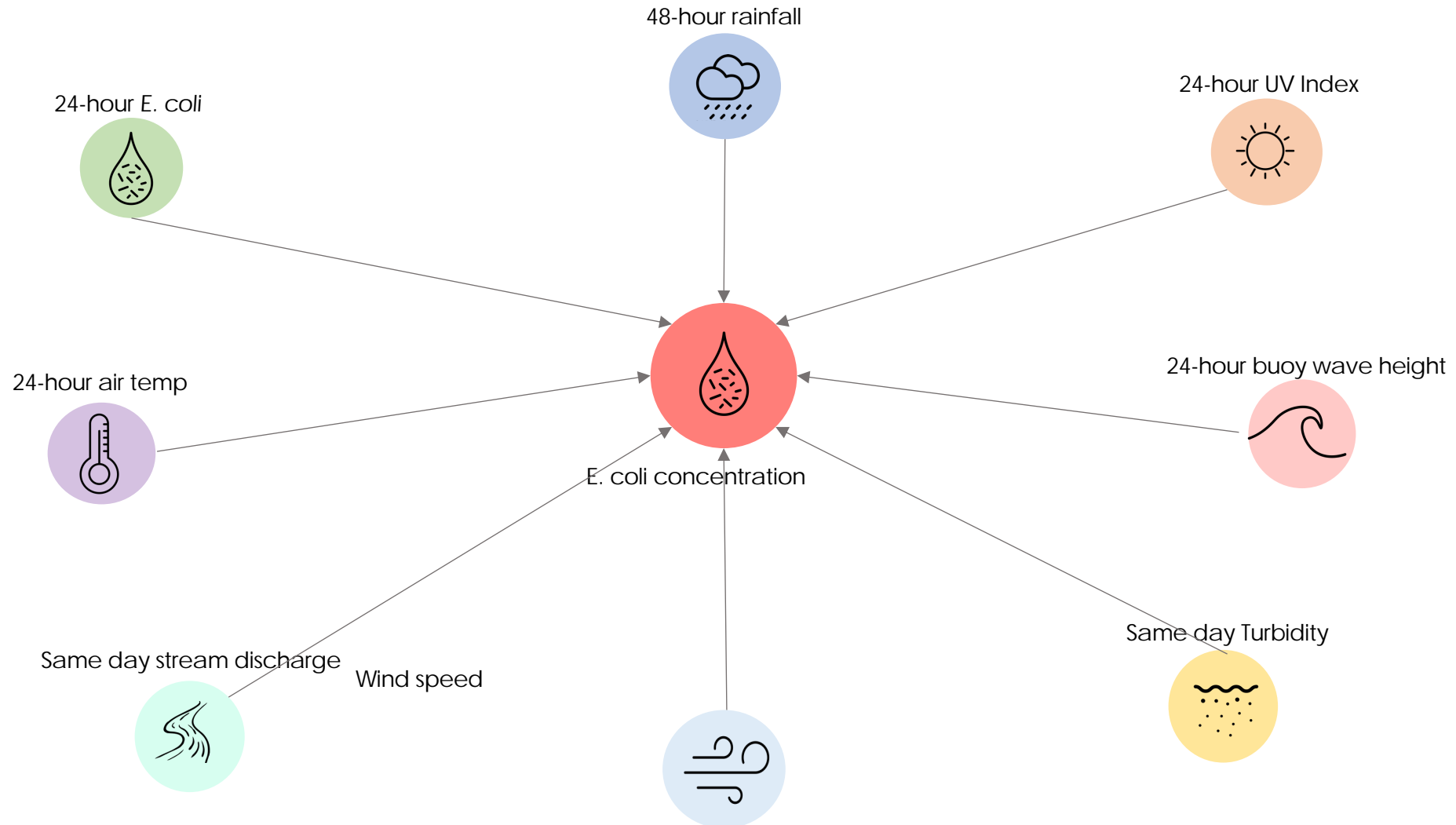


Niagara Region

- 2 beaches on Lake Ontario
- 6 beaches on Lake Erie
- 2 buoys
- Streamflow data – Welland Canal and Niagara River
- UV station Buffalo



Effect of Environmental Factors on E. coli



Overall Niagara Path Analysis Results



Key Findings

- Confirmed relationships between environmental factors.
- Beach-specific models had some difference but there were general trends.
- Turbidity was found to be an important mediator for the indirect effect of environmental predictors overall and in all beach-specific models

Niagara Region Path Analysis Results



Epidemiology and Infection

[cambridge.org/hyg](https://www.cambridge.org/hyg)

Original Paper

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Key words:

Epidemiology; food safety; food-borne zoonoses; meta-analysis; systematic review

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Environmental factors associated with freshwater recreational water quality in Niagara Region, Ontario, Canada: A path analysis

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Abstract

Escherichia coli concentration levels in recreational water are used by beach managers to evaluate the risk of gastrointestinal illness among beachgoers. We examined the relationship between specific environmental factors and *E. coli* concentration in recreational beaches in the Niagara Region. We analysed *E. coli* geometric means collected from eight beaches from two of the Great Lakes in the Niagara Region in Ontario, between 2011 and 2019. We applied path analysis to evaluate the relationship between the environmental factors and *E. coli* concentrations, including whether effects were direct or indirect via a mediator. Turbidity was found to be an important mediator for the indirect effect of environmental variables overall and in beach-specific models. Rainfall and streamflow had a positive indirect effect on *E. coli* via turbidity and a direct effect in five out of seven beach models. Streamflow was also a mediator for the indirect effect of previous day air temperature in five out of seven models. In three subset models, outfall *E. coli* concentration was a mediator for the effect of the environmental factors. Using a novel methodological approach, this study identifies important relationships and pathways that predict beach *E. coli* concentration in freshwater beaches located on two of the Great Lakes.

Introduction

Poor recreational water quality, as indicated by a high concentration of pathogens, represents a risk of gastrointestinal illness for those engaging in water activities such as swimming [1, 2]. In Canada, beach water quality in freshwater bodies is regularly monitored by measuring faecal indicator bacteria (FIB) levels, most commonly *Escherichia coli* (*E. coli*), as a surrogate for the presence of enteric pathogens and risk of gastrointestinal illness [3]. The Guidelines for

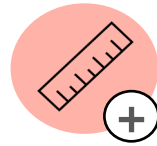
Toronto and Niagara Analysis

Overall relationship direction

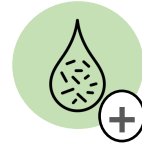
24-hour air temp



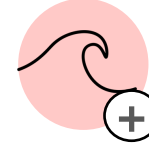
Water level



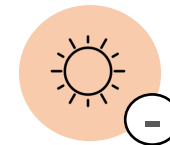
24-hour E. coli



24-hour wave height



24-hour UV Index

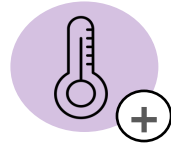


Toronto

Stream discharge



24-hour air temp



48-hour rainfall

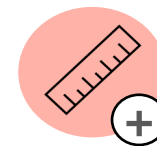


Water fowl count



Niagara

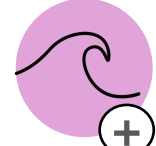
Water level



48-hour rainfall



Shore wave height



Beach-specific effects suggest unique contamination sources and factors that affect E. coli levels

Toronto and Niagara Results



International Journal of
Environmental Research
and Public Health



Article

Region-Specific Associations between Environmental Factors and *Escherichia coli* in Freshwater Beaches in Toronto and Niagara Region, Canada

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Abstract: Poor freshwater beach quality, measured by *Escherichia coli* (*E. coli*) levels, poses a risk of recreational water illness. This study linked environmental data to *E. coli* geometric means collected at 18 beaches in Toronto (2008–2019) and the Niagara Region (2011–2019) to examine the environmental predictors of *E. coli*. We developed region-specific models using mixed effects models to examine *E. coli* as a continuous variable and recommended thresholds of *E. coli* concentration (100 CFU/100 mL and 200 CFU/100 mL). Substantial clustering of *E. coli* values at the beach level was observed in Toronto, while minimal clustering was seen in Niagara, suggesting an important beach-specific effect in Toronto beaches. Air temperature and turbidity (measured directly or visually observed) were positively associated with *E. coli* in all models in both regions. In Toronto, waterfowl counts, rainfall, stream discharge and water temperature were positively associated with *E. coli* levels, while solar irradiance and water level were negatively associated. In Niagara, wave height and water level had a positive association with *E. coli*, while rainfall was negatively associated. The differences in regional models suggest the importance of a region-specific approach to addressing beach water quality. The results can guide beach monitoring and management practices, including predictive modelling.

Keywords: *Escherichia coli*; water quality; recreational water; environmental factors; fecal indicator bacteria

1. Introduction

The concentration of *Escherichia coli* (*E. coli*) is used as an indicator of recent fecal pollution and signifies risks of recreational water illness in freshwater beaches [1]. Municipal beach monitoring programs routinely collect water samples to determine whether bacterial concentrations exceed guideline thresholds. Canadian guidelines implemented in 2012



Citation: Sanchez, J.; Tustin, J.; Heasley, C.; Patel, M.; Kelly, J.; Habjan, A.; Waterhouse, R.; Young, I. Region-Specific Associations between Environmental Factors and *Escherichia coli* in Freshwater Beaches in Toronto and Niagara Region, Canada. *Int. J. Environ. Res. Public Health* 2021, 18, 12841. <https://doi.org/10.3390/ijerph182312841>

