

# On the challenges and prospects of estimating past and future rainfall extremes

**Francis Zwiers**  
**Pacific Climate Impacts Consortium**  
**University of Victoria, Victoria, BC, Canada**

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**Our Future Climate – Understanding the spread of physical risk for the oil and gas industry**  
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# Outline

- Recent status of science on precipitation extremes
  - Historical change
  - Projections based on global models
- The challenge of accounting for non-stationarity in local and regional engineering design
  - Binning scaling
  - Temperature scaling
- Review/discussion
  
- Additional topics – time permitting
  - Storms
  - Hydrological Cycle
  - Riverine Flooding

# Historical Change

An aerial photograph of a mountain valley. In the background, a large mountain range with snow-capped peaks is visible under a cloudy sky. The middle ground shows a dense forest of evergreen trees covering the valley floor and lower slopes. A winding river flows through the forest, with several sandy bars and meanders. In the distance, a small structure, possibly a water tower, is visible on a hillside. The overall scene depicts a natural landscape with significant historical and environmental changes.

# Precipitation extremes

- Observational studies suggest intensification is occurring
- Expectation of intensification is supported by attribution of
  - atmospheric warming
  - corresponding atmospheric water vapour content increase
  - large scale changes in mean precipitation
  - ocean surface salinity changes
- There are only a few “detection and attribution” studies of long-term changes in extreme precipitation
  - detect human influence at the “global” scale
- Considerable challenges remain in understanding regional precipitation change (e.g., Sarojini et al., [2016](#))
- Local detection of change is very hard

# Detection and attribution results

We can also detect the human influence on precipitation extremes over land:

- Climate models with anthropogenic external forcing intensify extreme precipitation similarly to observed
- Climate models with only natural external forcing do not intensify precipitation

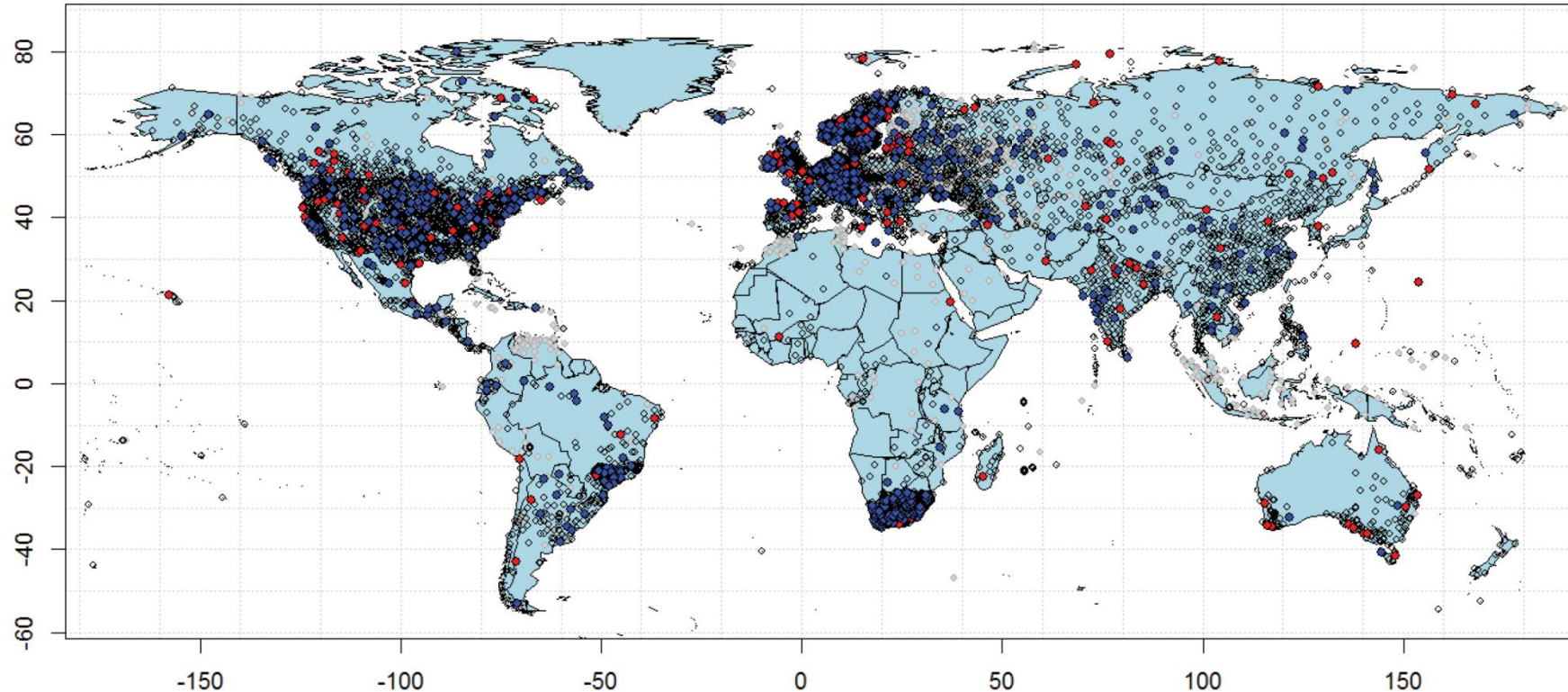
Attributed intensification in annual maximum 1-day precipitation:

