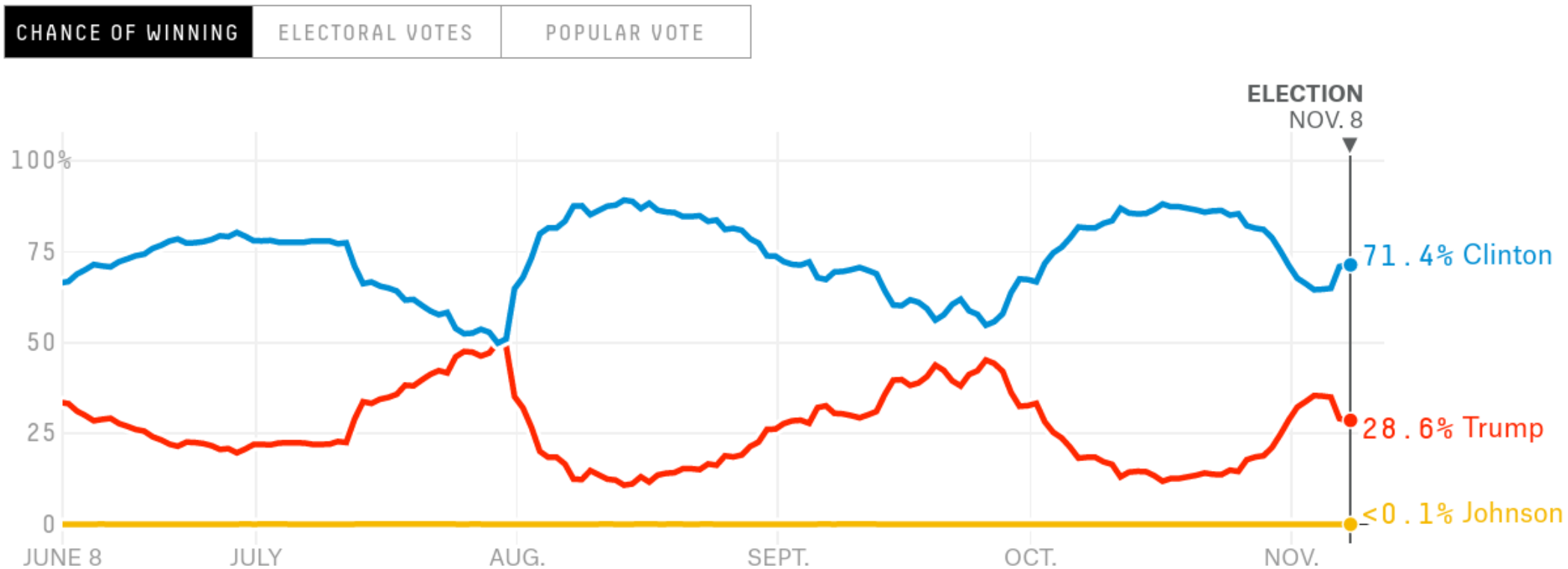


# Developing and Delivering PRISM Uncertainty Estimates for British Columbia

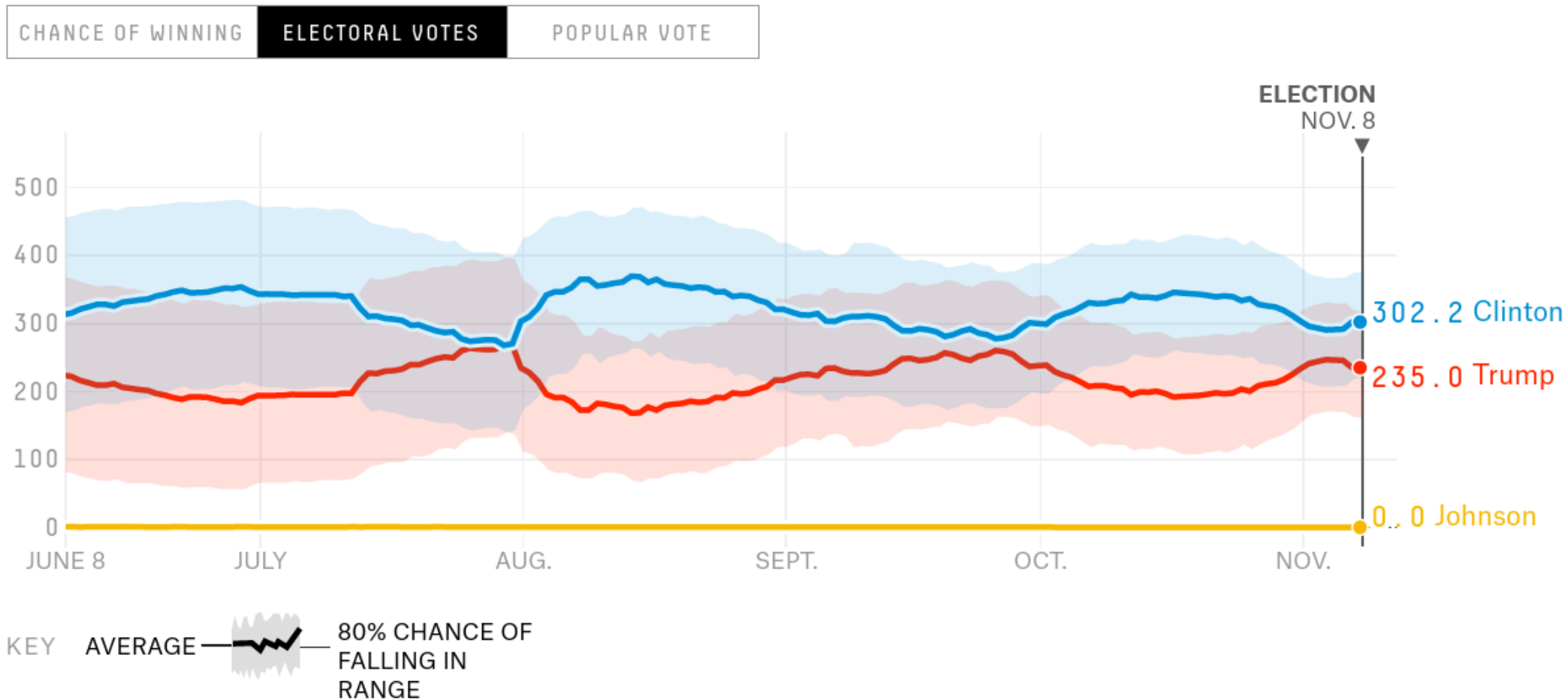


Why do this?