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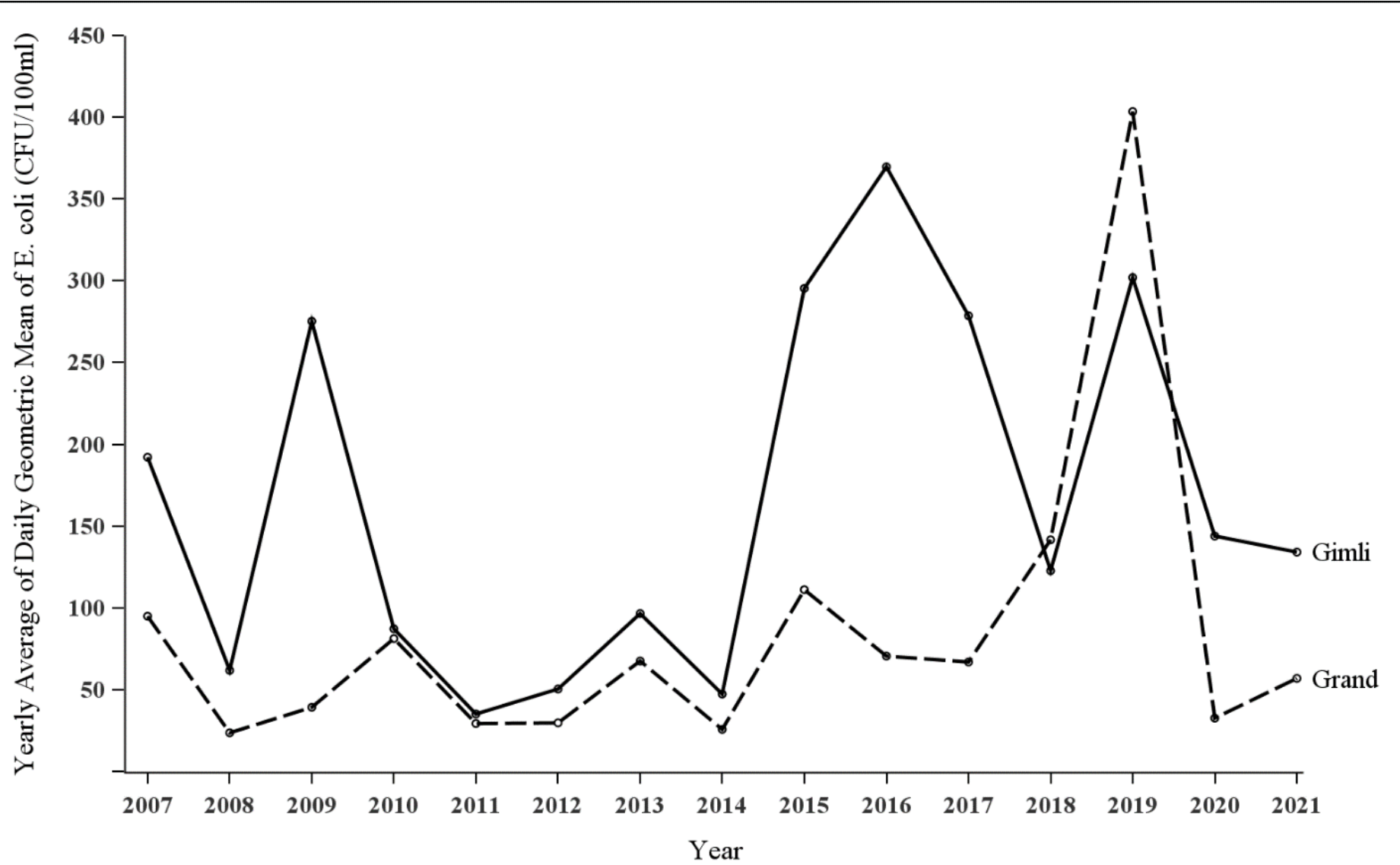


Manitoba

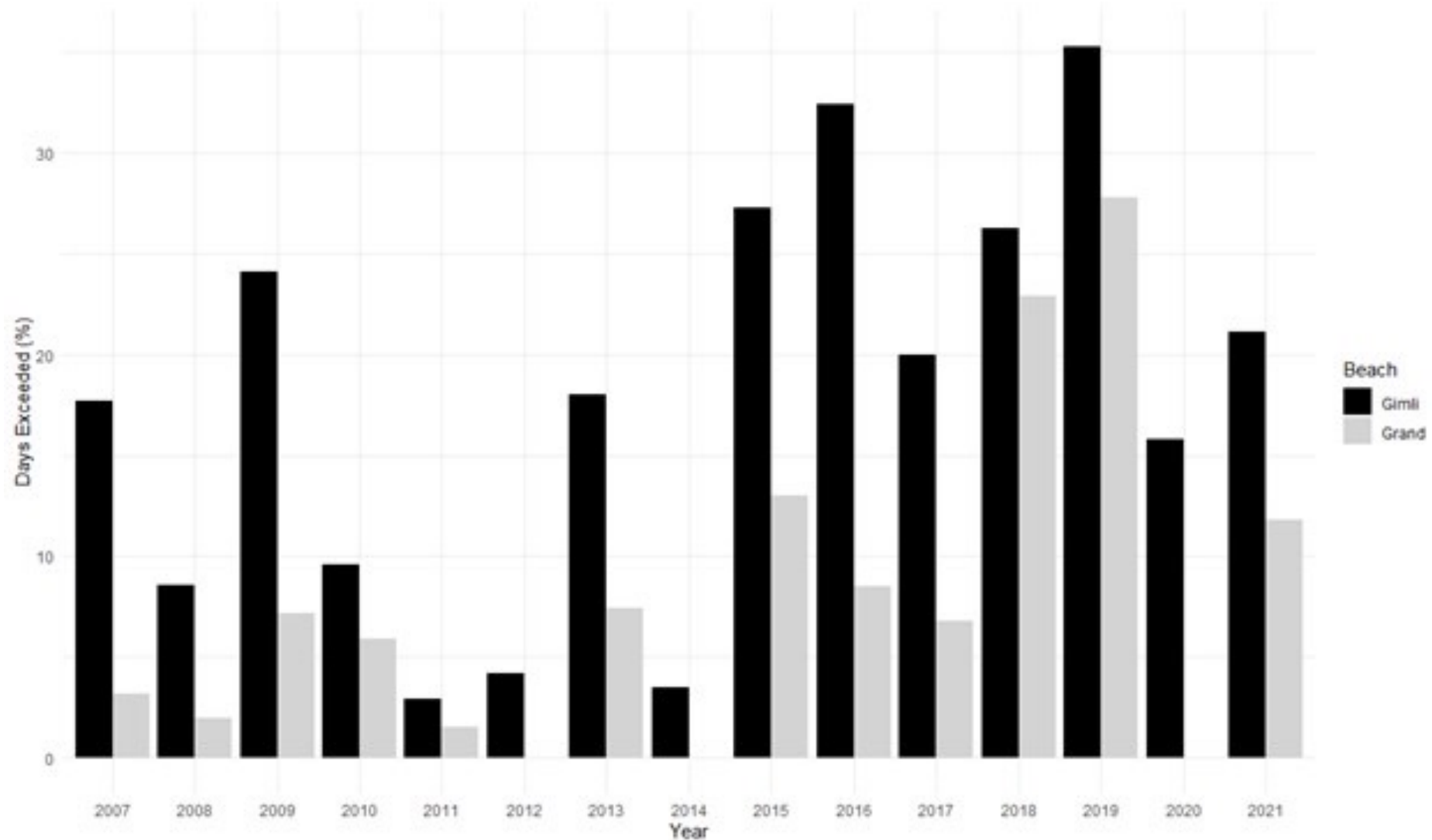
- 2 beaches on Lake Winnipeg
 - located on opposite sides
- 1 bouy
- 1 Weather station
- 1 Water level station