- 5.2% increase per degree of warming
- uncertainty range [1.3 – 9.3]%

Estimated waiting time for 1950's 20-year event:

~15-yr in the early 2000's

# Local detection of change is very hard



- 8376 stations with  $> 30$  yrs data, median length 53 yrs
- Significant positive (10.0% of stations, expect 2.5%)
- Significant negative (2.2% of stations, expect 2.5%)
- Estimate of mean sensitivity over land is  $\sim 7\%/K$

# Projections

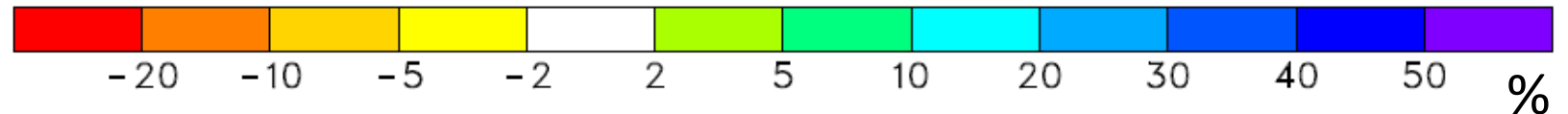
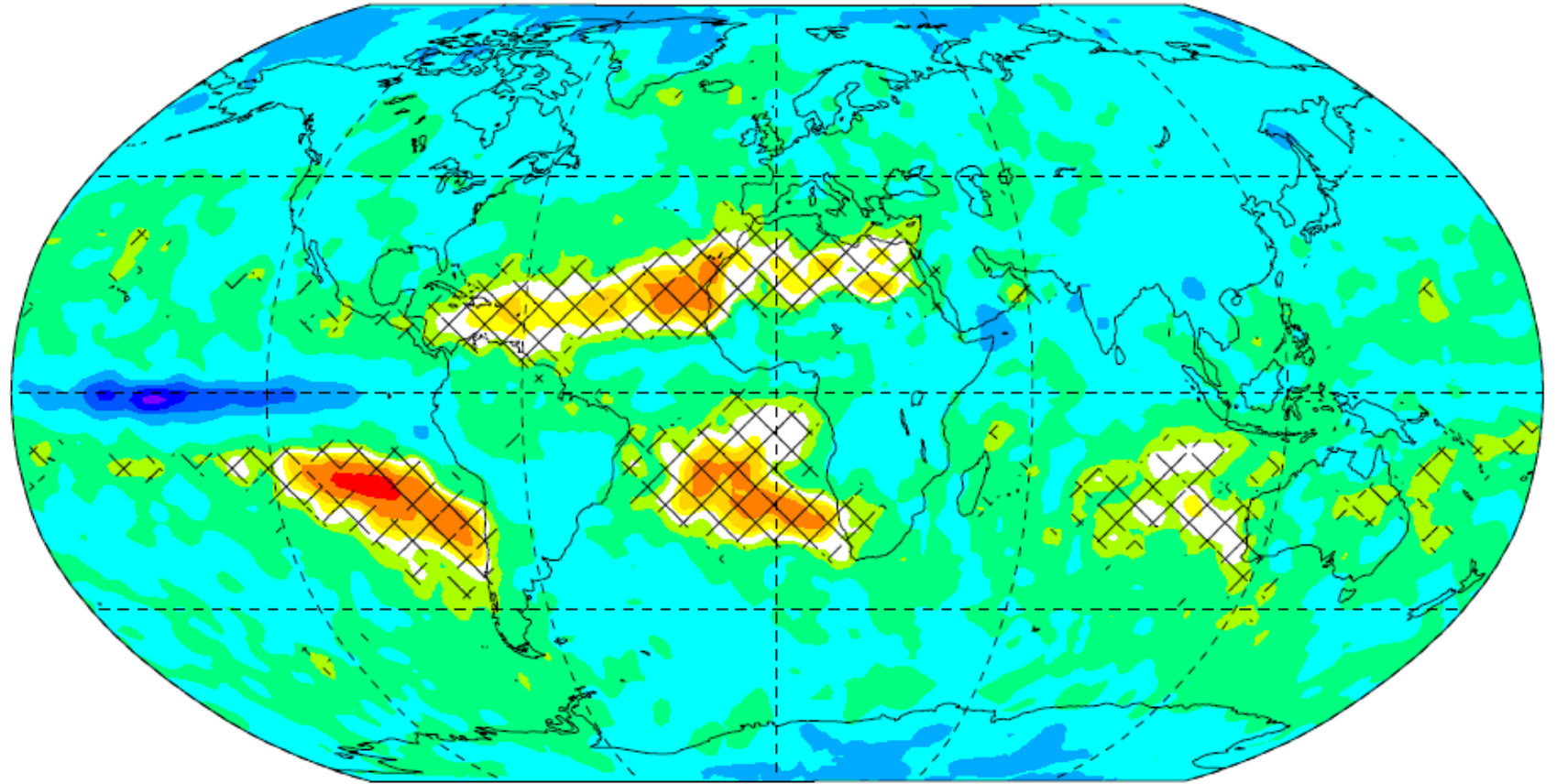