# A recent example of model uncertainty...

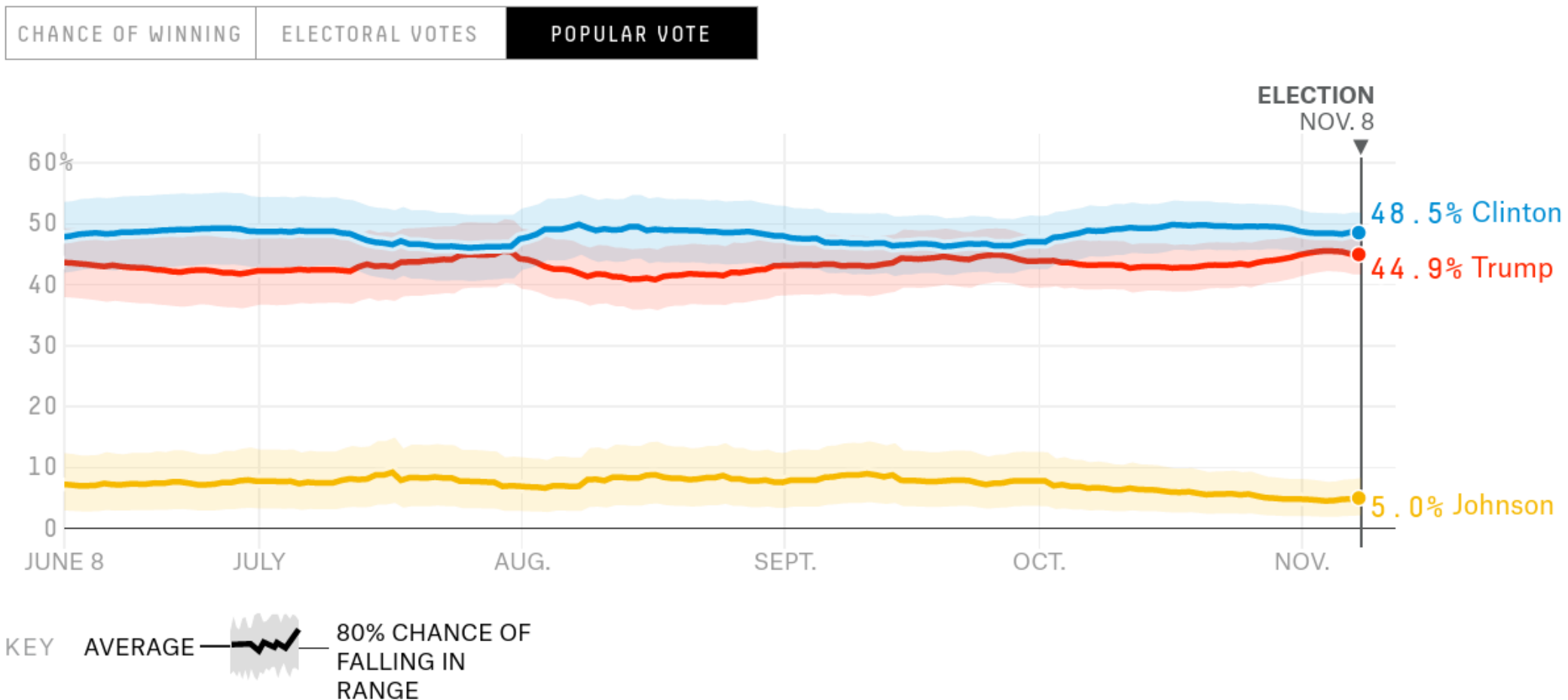


# A recent example of model uncertainty...





# A recent example of model uncertainty...



A recent example of model uncertainty...



election2016

results

president

senate

house

governor

exit polls

ballot me

## presidential results



290 trump ✓

47.2% votes | 60,526,852

270 electoral votes to win

clinton 232



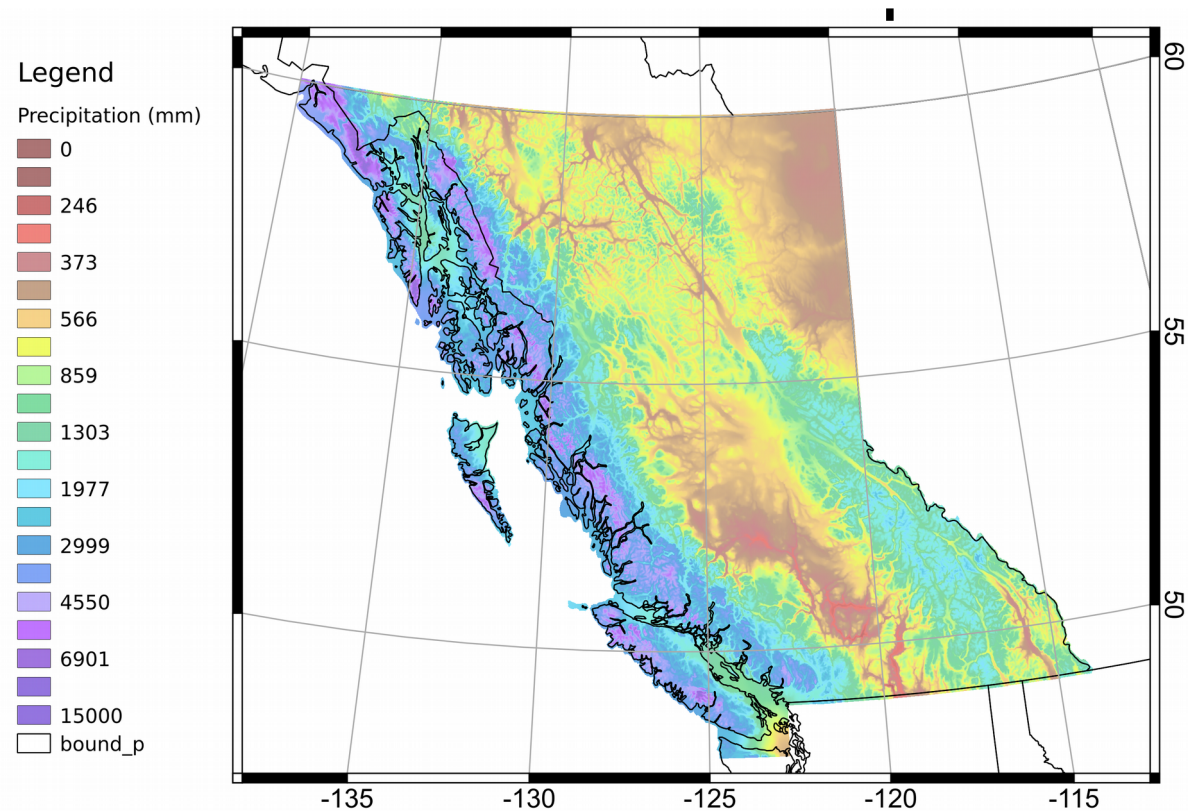
61,324,576 | 47.9% votes

A recent example of model uncertainty...



