

# The Representation of Precipitation Characteristics in High Resolution WRF Simulations over Western Canada

Andre R. Erler<sup>1</sup>   Brian Menounos<sup>2</sup>



<sup>1</sup>Aquanty Inc.

<sup>2</sup>University of Northern British Columbia, Canada

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# Outline

## Introduction

Western Canada: Orographic Precipitation

## General Overview

Temperature Bias / Lapse-rate

## Summer Precipitation (and Resolution)

## Snow Accumulation at Elevation

## Conclusion



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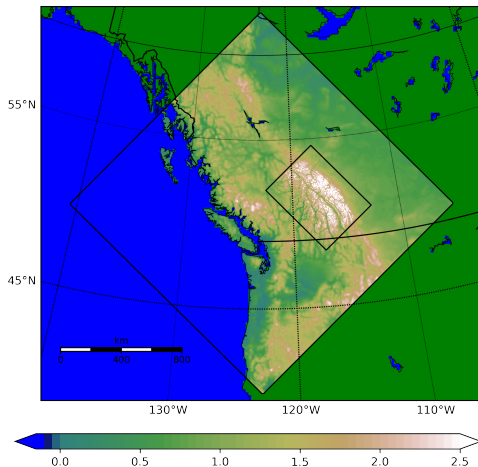
# Overview

High-resolution WRF  
Simulations over Western  
Canada at 7 km and 1 km  
for 5 (water-)years

## Simulated Years:

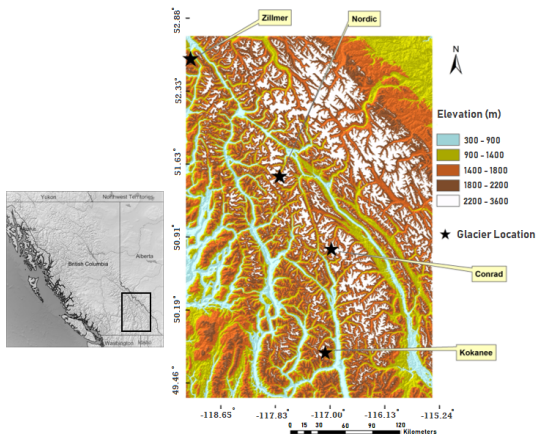
- ▶ 2010/11
- ▶ 2011/12
- ▶ 2012/13
- ▶ 2013/14
- ▶ 2014/15

Topography [km] and Domain Outlines



Outer WRF domain at 7 km,  
and inner WRF domain at 1 km

# Motivation: Glacier Mass Balance



Brian Menounos' group at UNBC conducts fieldwork and mass balance modeling on glaciers in the Columbia mountains — we run WRF to drive mass-balance models

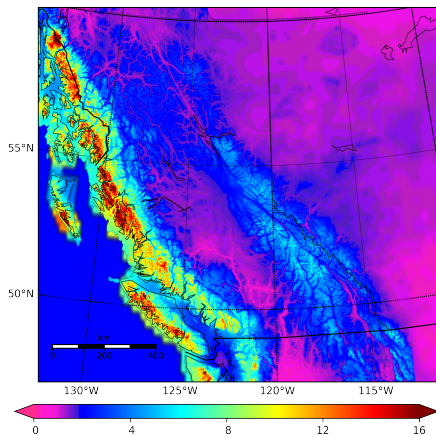
## Field Work



Ben Pelto on Kokanee Glacier

# Western Canada: Orographic Precipitation

Precipitation Climatology (PRISM & GPCC)



Annual average precipitation over Western Canada (Merged Dataset)

## General precipitation pattern

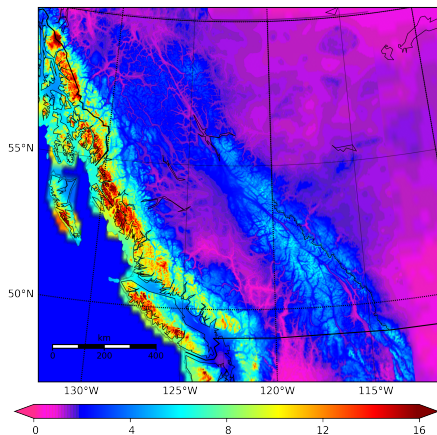
### Merged Observations

Combined data from PRISM (1 km) and GPCC (0.25°)

- ▶ Very high precipitation in the Coast Mountains
- ▶ Interior Plateau and the lee of the Rockies are very dry
- ▶ Precipitation gradient stronger in winter, weaker in summer

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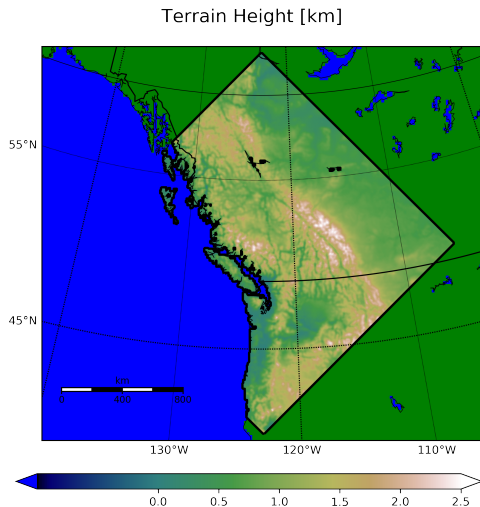
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# WRF Model and Domain Setup