Mean annual *E. coli* mean at Manitoba Beaches, 2007-2021



Annual *E. coli* threshold exceedances (200 CFU/100 ml) at Manitoba Beaches



Data - Manitoba

Publicly Available Environmental Data

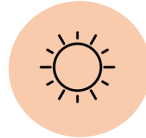
Air temp



Water level



UV Index



48-hour rainfall



Antecedent dry days



Manitoba

24-hour E. coli



Analytical Methods

Multilevel modelling

- Examined year-specific effects via two outcomes

Path analysis

- Allowed us to examine the relationship between variables



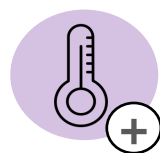
Manitoba Multilevel Modelling Analysis

Gimli

48-hour rainfall



24-hour mean air temp



24-hour E. coli

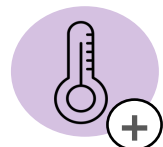


Grand

48-hour rainfall



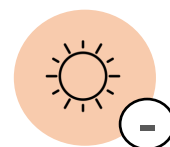
24-hour air temp



24-hour E. coli



24-hour UV Index

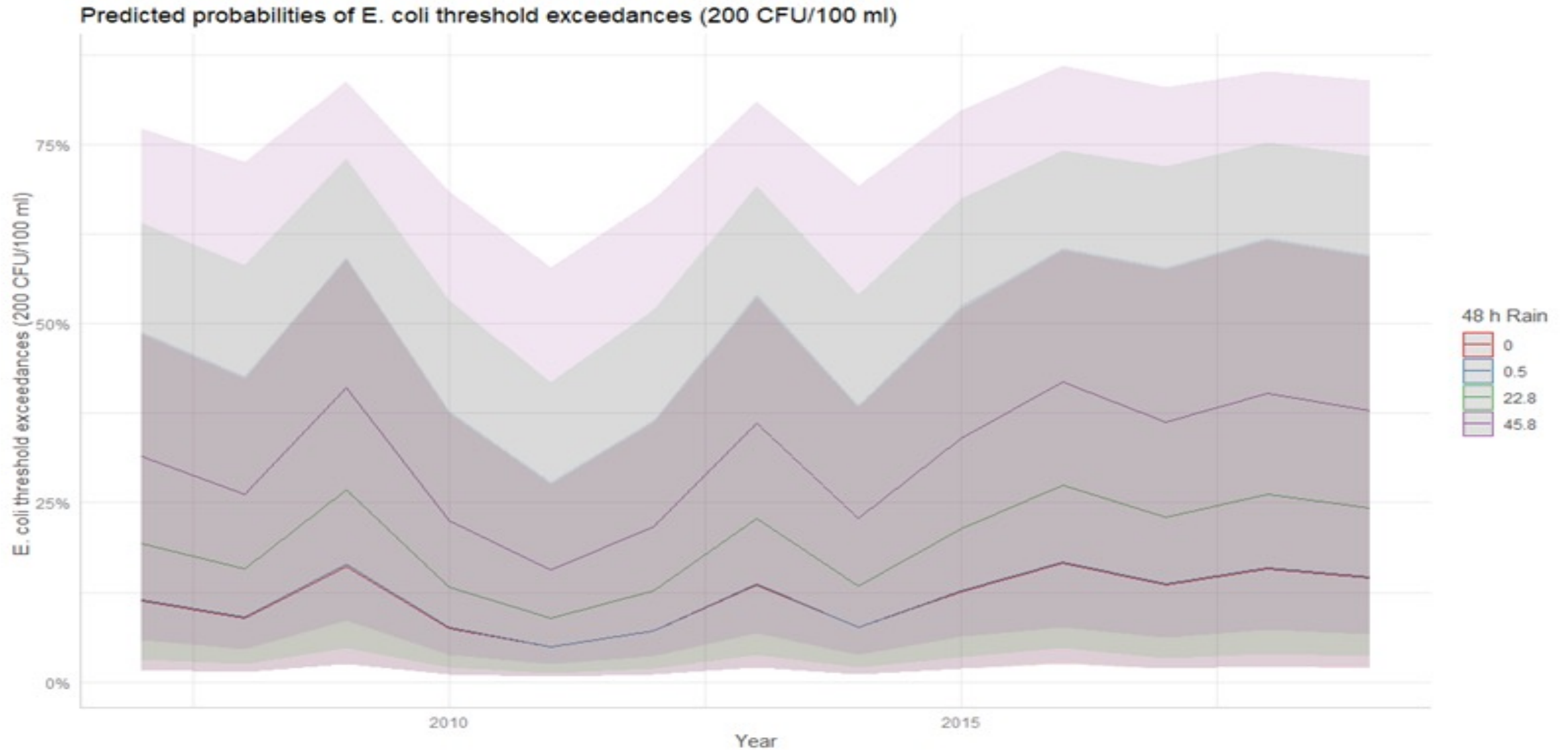


Antecedent dry days

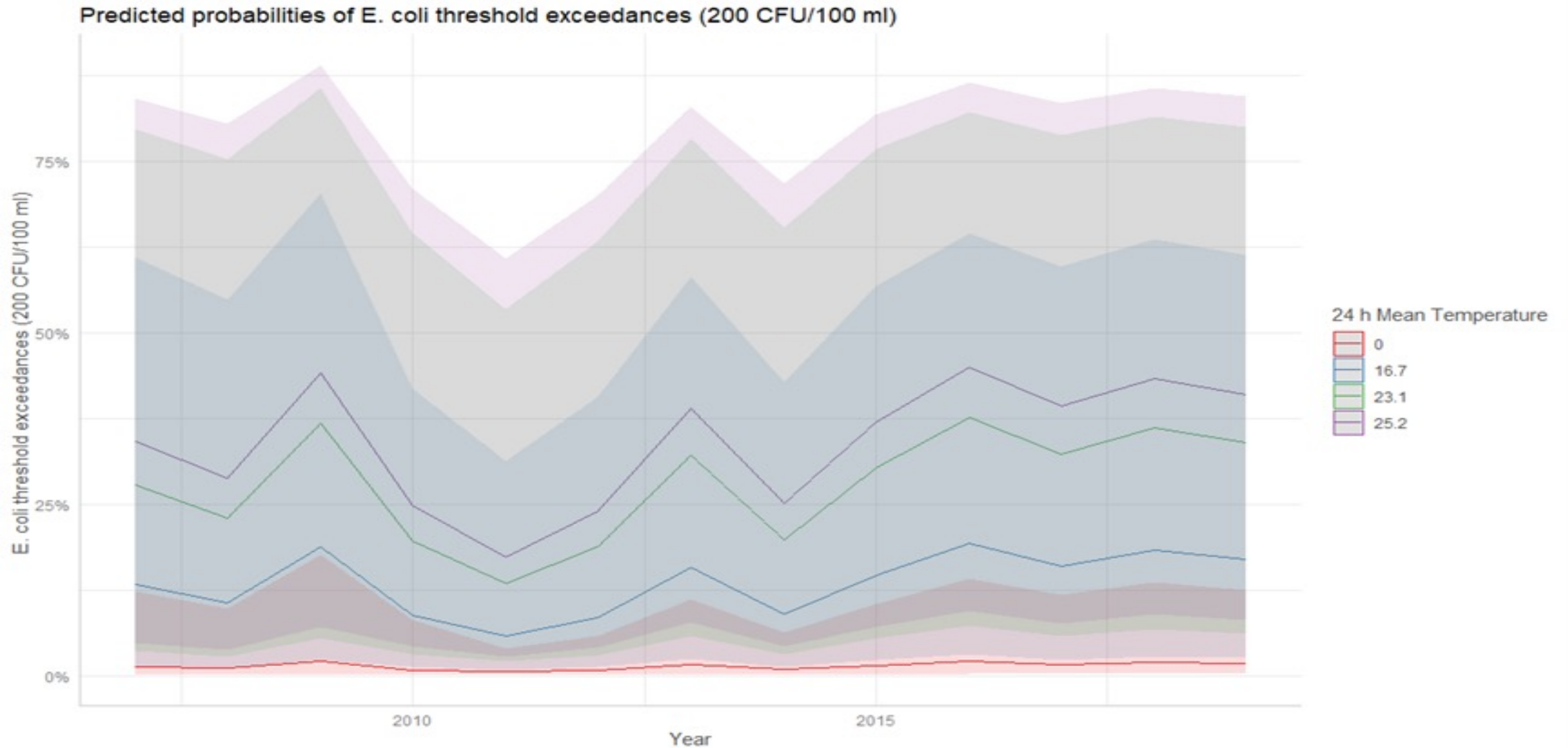


Year-specific effects were significant and suggest yearly-varying factors that affect E. coli levels.

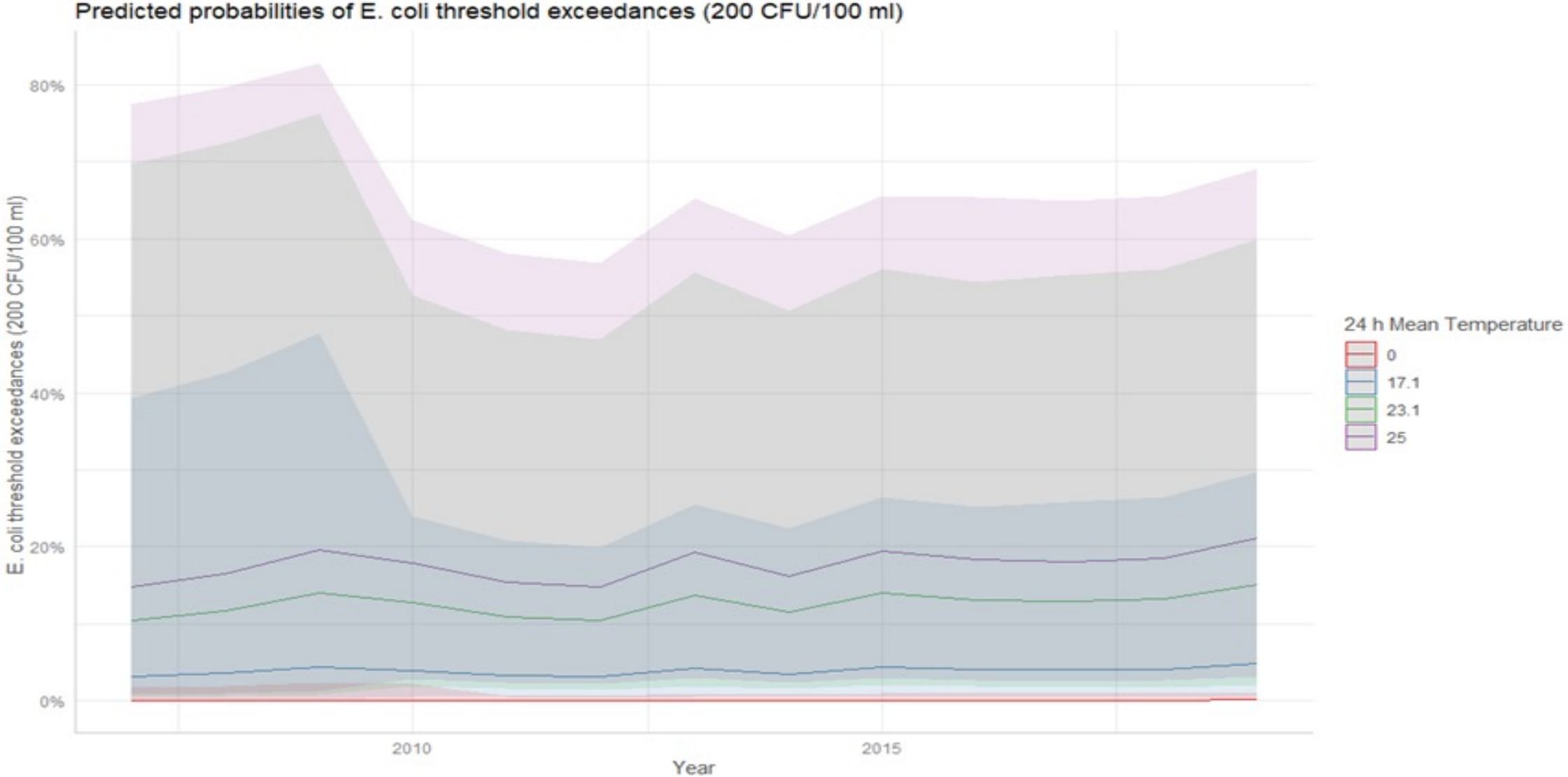
The predicted probability of exceeding the 200 CFU/100 *E. coli* threshold at four rain values – Gimli logistic model