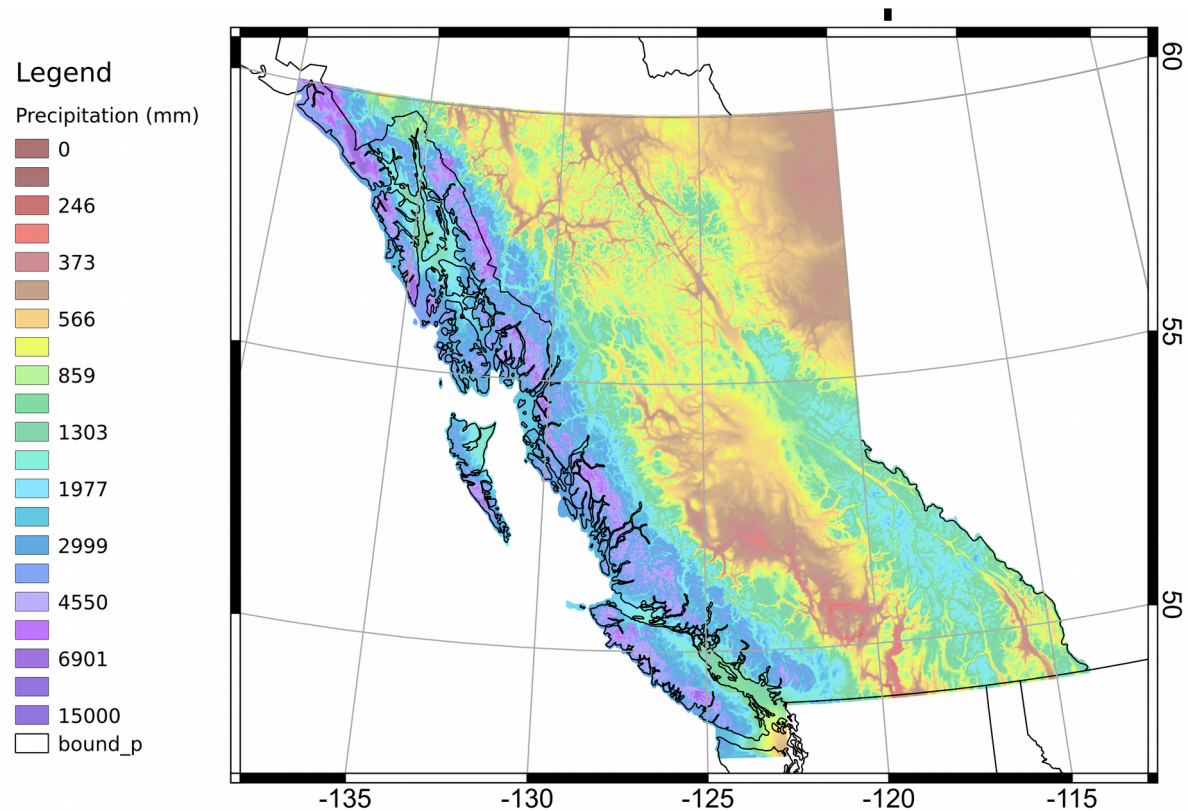
# What is PRISM?

- A formerly top-secret surveillance program?



# What is PRISM?

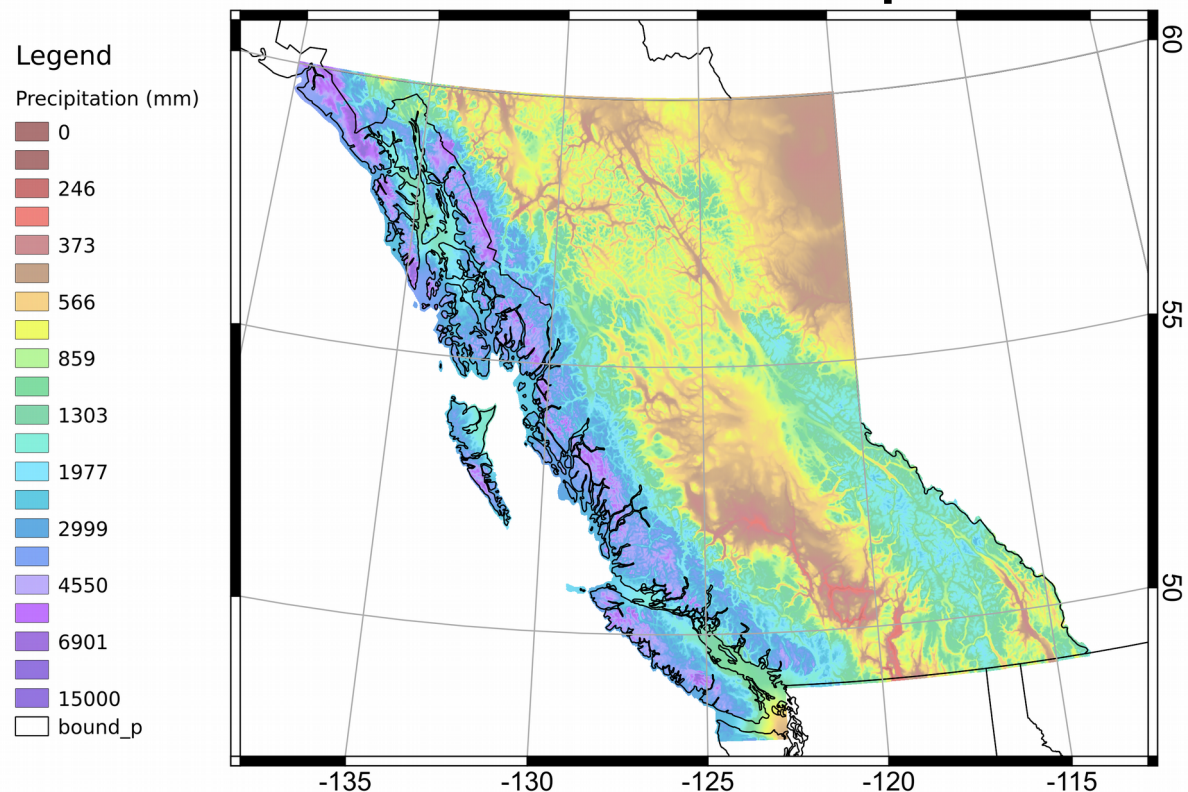
- ~~• A formerly top-secret surveillance program?~~
- A dynamical climate model?