# Projection of change in 20-year 1-day event

$$\Delta P_{20}, \%, 2081-2100, +10.9\%$$

CMIP5 RCP4.5

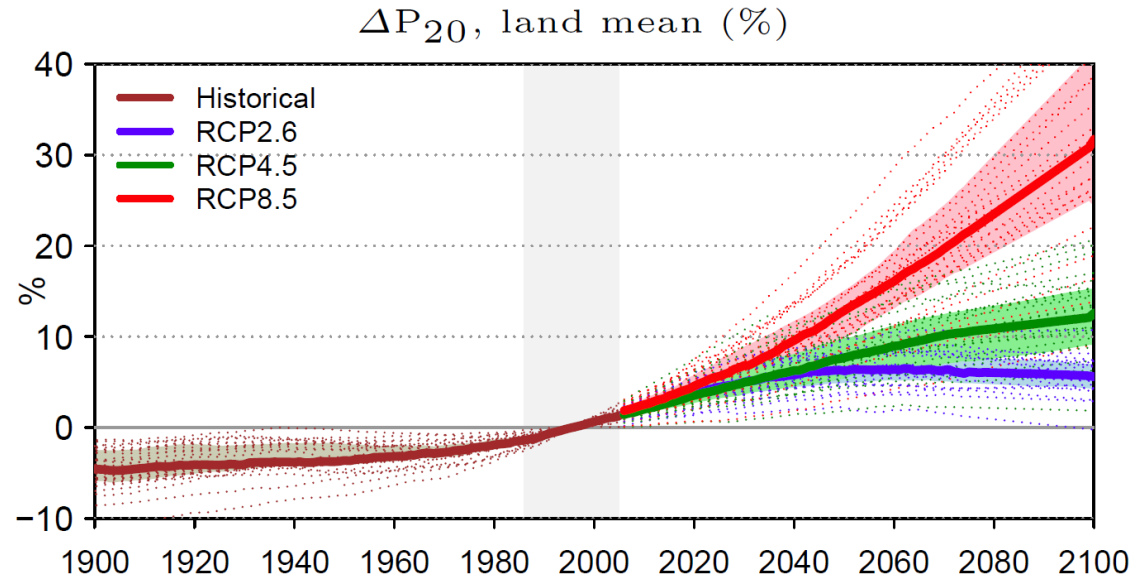
Change in 20-yr  
extremes relative  
to 1986-2005