## WRF Domains

- ▶ 7 km Western Canada
  - ▶ 1 km Columbia/Rocky Mountains
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- ▶ WRF-ARW 3.6.1
  - ▶ Noah-MP (**CLASS** snow),  
RRTMG radiation,  
**Thompson MP**,  
Grell-3 cumulus (at 7 km),  
MYNN3 PBL

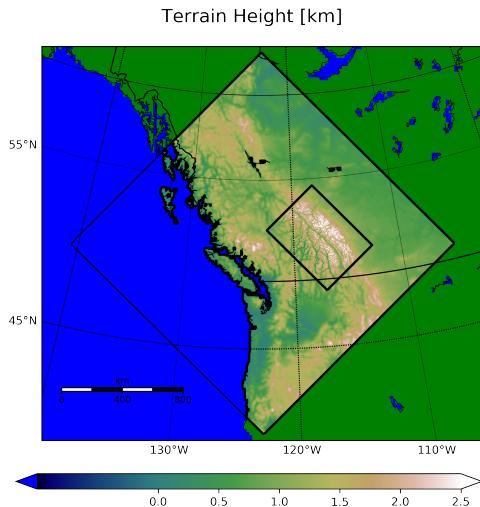


Outer WRF domain at 7 km  
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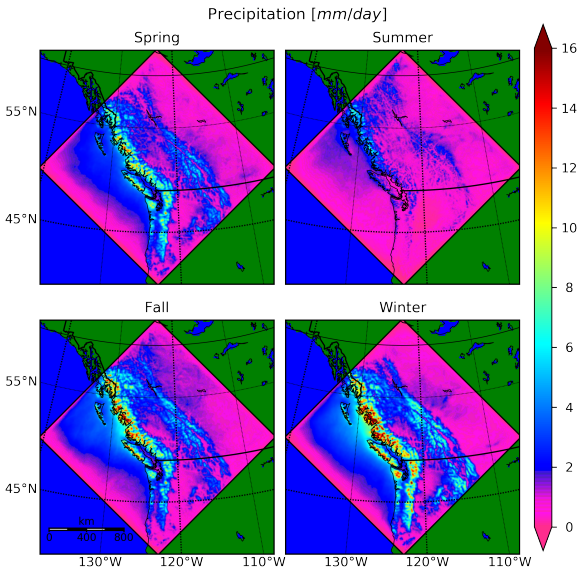
Summer Precipitation (and Resolution)

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# Seasonal Precipitation Pattern at 7 km



## Outer Domain Precipitation Pattern

- ▶ Very high precip at Coast Mountains
- ▶ and drier downwind of mountains
- ▶ But orographic precip is too low and rain shadow too weak
- ▶ Summer precip is far too low

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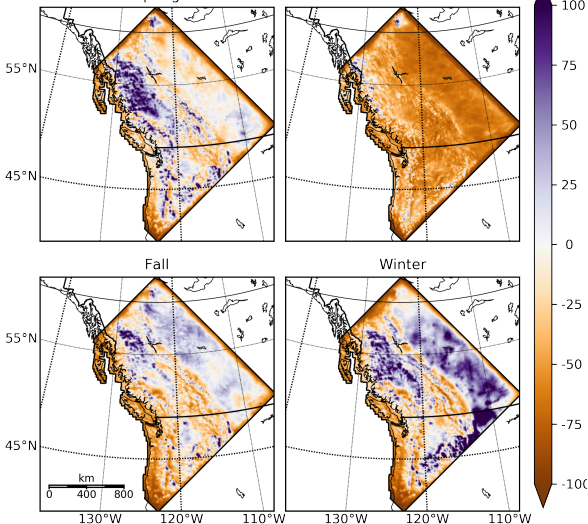
Precipitation Fractions [%] w.r.t. Merged Observations

Spring

Summer

Fall

Winter



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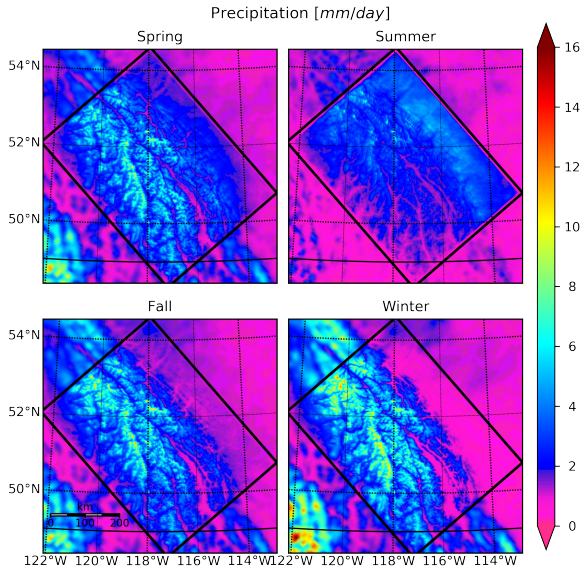
# Seasonal Precipitation Patterns at 1 km

## Inner Domain Precipitation Pattern

- ▶ Summer is too dry,  
Spring too wet
- ▶ Winter shows  
pronounced N-S  
dipole