# What is PRISM?

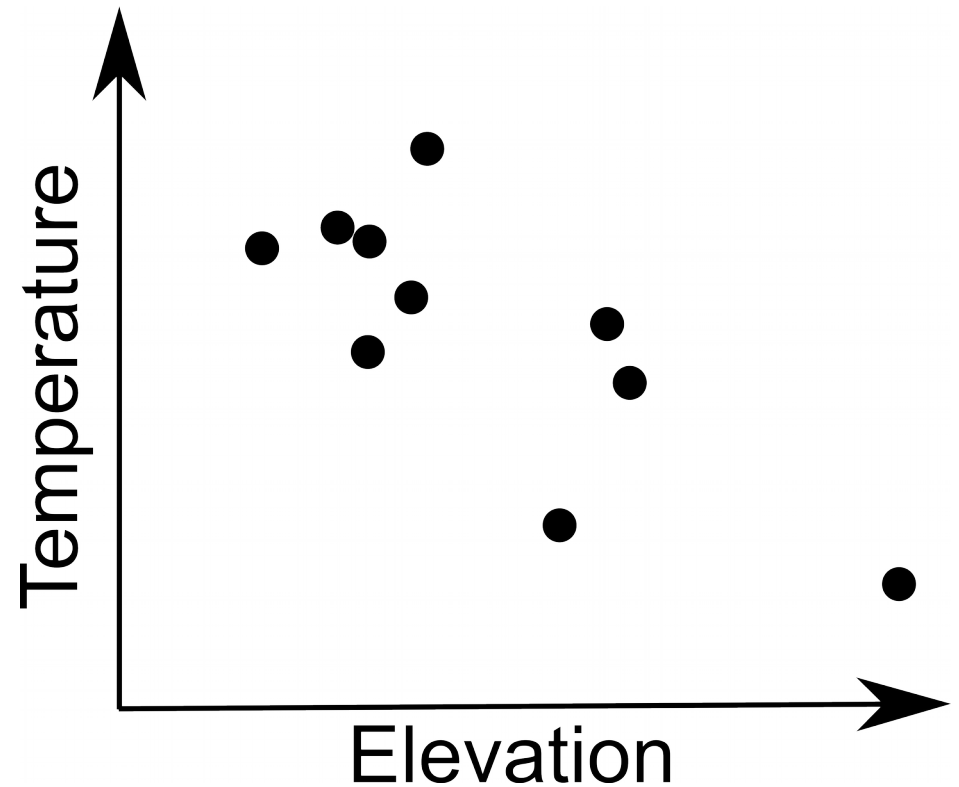
- ~~• A formerly top-secret surveillance program?~~
- ~~• A dynamical climate model?~~
- A statistical, elevation-dependent, regression-based observational data interpolator?





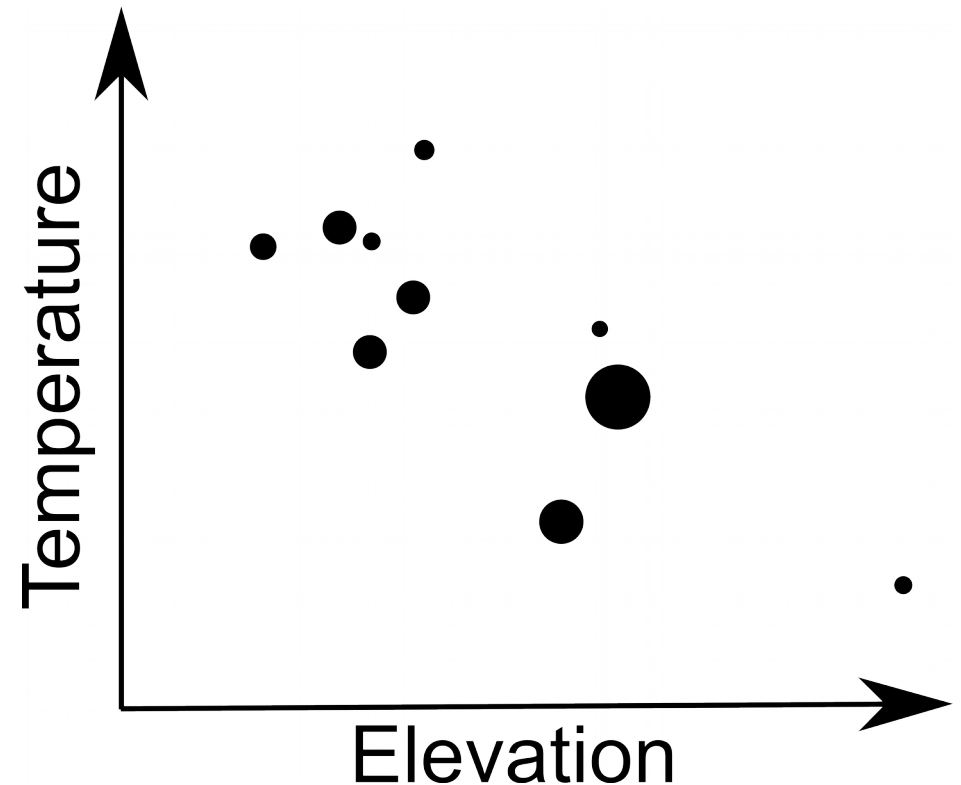
## What is PRISM?