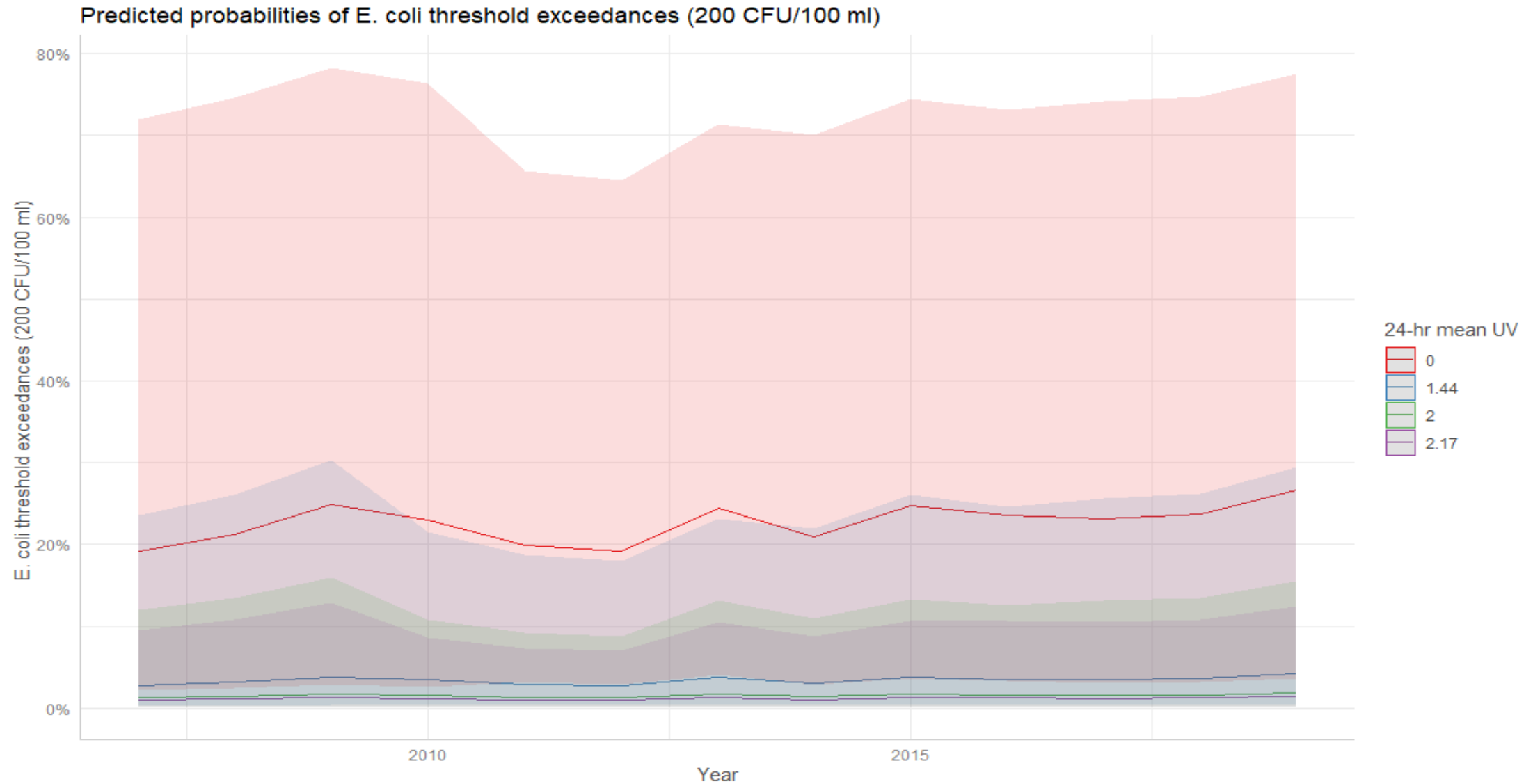
The predicted probability of exceeding the 200 CFU/100 *E. coli* threshold at four temp values – Gimli logistic model



The predicted probability of exceeding the 200 CFU/100 *E. coli* threshold at four temp values – Grand logistic model



The predicted probability of exceeding the 200 CFU/100 *E. coli* threshold at four UV values – Grand logistic model



Conclusion and Future Plan

1

The need for enhancing beach monitoring programs for extreme weather events (climate change preparedness efforts)

2

The findings will help develop real-time recreational water quality predictive models to allow more accurate beach management decisions

Vancouver

- 15 beaches on the Pacific Ocean
- 1 buoy
- 2 Weather station
- 1 Water level station



Data - Vancouver

Publicly Available Environmental Data

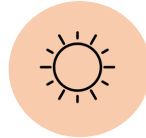
Air temp



Water level



UV Index



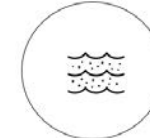
48-hour rainfall



Antecedent dry days



Salinity



Vancouver

Previous sample day E. coli



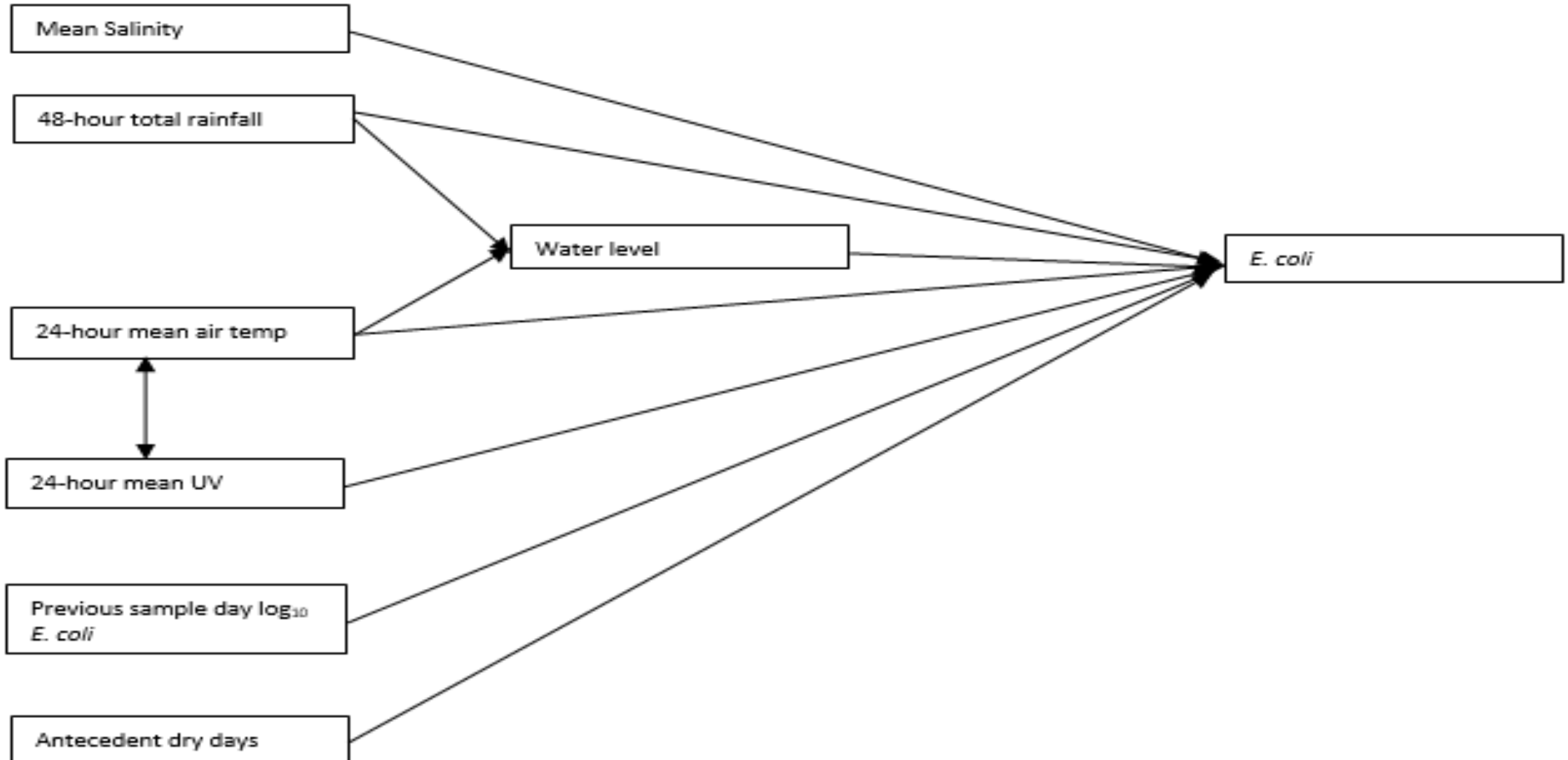
Analytical Methods

Bayesian Mixed Effect Regression Modelling

- Informed by our DAG
- Varying slope for each predictor variable for each beach (except for antecedent dry days)
- Keeping year a fixed effects
- Interaction between temp and UV



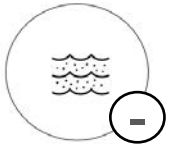
Directed Acyclic Graph (DAG) of the relationship between variables affecting *E. coli*