### Observations

Reference period is  
1970-2000, which  
may influence spa-  
tial patterns due to  
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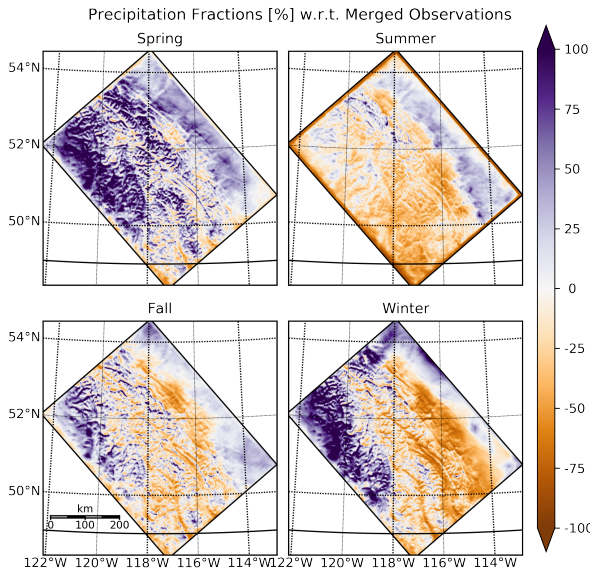
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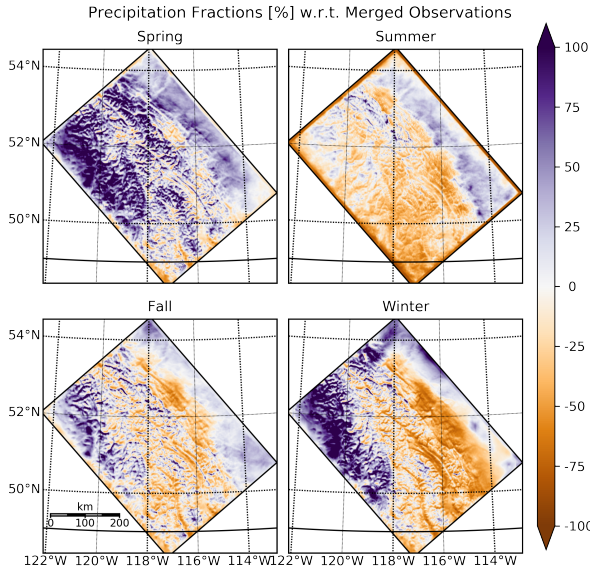
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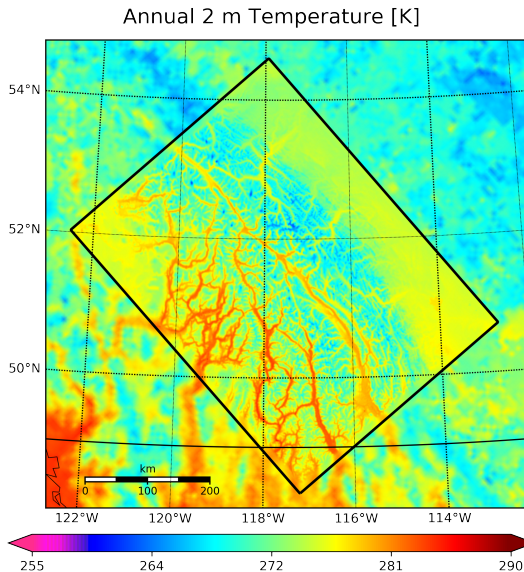
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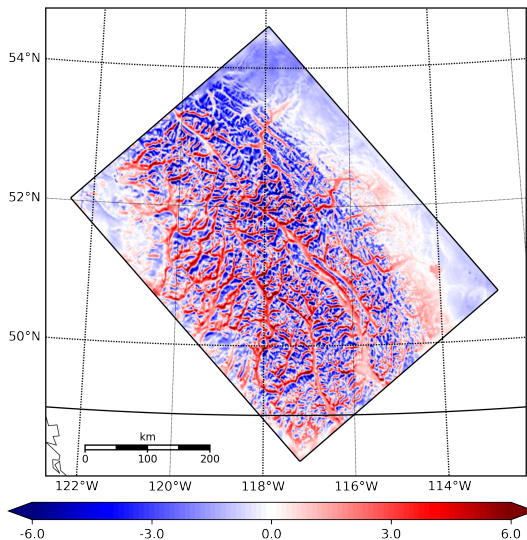
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- ▶ Biases strongly associated with valleys and peaks

### Inversions?

Potentially missing inversions and PBL processes at higher peaks — or Observations?

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2m Temperature Bias [K] w.r.t. Merged Obs.