- Relationships between a climate parameter and elevation are a first step in empirical interpolation



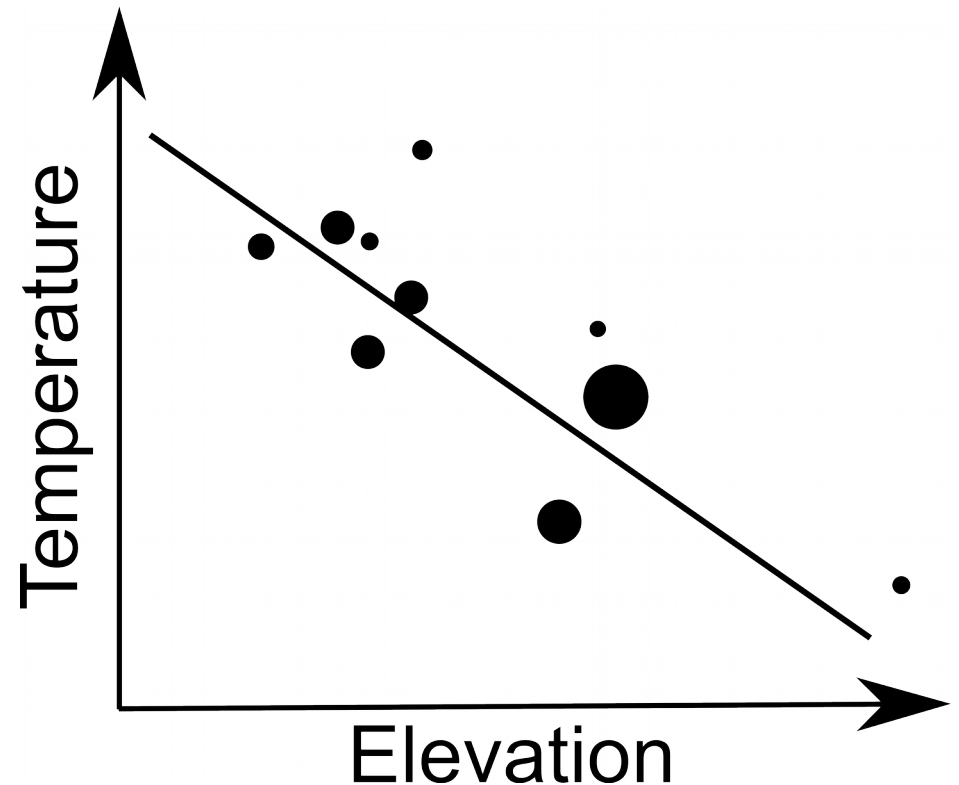
## What is PRISM?

- PRISM weights stations for the prediction at a given gridpoint by considering that location's climatic setting and nearby stations that may be in a similar climate setting.



## What is PRISM?

- Linear regression is then used to predict the climatological value at the location in question.
- This also yields a “prediction interval” based on the statistics of the regression.



# Types of uncertainty to consider:

- Uncertainty due to model parameterization
  - Can address by performing a detailed assessment of parameter uncertainty.
  - Run suites of models for range of parameters.
- Uncertainty due to observational precision/error.
  - We can explore the influence of varying observation values about a small range (i.e. 5% for precipitation or 0.5 C for temperature)
- Uncertainty due to the limited extent of the observational network
  - As the number of observational sites grows, the uncertainty in the gridded product declines.

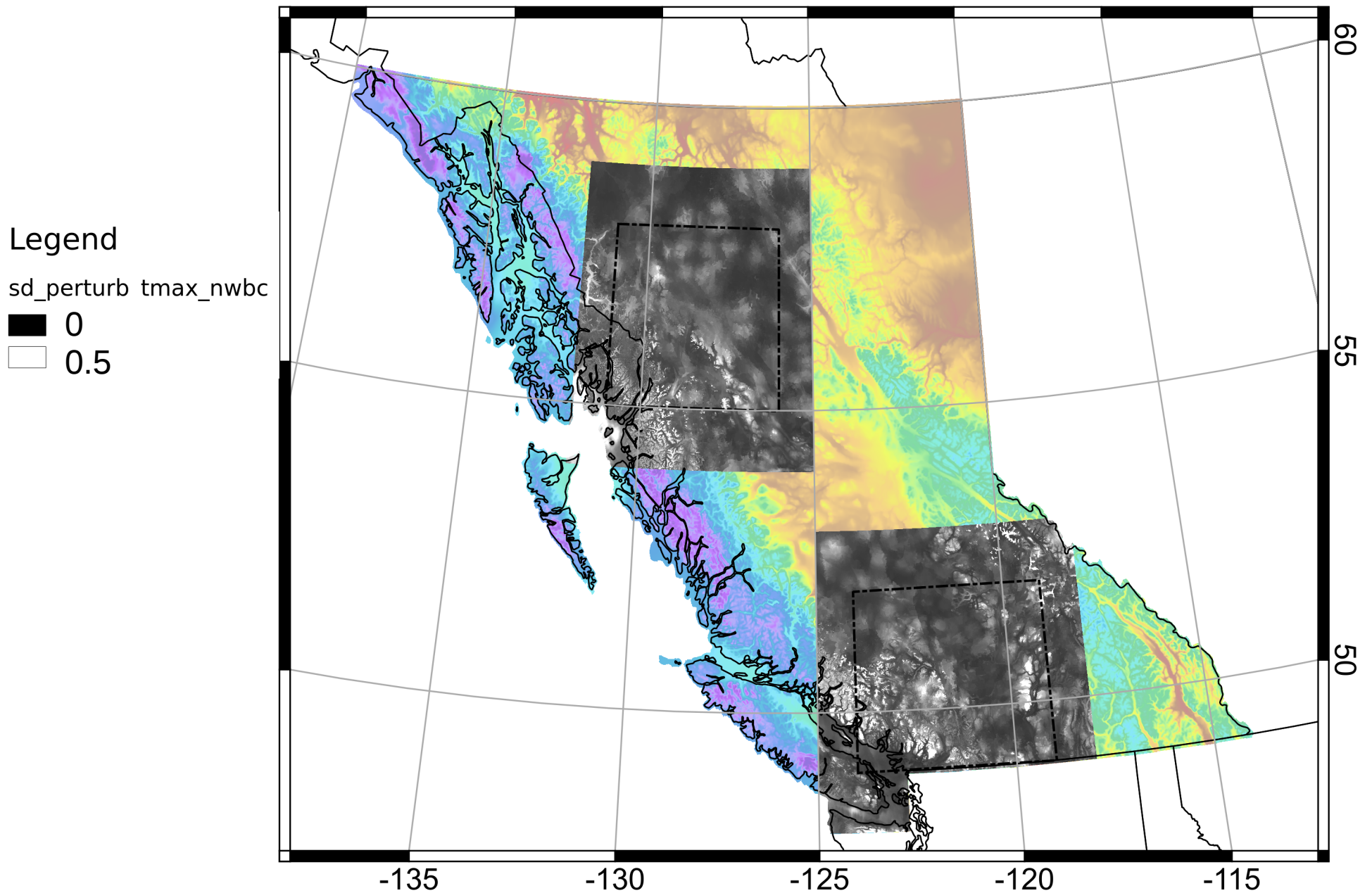
$$\epsilon \rightarrow 0 \quad \text{as} \quad N \rightarrow \infty$$

- Uncertainty arising from model insufficiencies/limitations
  - Unavoidable!
  - PRISM's default 70% prediction interval gives some estimate of this, but this falls in the realm of model development/improvement.
    - Incorporate remote sensing data.
    - Incorporate dynamic model results.