Vancouver Bayesian Mixed-effect Model

Overall relationship direction

Mean Salinity



48-hour rainfall



Previous sample day E. coli

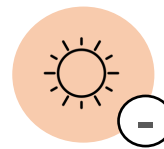


24-hour air temp



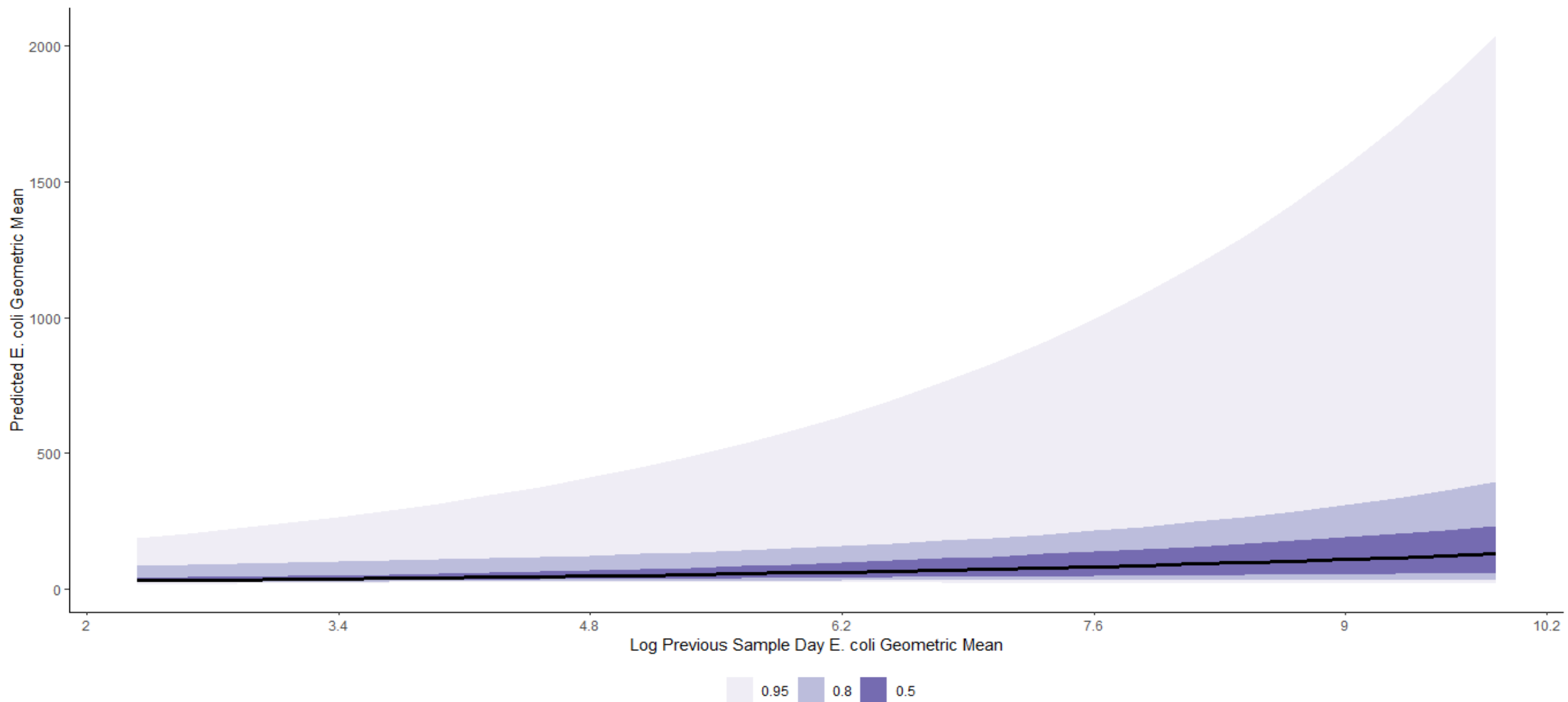
*

24-hour UV Index

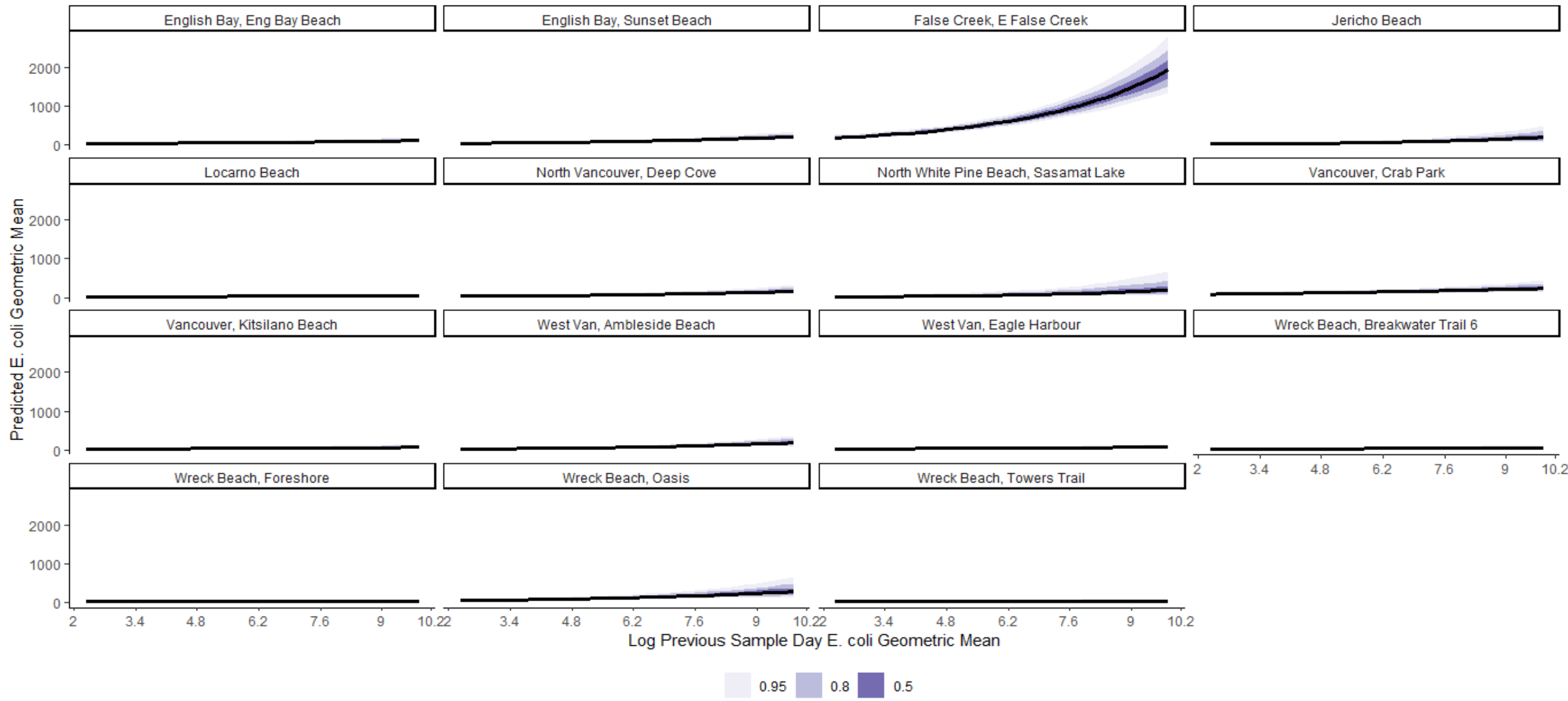


The average effects of the predictor variables varied by **beaches**

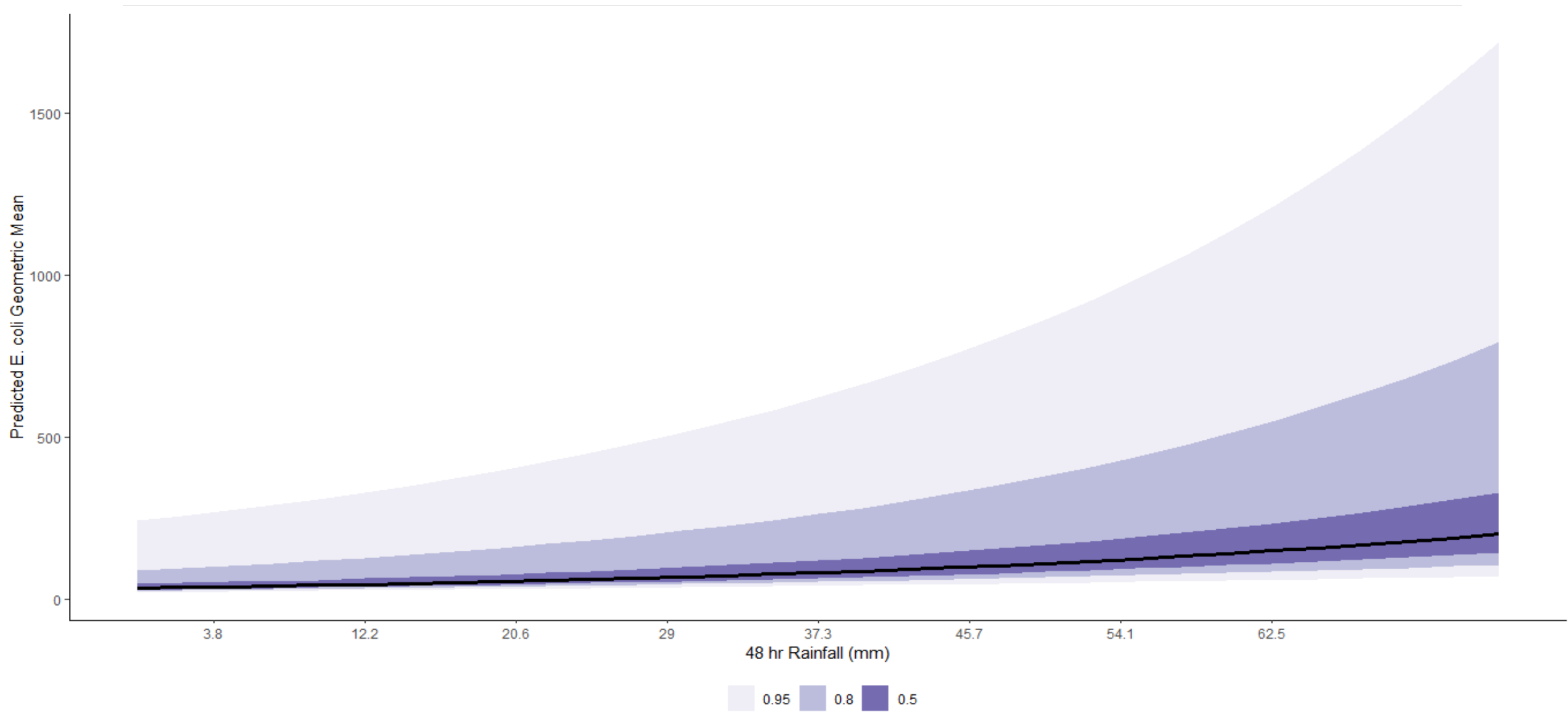
The predicted geometric *E. coli* concentration per values of previous sample day log geometric mean of *E. coli*