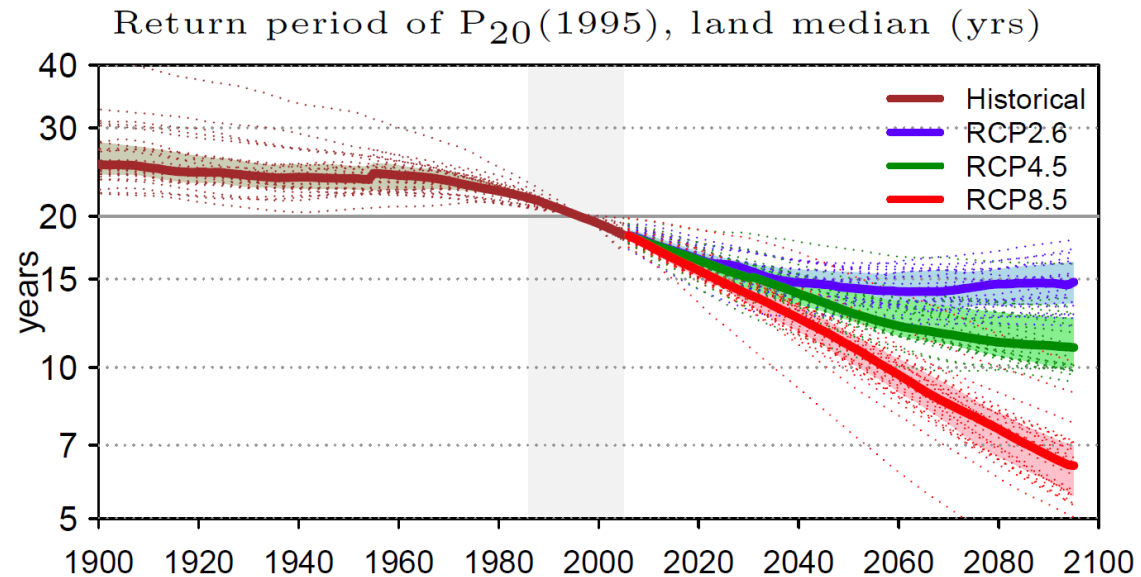


# CMIP5 Projections of 20-yr 1-day events

Event magnitude  
(relative to 1986-2006)



Return period  
(relative to 1986-2006)



# Constraining local/regional precipitation change – a challenge



# If you don't trust models, can you use the observations?

- Two options considered in the literature include:
  - a) Binning scaling, i.e., tabulating high percentiles of precipitation conditional on temperature
  - b) Local/regional non-stationary statistical models, pooling information from similar location (e.g. using regional frequency analysis)