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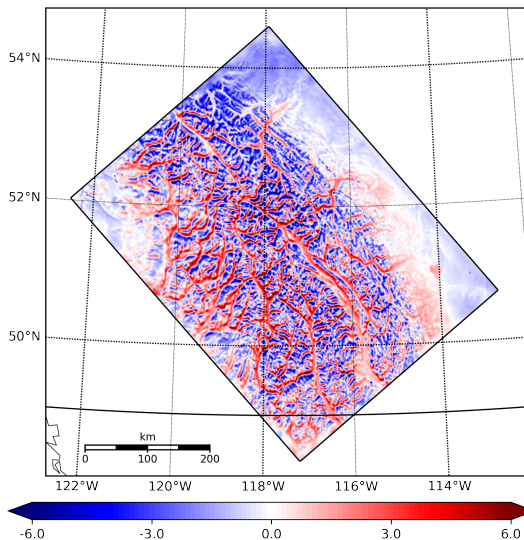
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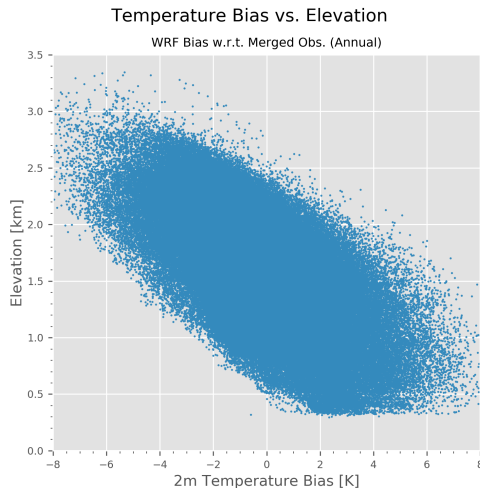
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Temperature bias vs. elevation  
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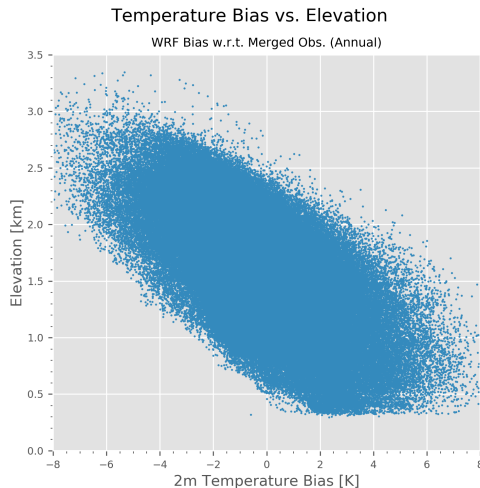
## Lapse-rate Bias

- ▶ Valleys are too warm, peaks too cold
- ▶ Pattern is similar in winter and summer
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Linear bias-correction by elevation may work very well:  $\sim 4.5 \text{ K/km}$

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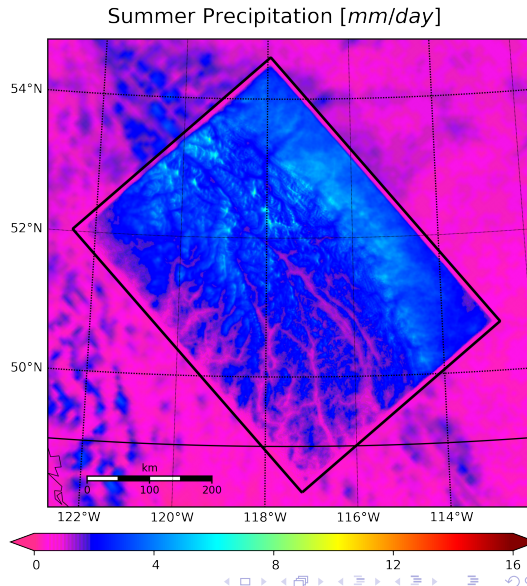
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Could this be missing convection? (We have a convection scheme...)



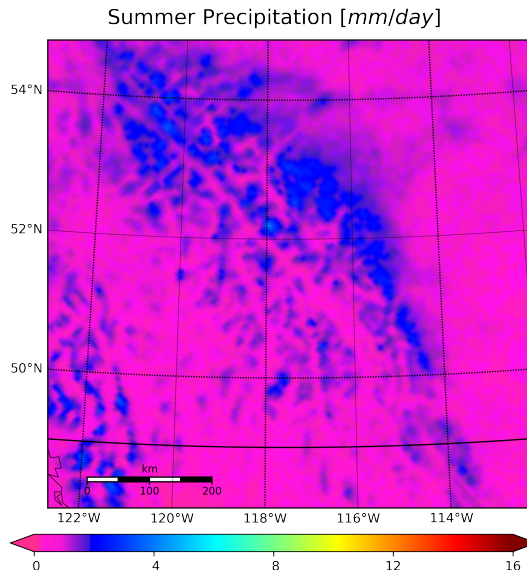
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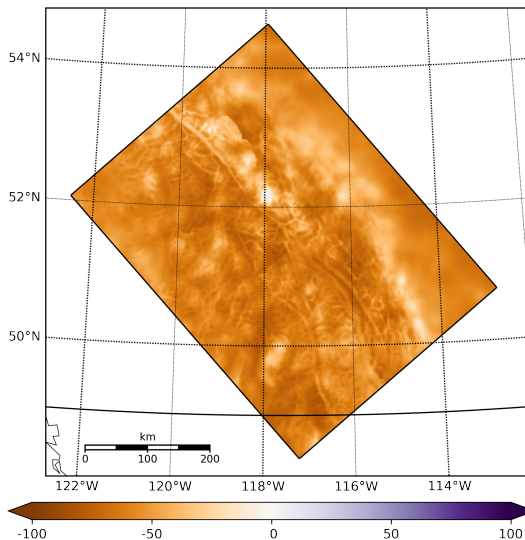
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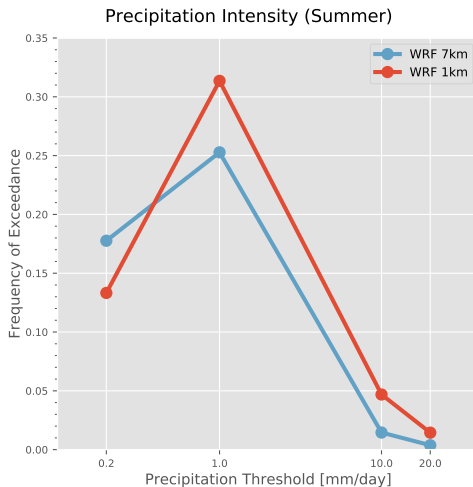
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Summer Precipitation Fractions [%] w.r.t. Merged Obs.