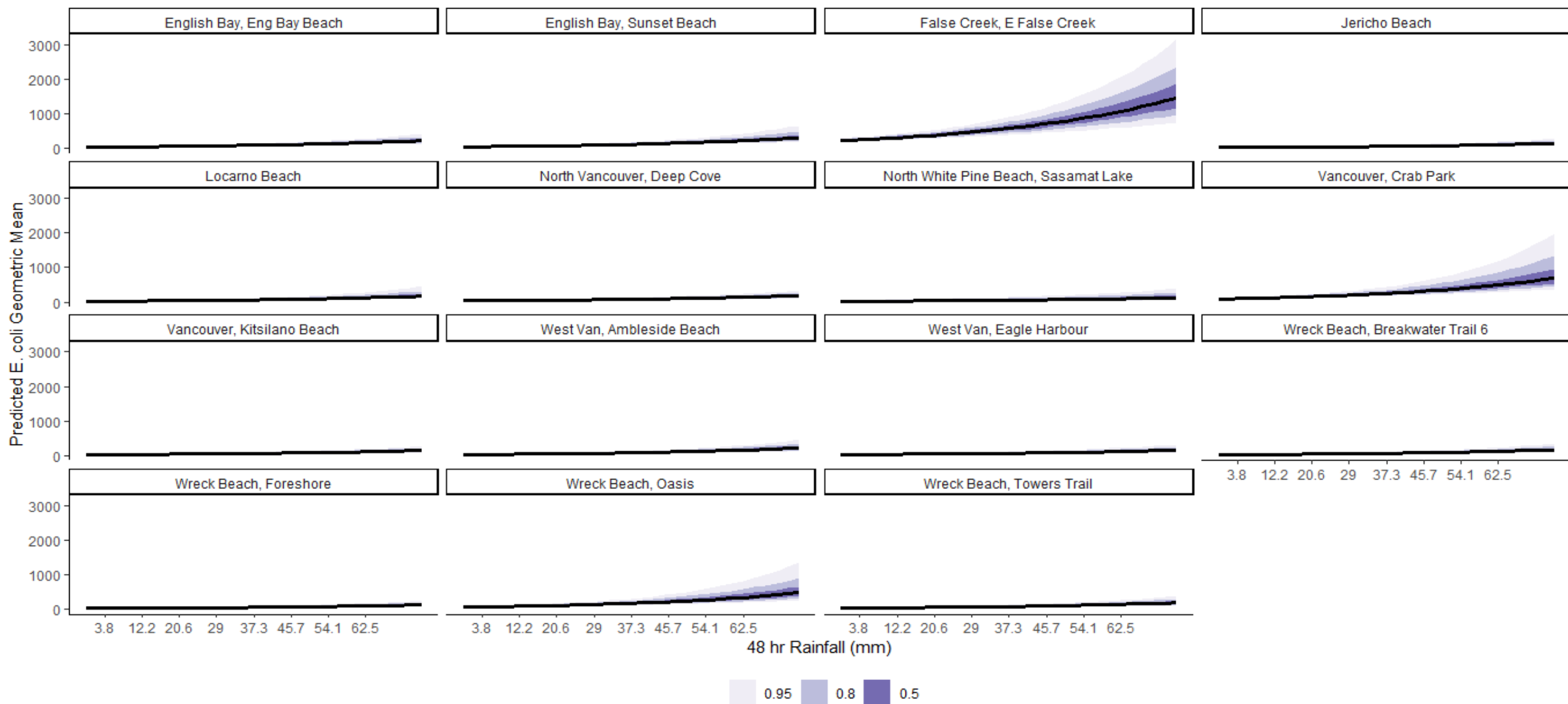
The beach-specific predicted geometric *E. coli* concentration per values of previous sample day log geometric mean of *E. coli*



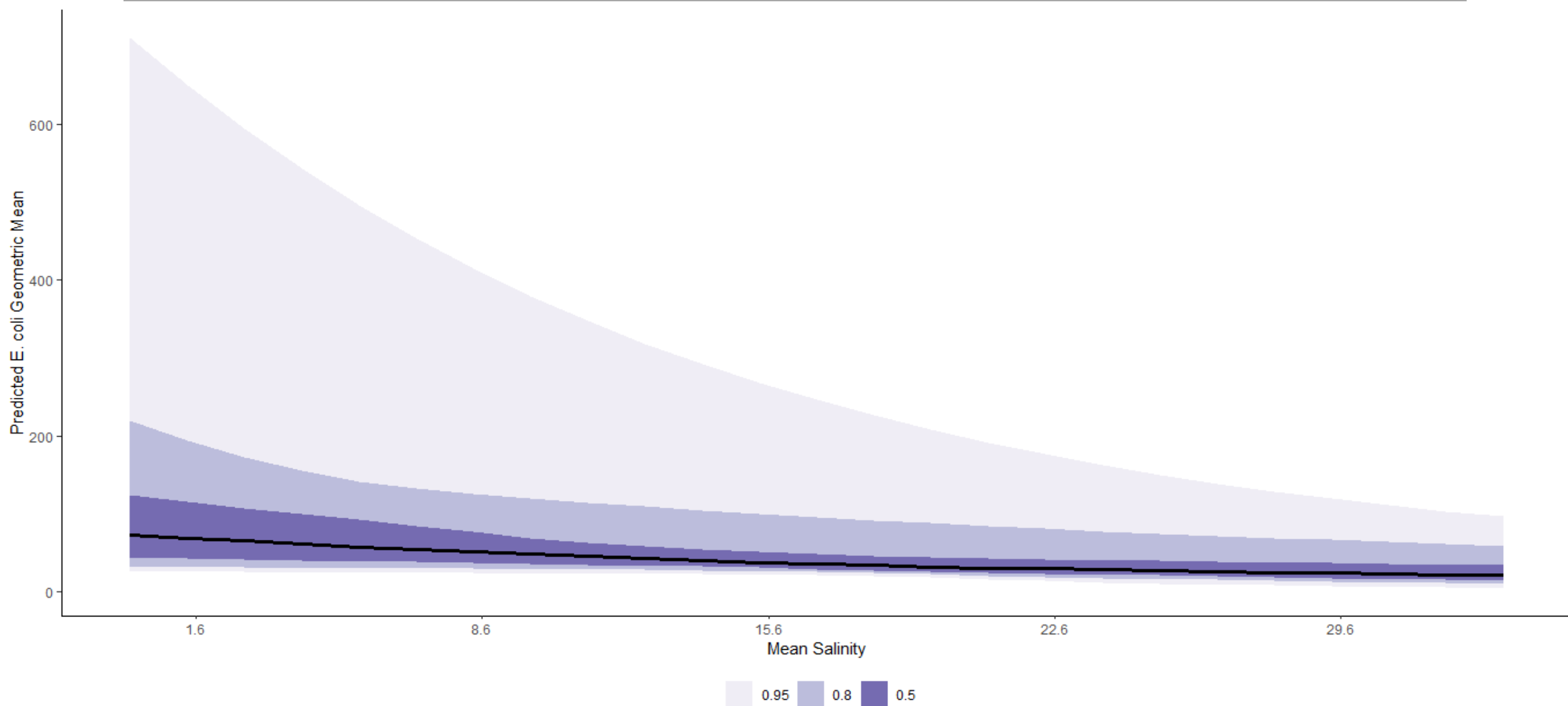
The predicted geometric *E. coli* concentration per value of 48-hr total rainfall



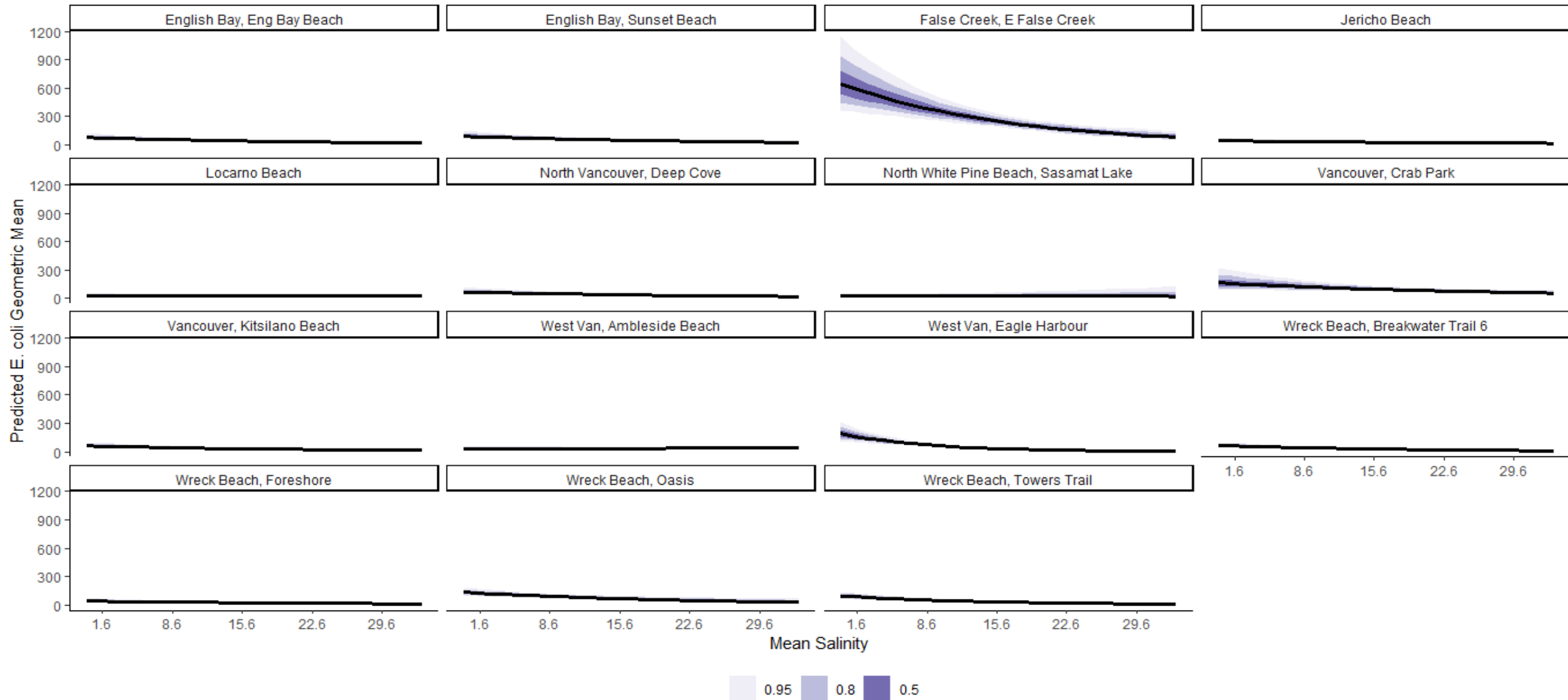
The beach-specific predicted geometric *E. coli* concentration per value of 48-hr total rainfall