# My experiments = brute force!

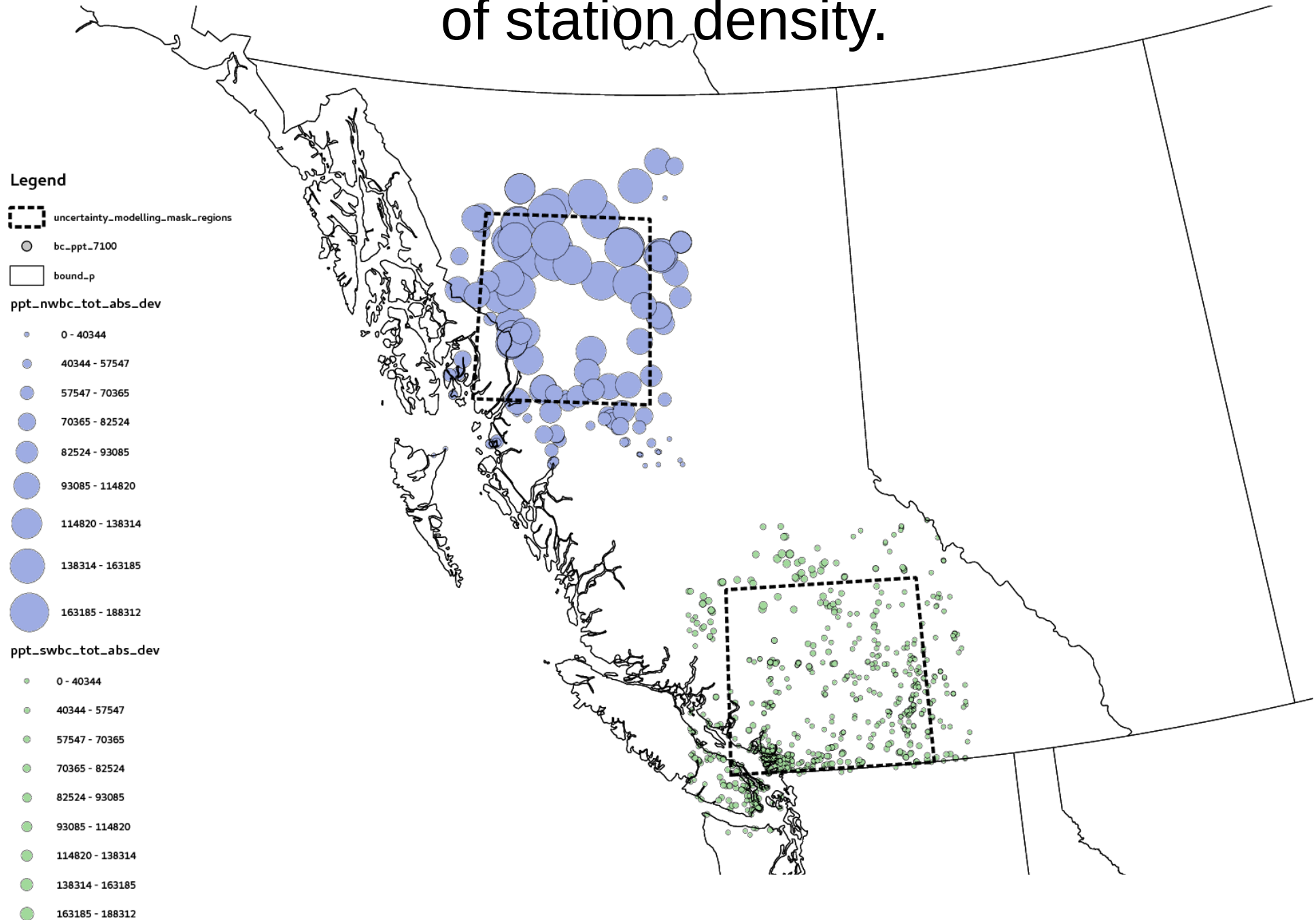
- Jackknife cross validation
  - Multiple model runs, leaving out a new station each time to evaluate the performance of the model at the station.
- Station data perturbation
  - Multiple model runs in which the climate data are perturbed by some small amount.
  - See if the perturbation range is amplified or suppressed away from station locations.
- Cross validation using blocks of stations
  - Multiple model runs in which the given network is sub-sampled randomly.
- Synthetic network generation
  - Multiple (detect a pattern?) model runs in which synthetic networks are generated by sampling the “full” model with random error based on the regression statistics from the full model.