# Convection? Analysis of Precipitation Intensity



Frequency of threshold exceedance  
for inner and outer domain

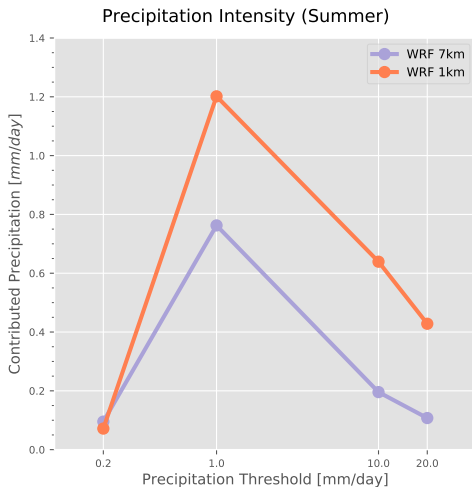
## Frequency of heavy precip. (Summer)

- ▶ Heavy precip events much more frequent in inner domain (x4)
- ▶ ... and they do count!
- ▶ Likely not due to grid-scale precip

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Could be convection,  
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Contribution of precipitation  
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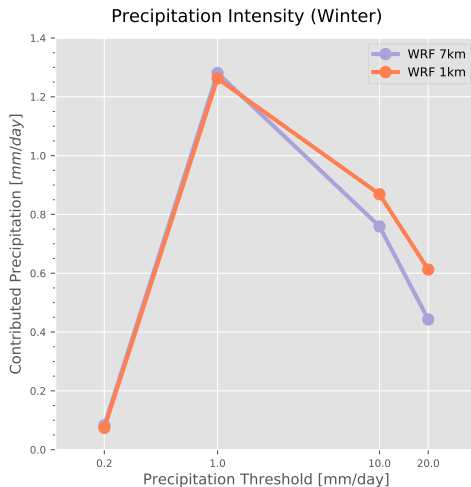
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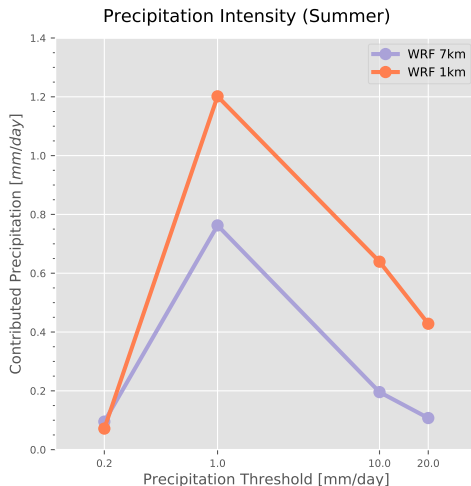
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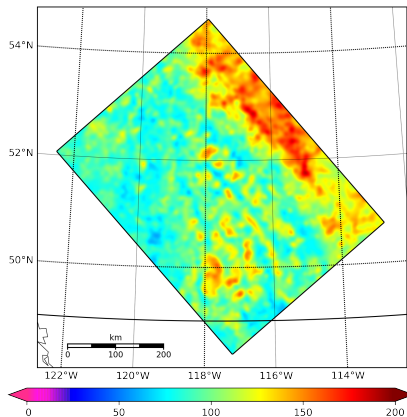
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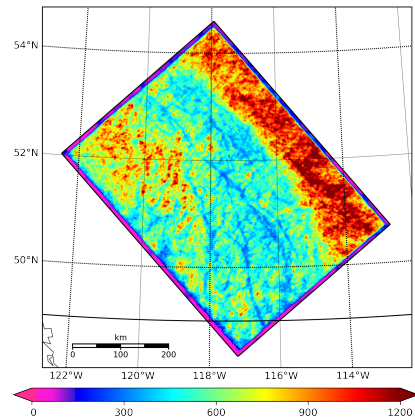
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# Clear Added Value of Resolution for Convection!

Summer Maximum Cumulus Precip. (1h) [mm/day]



Summer Maximum Grid-scale Precip. (1h) [mm/day]

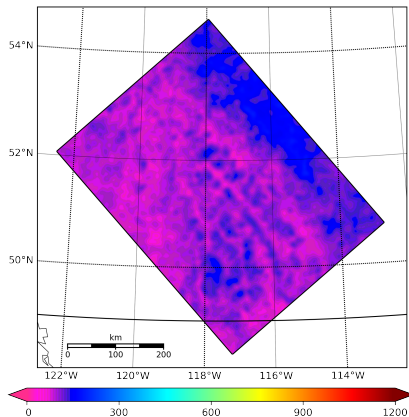


Maximum hourly accumulation per month: convective precip for outer domain (left) and grid-scale for inner domain (right).