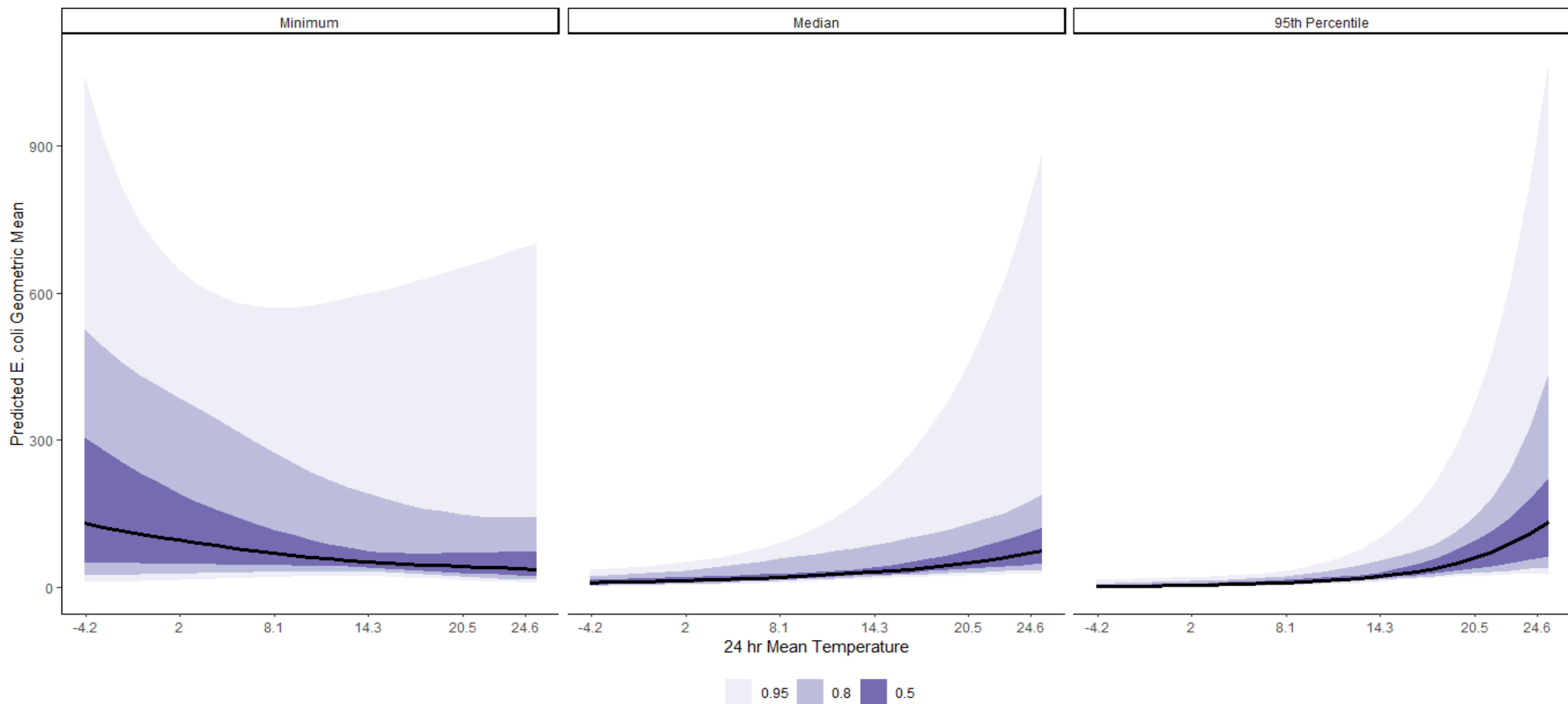
The predicted geometric *E. coli* concentration per values of mean salinity



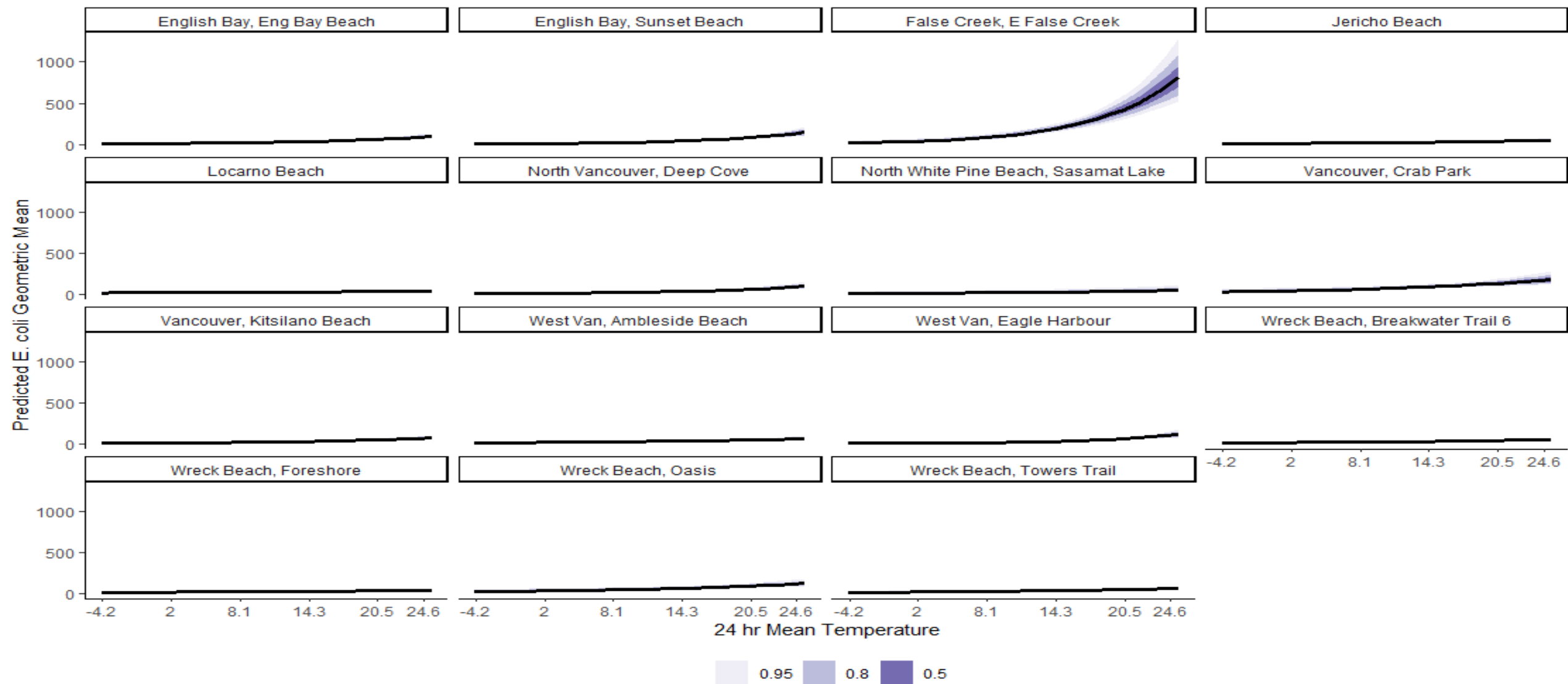
The beach-specific predicted geometric *E. coli* concentration per values of mean salinity



The predicted geometric *E. coli* concentration per 24 hr mean temperature at three values of 24-hr mean UV index



The beach-specific predicted geometric *E. coli* concentration per 24 hr mean temperature at the median value of 24-hr mean UV index



Conclusion and Future Plan

1

Beach-specific approach to beach monitoring programs and predictive models is warranted in Vancouver

2

The findings will form the basis for building real-time predictive models of marine water quality to enable more accurate beach management decision-making

Research Objectives

1

Determine which climate- and weather-related factors are associated with higher levels of *E. coli* in public bathing beaches over time.

2

Develop user-friendly predictive models, using a novel Bayesian network approach, for selected beaches to assist public health authorities in their risk management decisions.

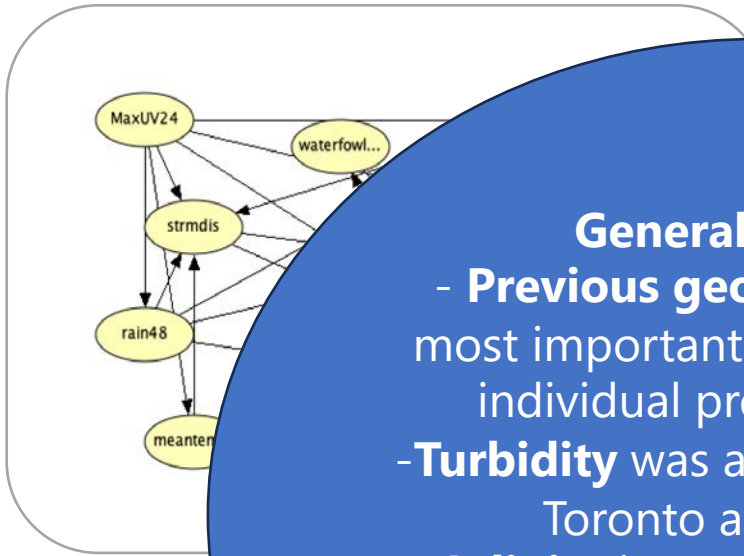
Predictive Bayesian Network Model

- We used information learned in Objective 1 analysis to guide the development of the Bayesian Network graphic models
- Type of Artificial Intelligence Graphical model that uses probability to determine the occurrence of an event