# Changes in predicted data due to small deviations in station data



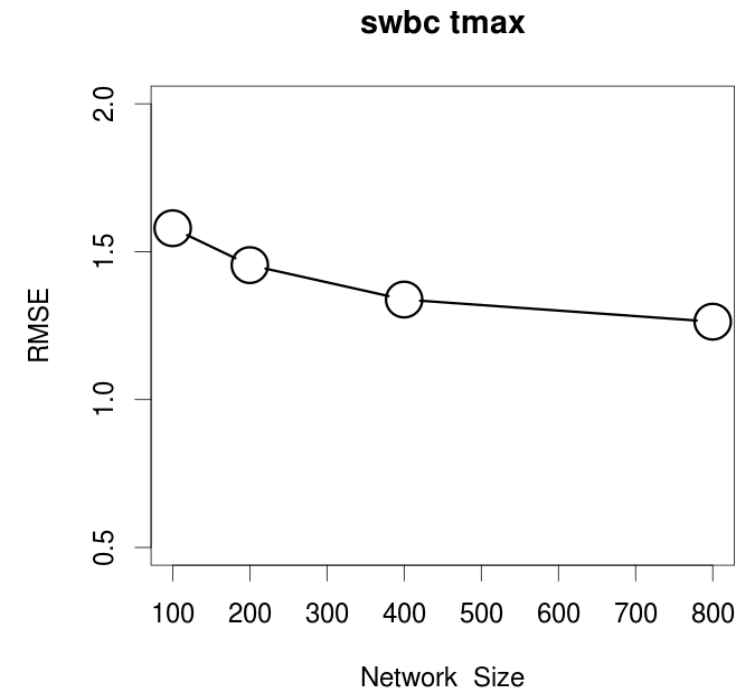
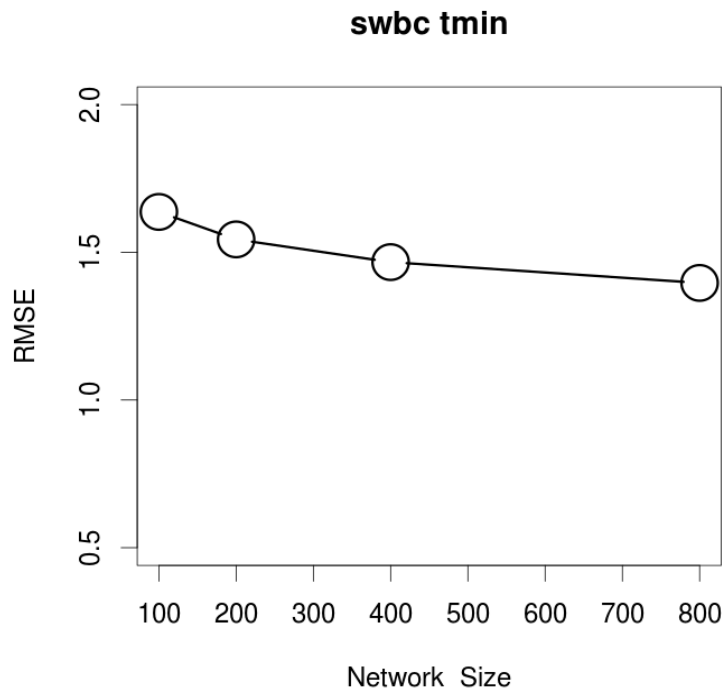
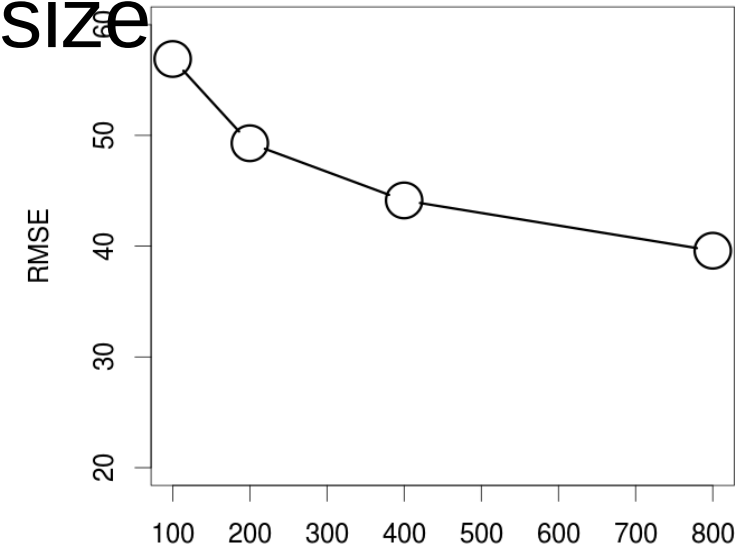


# Radius of influence of a given station is a function of station density.



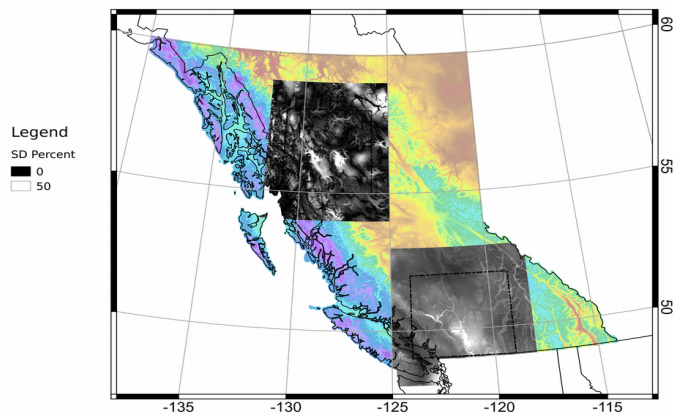
# Synthetic networks indicate model performance as a fxn. of net size

- Functional relationship between network size and RMSE.
- Apparent asymptote where increasing network density would result in no further improvement in error, or gains are slow.