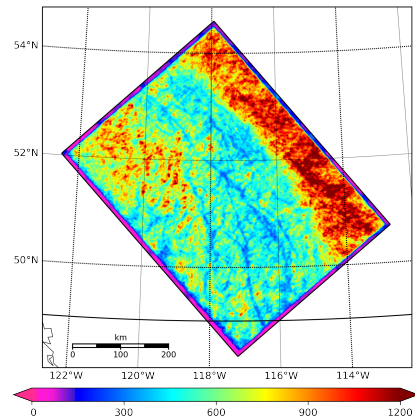
Note different scales — inner domain is 6x higher!

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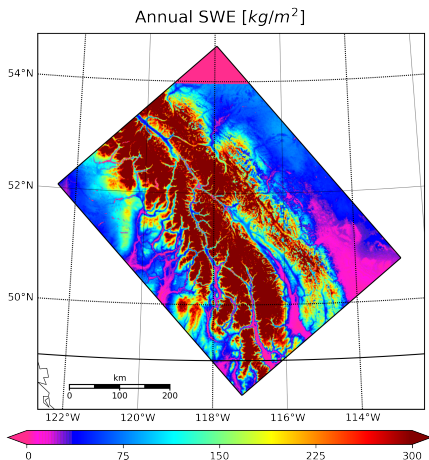
Temperature Bias / Lapse-rate

## Summer Precipitation (and Resolution)

## Snow Accumulation at Elevation

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# SnoDAS — Snow Data Assimilation System



Annual average snow (SWE) over the Columbia Mountains

## Annual average distribution of Snow Water Equivalent

### SnoDAS

Snow Data Assimilation System at 1 km and daily; assimilates SNOTEL observations

- ▶ Clear increase with elevation
- ▶ Lower SWE in Prairies
- ▶ In western Canada since 2010, only up to 54°N

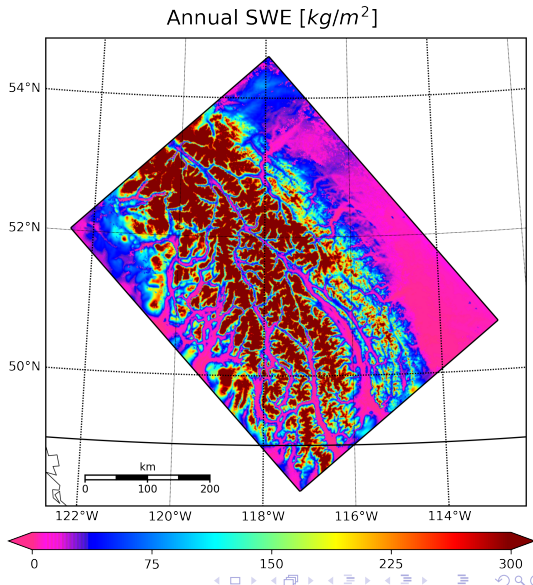
# Snow/SWE Representation in 1 km WRF Simulations

## Inner Domain Average SWE

- ▶ More structure in 1 km WRF
- ▶ Biases correlate with elevation
- ▶ Biases in outer domain smoother

### Assimilation

Assimilation may be smoothing snow field in SnoDAS, reducing vertical gradients



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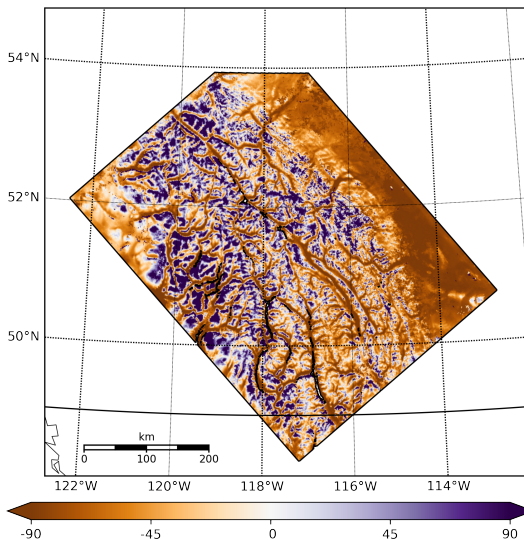
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Annual SWE Fractions [%] w.r.t. SnoDAS





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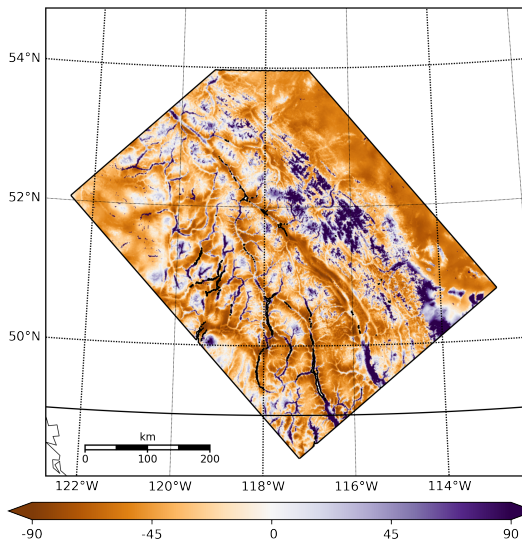
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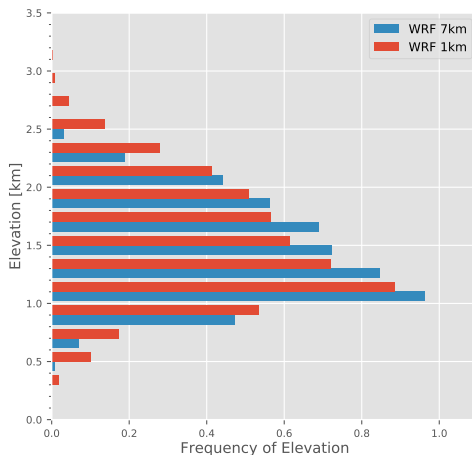
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# Snow Accumulation (SWE) vs. Elevation