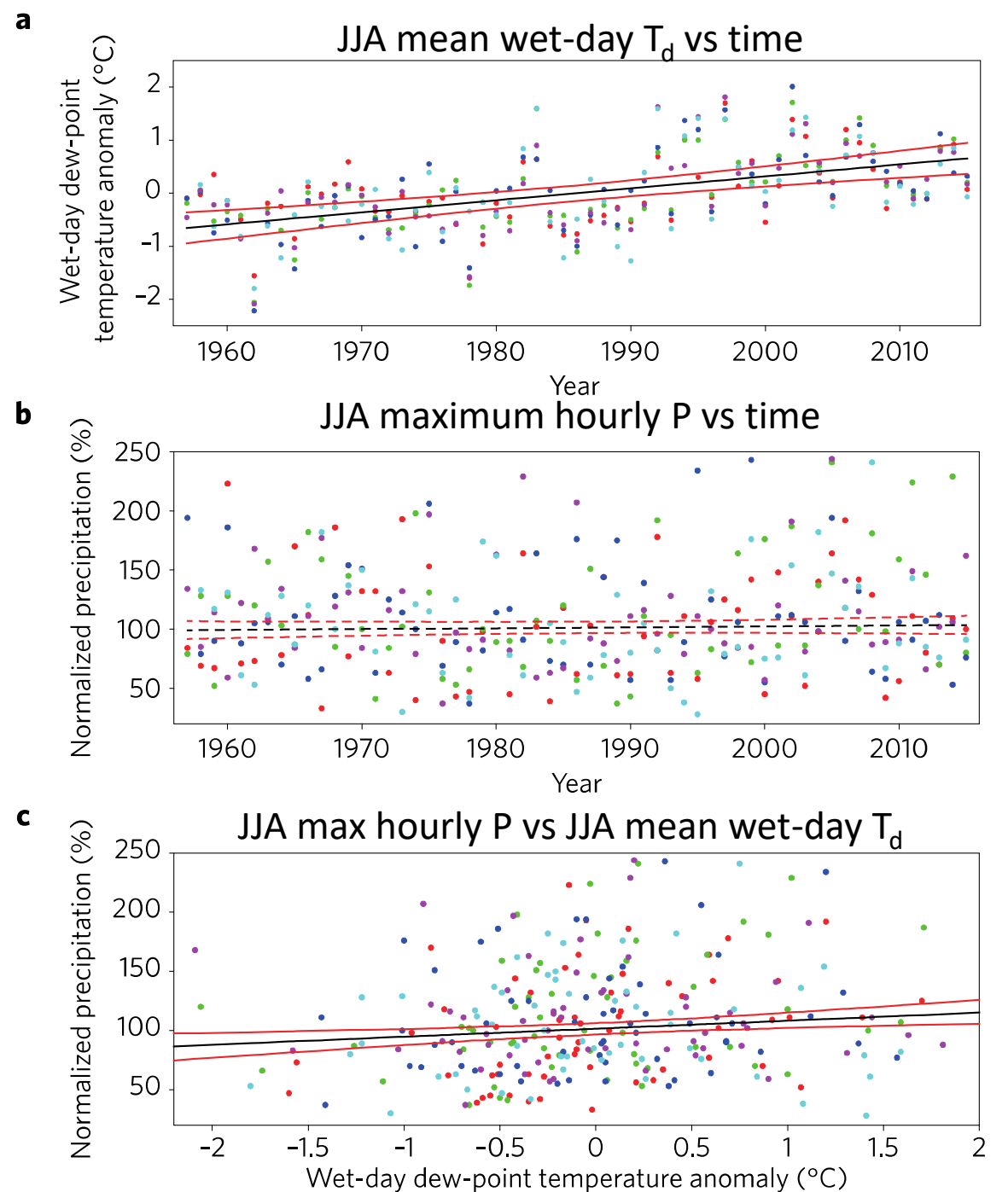


# Binning scaling

Zhang et al., Nature Geo, 2017

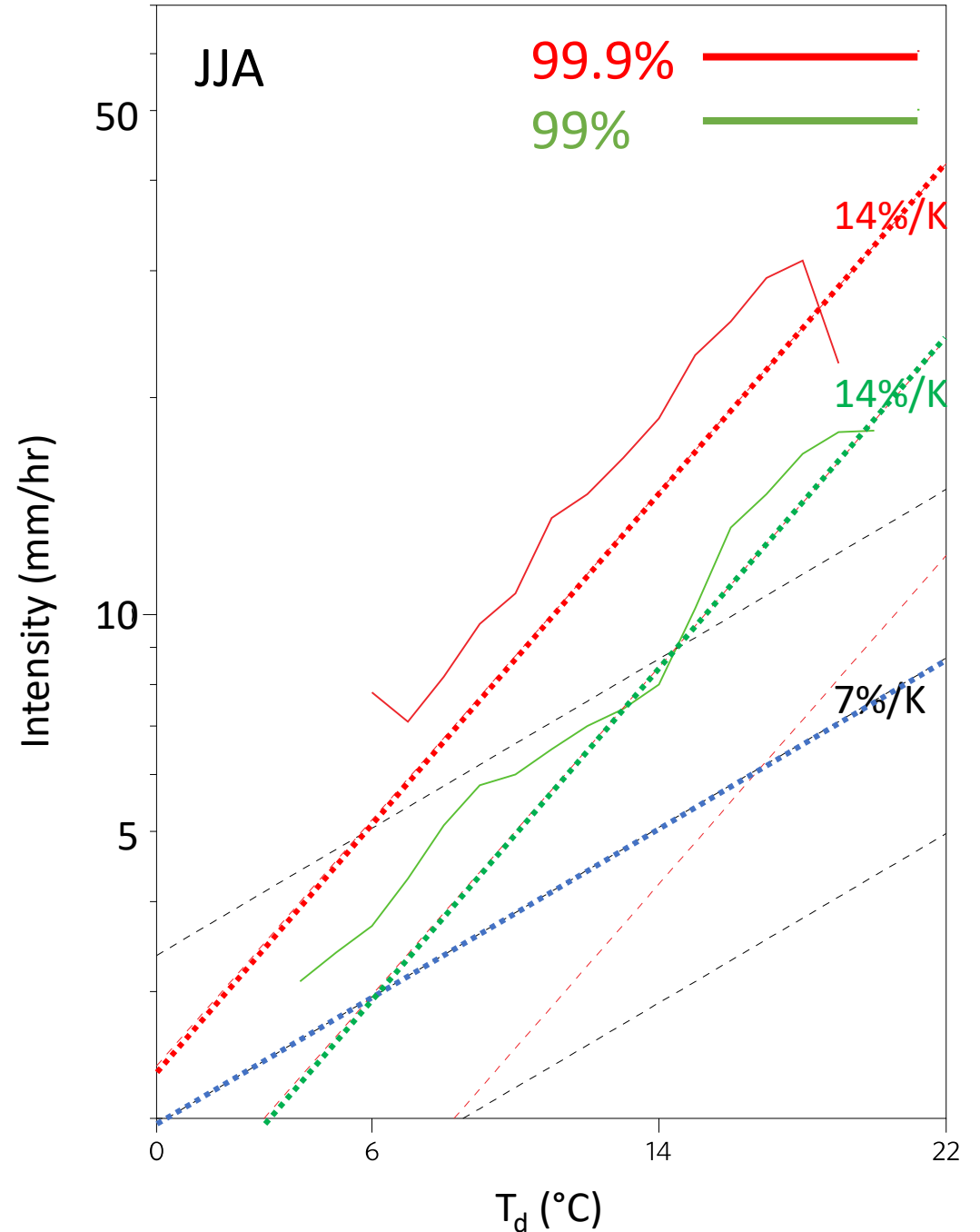
Dewpoint temperature ( $T_d$ ) and hourly rainfall ( $P$ ) at 5 stations in the Netherlands (1957-2015; colours indicate stations)

- a) Significant warming
- b) No discernable trend in extreme hourly  $P$
- c) Significant (but noisy) relationship between  $T_d$  and summer max hourly  $P$  (we estimate  $\sim 6.8\%$  intensity increase for a  $1^\circ\text{C}$  increase in  $T_d$ )