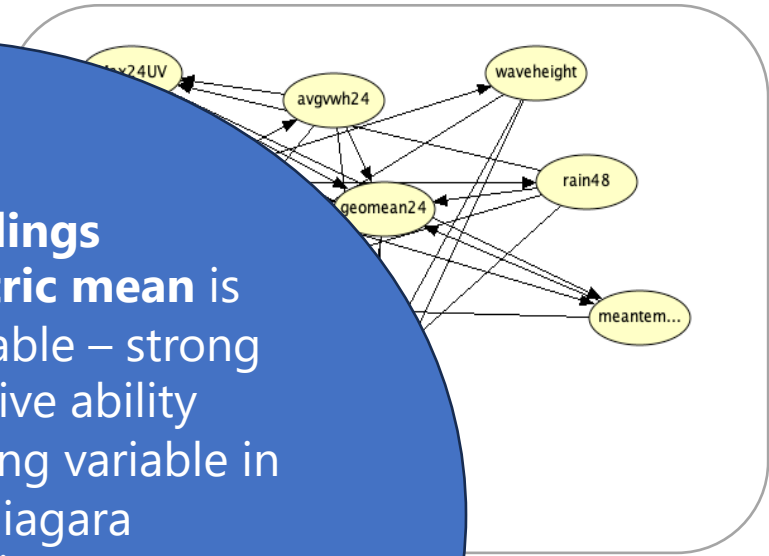


Bayesian Network Models

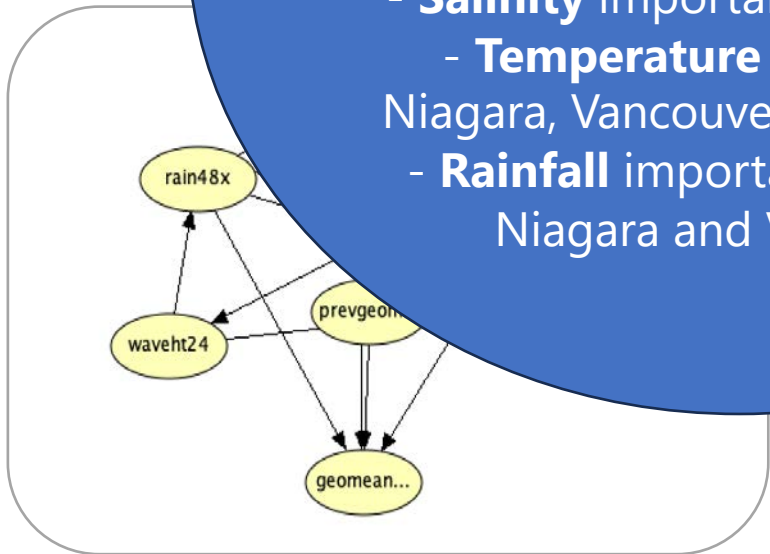
Toronto



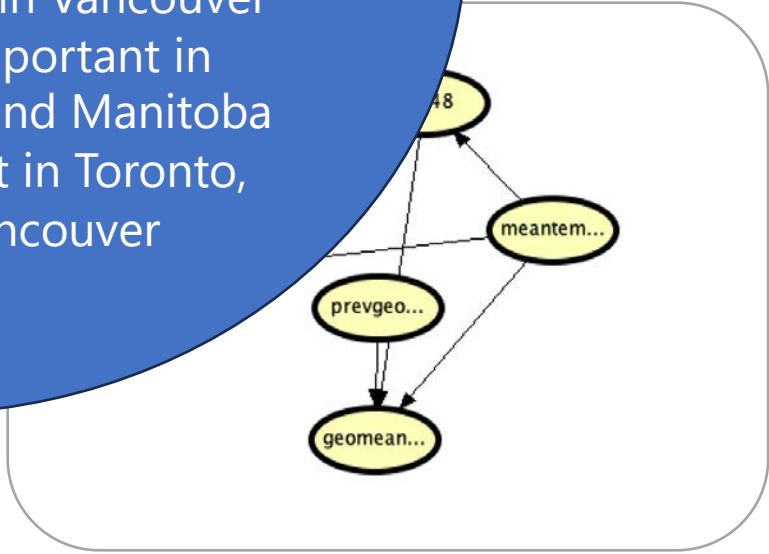
Niagara



Vancouver



Manitoba



General findings

- **Previous geometric mean** is most important variable – strong individual predictive ability
- **Turbidity** was a strong variable in Toronto and Niagara
- **Salinity** important in Vancouver
- **Temperature** important in Niagara, Vancouver and Manitoba
- **Rainfall** important in Toronto, Niagara and Vancouver

Future Direction



The Canadian Recreational
Water Quality Research Group

Environmental predictors
of recreational water
quality

Prediction Web
Application for Public
Health Units

Canadian Beach Cohort
Study

Canadian Algal Blooms in
Recreational Waters

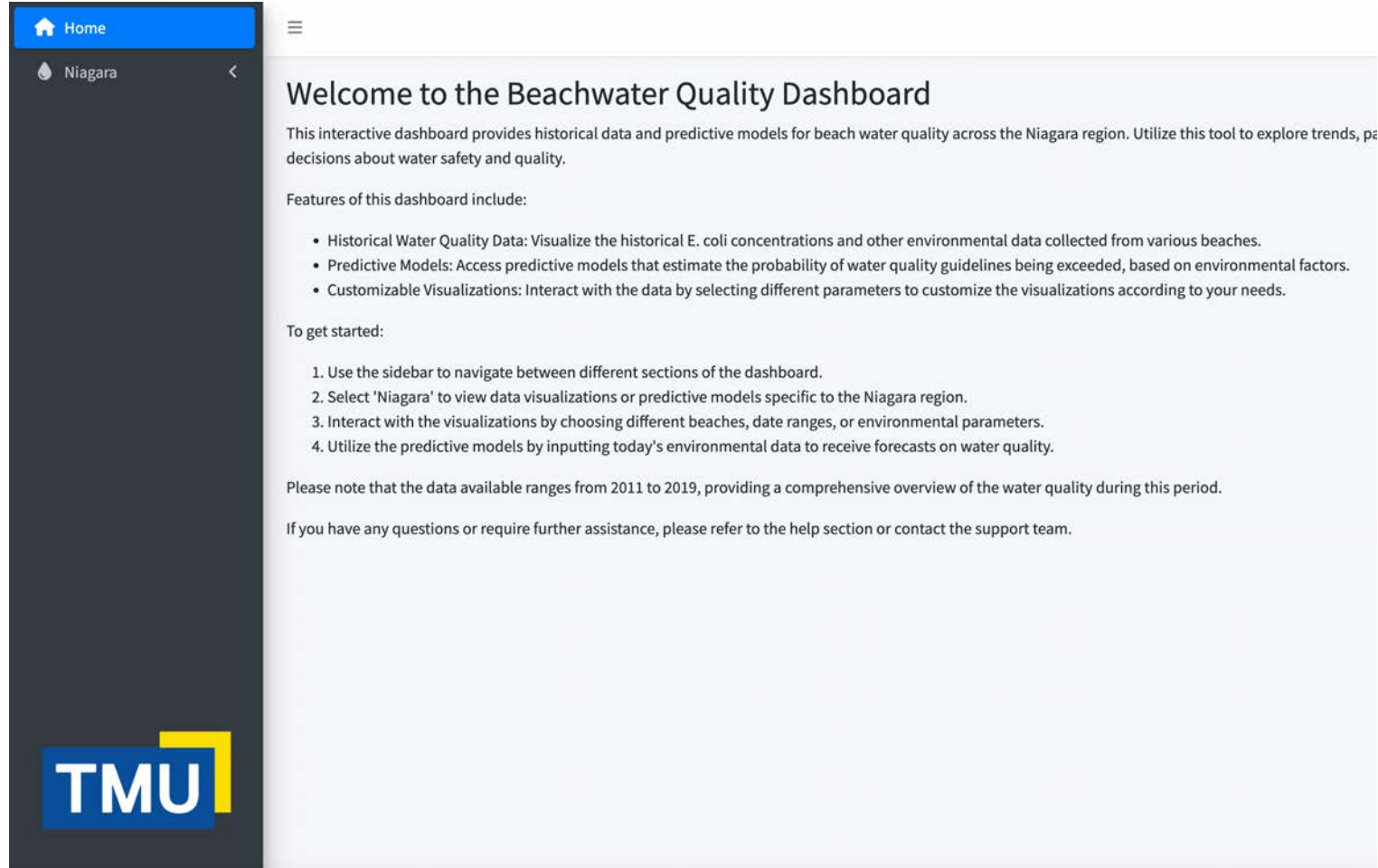
Rec Water R Shiny Application

- Interactive application/webpage for visualization of beach and weather data
- Home for the predictive models for daily threshold exceedance projections

Goal:

- User-friendly application
 - Informative tool
 - Accurate

R Shiny App



The screenshot shows a mobile application interface for the Beachwater Quality Dashboard. The top navigation bar is blue with a home icon and the text 'Home'. Below it, a dark sidebar contains a water drop icon and the text 'Niagara'. The main content area is light blue and contains the following text:

Welcome to the Beachwater Quality Dashboard

This interactive dashboard provides historical data and predictive models for beach water quality across the Niagara region. Utilize this tool to explore trends, patterns, and make informed decisions about water safety and quality.

Features of this dashboard include:

- Historical Water Quality Data: Visualize the historical E. coli concentrations and other environmental data collected from various beaches.
- Predictive Models: Access predictive models that estimate the probability of water quality guidelines being exceeded, based on environmental factors.
- Customizable Visualizations: Interact with the data by selecting different parameters to customize the visualizations according to your needs.

To get started:

1. Use the sidebar to navigate between different sections of the dashboard.
2. Select 'Niagara' to view data visualizations or predictive models specific to the Niagara region.
3. Interact with the visualizations by choosing different beaches, date ranges, or environmental parameters.
4. Utilize the predictive models by inputting today's environmental data to receive forecasts on water quality.

Please note that the data available ranges from 2011 to 2019, providing a comprehensive overview of the water quality during this period.

If you have any questions or require further assistance, please refer to the help section or contact the support team.

At the bottom left of the app interface, the TMU logo is visible, consisting of the letters 'TMU' in white on a blue background with a yellow square to the right.

Currently being finalized for testing with public health for summer 2024

Retroactively looking at 2023 data to look at predictive performance

R Shiny App

☰
☑ ? ☑ ⚙

Predictions for Niagara Beaches. Enter today's (February 16, 2024) environmental data to create a prediction

The probability (%) of E. coli exceeding the 200CFU/100mL guideline is:

31.58 %

Environmental Data:

Wave Height

5.01 - 10.00
▼

Yesterday's geomean e. coli

1 - 50.00
▼

Water Temperature (°C)

0 - 15.00
▼

Turbidity

0 - 5.00
▼

Fetch Data

Predict

Fetches Environmental Data:

Yesterday's UV Index: 1

Edit UV Index

Average Wind Speed (km/h): 18.58

Edit Wind Speed

Rainfall across 48h (mm): 0.4

Edit Rainfall

Average Temperature (°C): -1.28

Edit Temperature

Canadian Beach Cohort Study

- 2022: Toronto Woodbine Beach Feasibility Study
- 2023: CIHR Bridge Funding - Marie Curtis and Sunnyside Beach (623 participants, 405 households)
 - Surveyed participants and conducted follow-up to determine AGI
 - Additional water sampling on recruitment days for microbial source tracking
- 2024: Received funding from CIHR for full study! Will add beaches in Vancouver and Manitoba and potentially other sites



Algal Blooms Project

- Research Title: Burden of recreational water illness due to cyanobacteria and their toxins in Canadian freshwater beaches
- Four years of funding from PHAC
- Examine the impact algal blooms have on human and animal health (exposed pets) – ONE HEALTH approach

Conclusions

- We applied different and novel analytic methods to understand the relationship of environmental factors on water quality at beaches across four regions in Canada (Objective 1)
- We learned which factors had an important effect
- We used knowledge gained to develop predictive model using a novel approach – Bayesian Networks model – an application of AI
- We are actively exploring the health burden of poor water quality levels and algal blooms

Application of Research

- Prediction models can be applied to global health contexts to understand water quality (drinking water, recreational waters, etc)
- A web application like R Shiny app could provide public health units with a tool for predicting water quality
- Information gained from our beach cohort and algal bloom projects can have widespread impact in the area

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**For more information visit:
canadianbeachwater.ca**



Thank you!