Histogram of Elevation



Distribution of grid points by elevation for inner and outer WRF domain

## Elevation Distribution at 1 km & 7 km

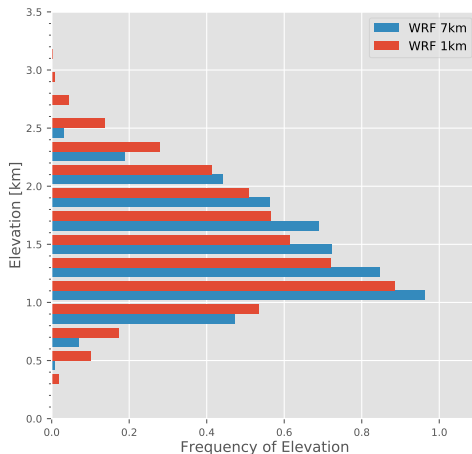
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? How does this affect snow accumulation and snow melt?

*All datasets were interpolated to inner WRF domain grid and then aggregated by elevation.*

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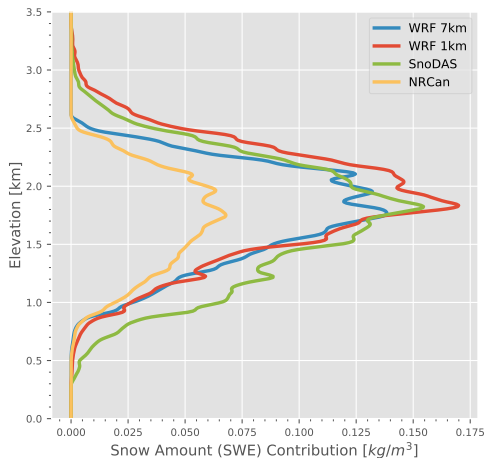
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Snow Distribution (SWE) by Elevation (Annual)



Annual average SWE distribution by elevation for WRF, SnoDAS & NRCAN

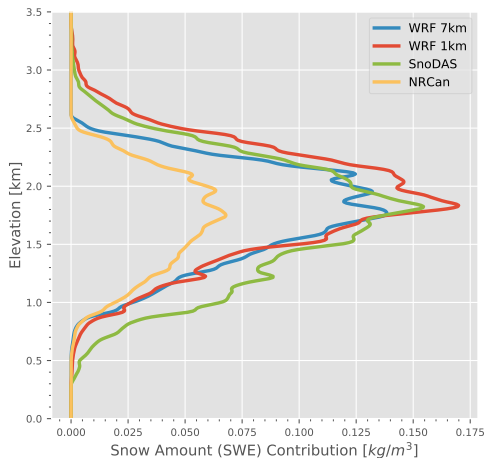
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- ▶ Outer domain and NRCAN dataset have no snow above 2,600 m
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- ▶ WRF at 1 km is quite close to SnoDAS, ...
- ▶ ... but places more snow at high elevation

⇒ Temperature Bias?