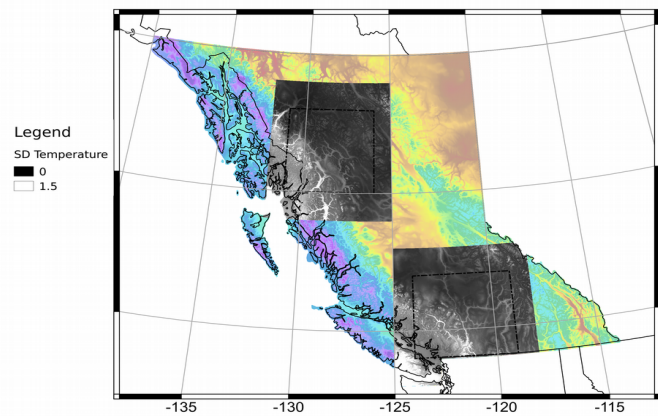


# Driving PRISM with synthetic networks of data yields information on the sensitivity of regions to input data.

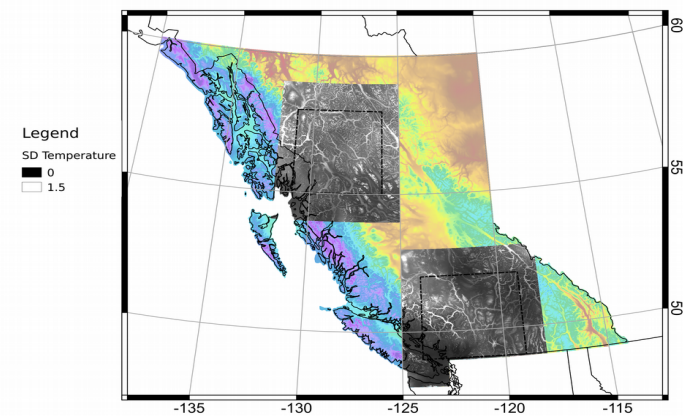
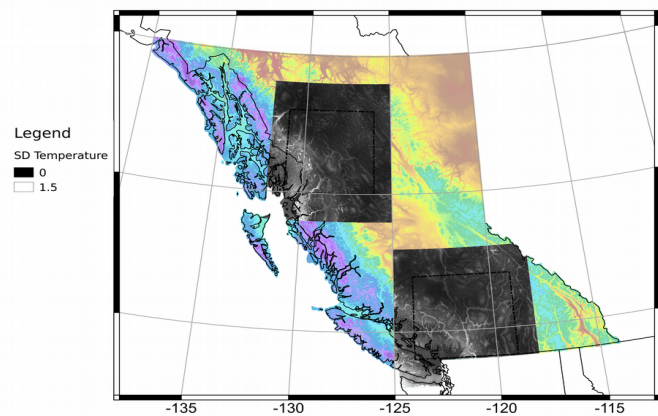
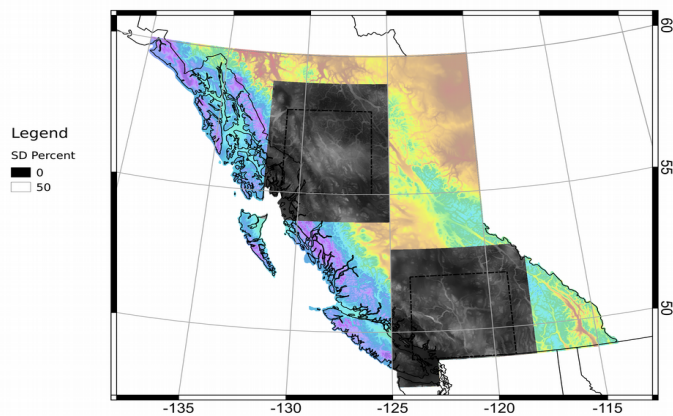
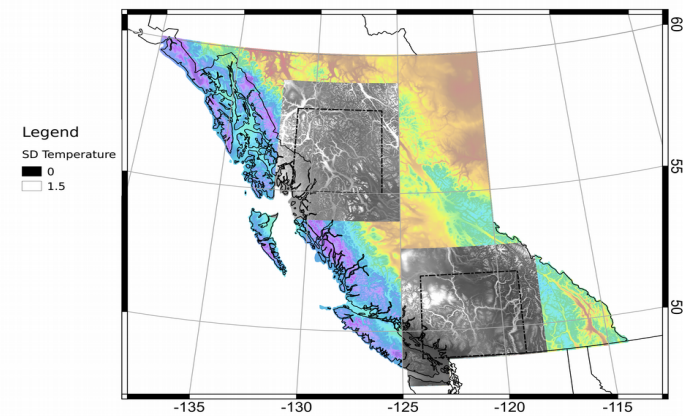
Precipitation



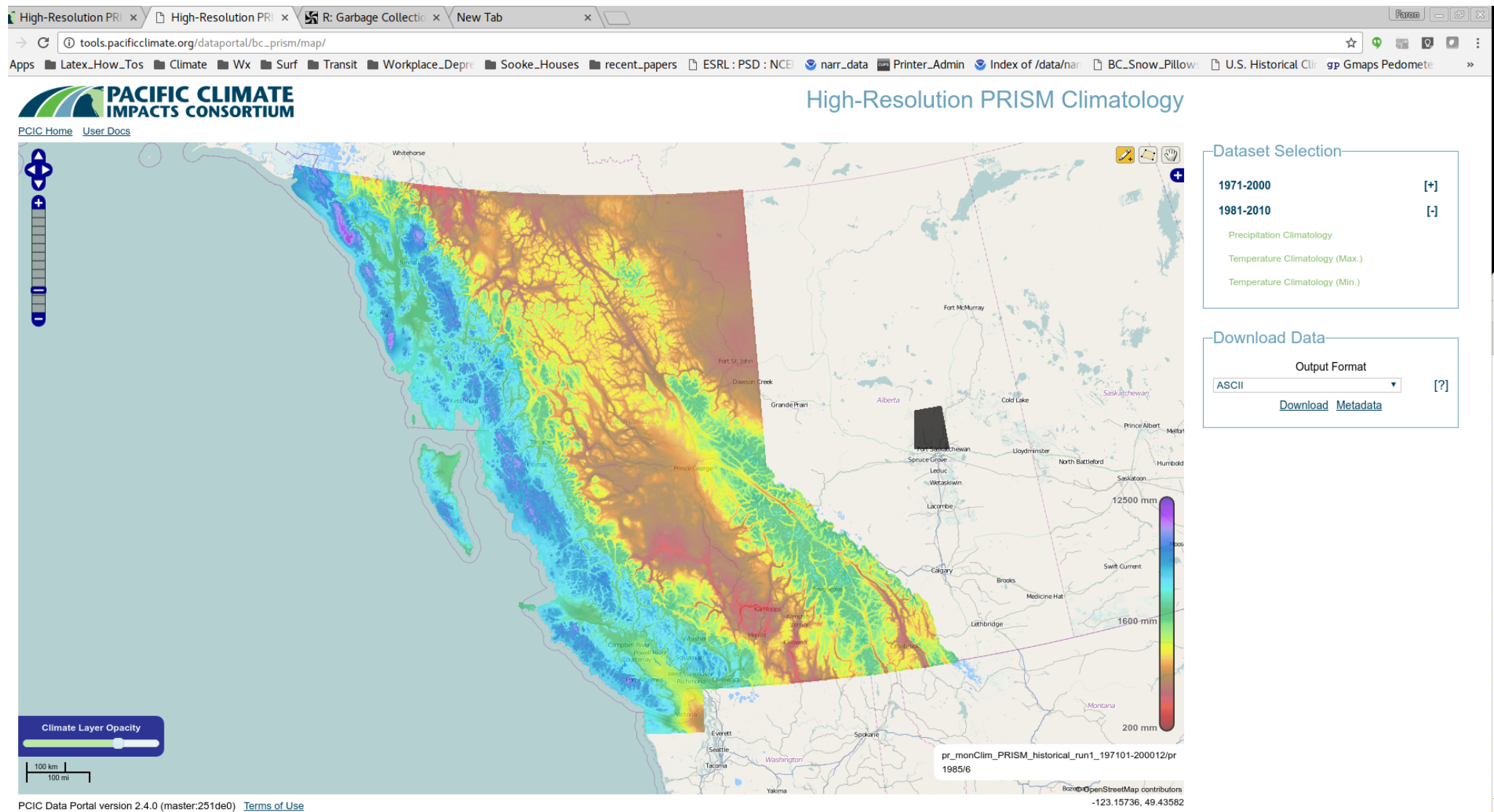
Tmax



Tmin



# Delivery of data through raster data portal



# Conclusions

- We find that PRISM is stable to perturbations in its input data.
- However, perturbations do have a remote impact and this should be quantified
- Generation of synthetic networks show where PRISM is sensitive to having data available.
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