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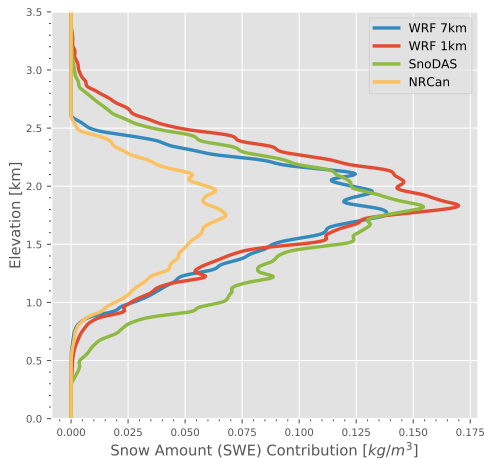
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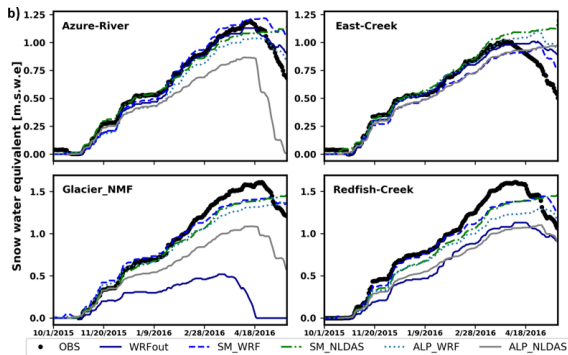
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1. Downscaling WRF (1 km) and NLDAS to 30 m over four BC glaciers
2. Simulating accumulation and melt using two snow models (2010-2016)
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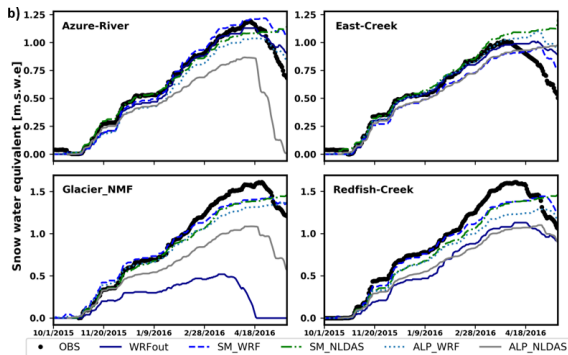
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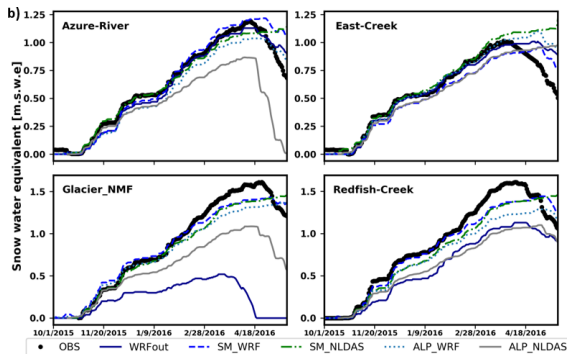
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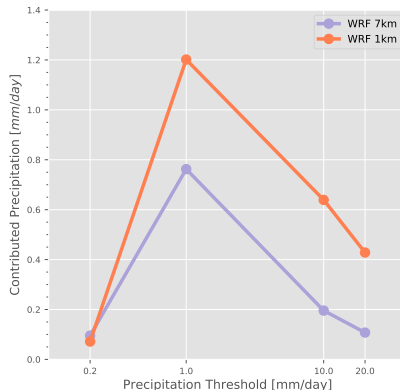
# Summary of Results

- ▶ 5-year, 1 km WRF simulations over Western Canada / Rockies
- ▶ Precipitation at first rain barrier is consistently underestimated
- ▶ Temperature / Lapse-rate bias

## The Added Value of High Resolution

- ▶ Summer-time (orographic) convection is **much** better captured (not perfect, though)
- ▶ Snow accumulation at elevation is quite well captured (similar but a bit higher than SnoDAS)

Precipitation Intensity (Summer)



## Summer Precipitation Intensity

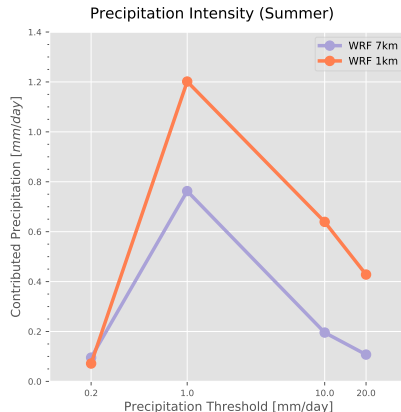
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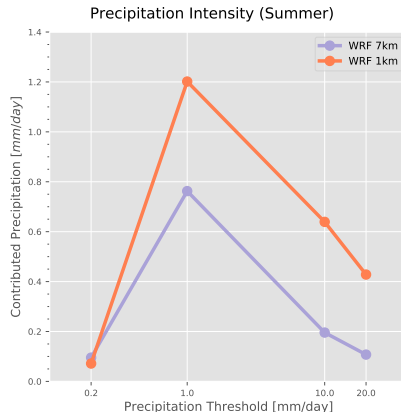
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- ▶ Precipitation at first rain barrier is consistently underestimated
- ▶ Temperature / Lapse-rate bias

## The Added Value of High Resolution

- ▶ Summer-time (orographic) convection is **much** better captured (not perfect, though)
- ▶ Snow accumulation at elevation is quite well captured (similar but a bit higher than SnoDAS)



## Summer Precipitation Intensity

- ▶ High-res WRF can be used to drive snow /- mass-balance model

# Thank You!

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# Questions?

## Acknowledgements:

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Ben Pelto

W. Richard Peltier

Aquanty Inc. Team



# List of Relevant Publications

- ▶ **Erler, Andre R.** and W. Richard Peltier, 2017, "Projected Hydro-climatic Changes in Two Major River Basins at the Canadian West Coast Based on High-resolution Regional Climate Simulations", *Journal of Climate*.
- ▶ **Erler, Andre R.** and W. Richard Peltier, 2016, "Projected Changes in Precipitation Extremes for Western Canada based on High-resolution Regional Climate Simulations", *Journal of Climate*.
- ▶ **Erler, Andre R.**, W. Richard Peltier and Marc d'Orgeville, 2015, "Dynamically Downscaled High Resolution Hydro-Climate Projections for Western Canada", *Journal of Climate*.
- ▶ Peltier, W. Richard, Marc d'Orgeville, **Andre R. Erler** and Fengyi Xie, 2018, "Uncertainty in Future Summer Precipitation in the Laurentian Great Lakes Basin: Dynamical Downscaling and the Influence of Continental Scale Processes on Regional Climate Change", *Journal of Climate*.
- ▶ Marc d'Orgeville, W. Richard Peltier and **Andre R. Erler**, Jonathan Gula, 2014, "Climate change impacts on Great Lakes Basin precipitation extremes", *Journal of Geophysical Research*.