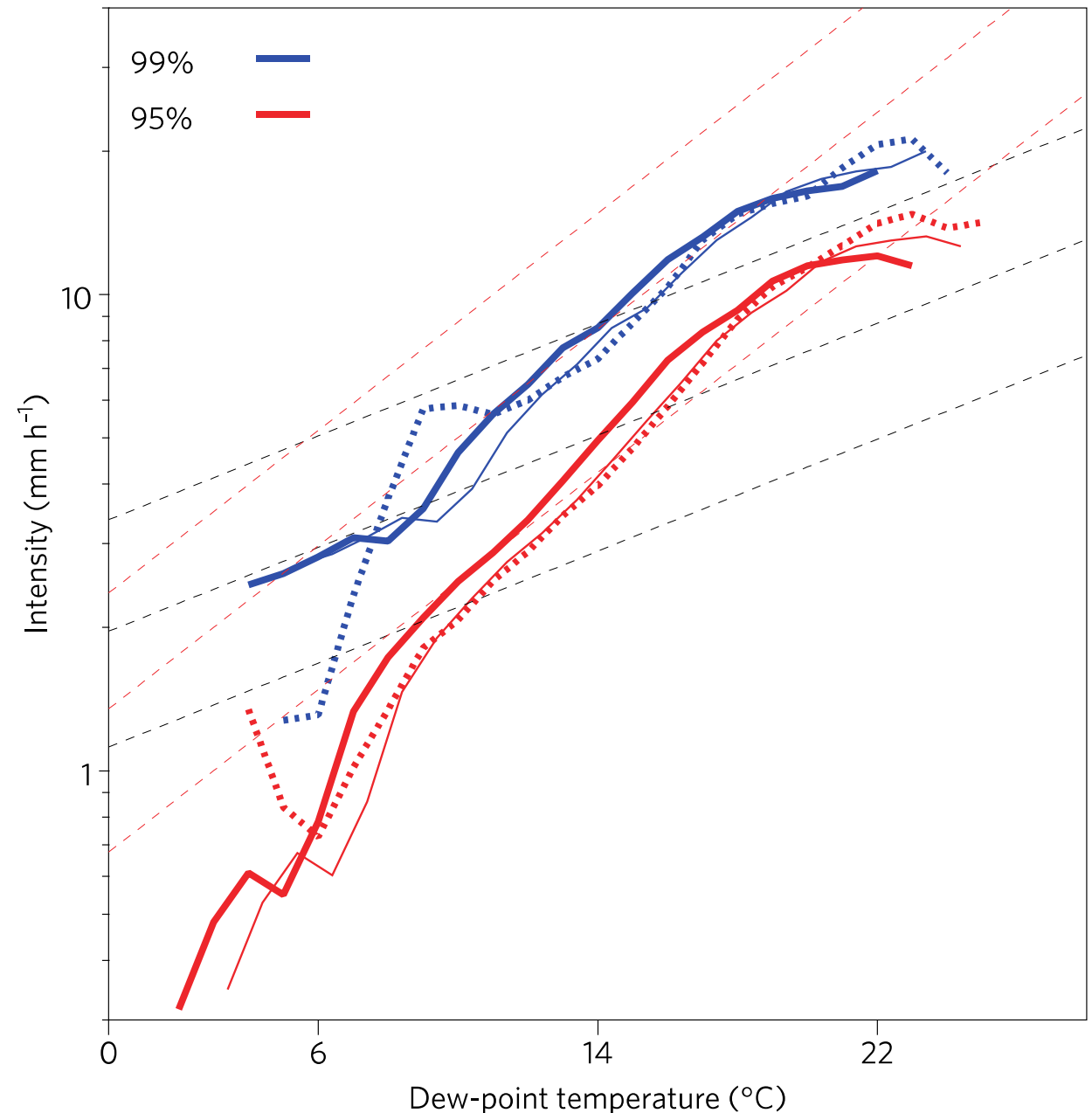
# Conditional hourly rainfall percentiles (conditional on wet-day $T_d$ ) at 5 NLD stations for 1957-2015

- Strong super Clausius-Clapeyron (CC) scaling is evident
- And warming is evident
- Why don't we see significant long-term change in extreme hourly precipitation?
- Can we use binning scaling to project future change in extreme hourly P?



# Conditional hourly precipitation percentile in Rossby Centre RCM (ENSEMBLES)

- Thick curves – historical climate
- Dotted curves – future climate
- Thin curves – historical, scaled by CC rate
- Models shift the binning scaling curve upwards and to the right (at the CC rate)
- Annual or seasonal max precipitation increases at the CC rate where thermodynamics dominate
- Long return period extremes increase at the CC rate, not the super-CC rate



# Temperature scaling using RFA

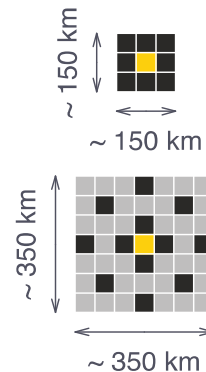
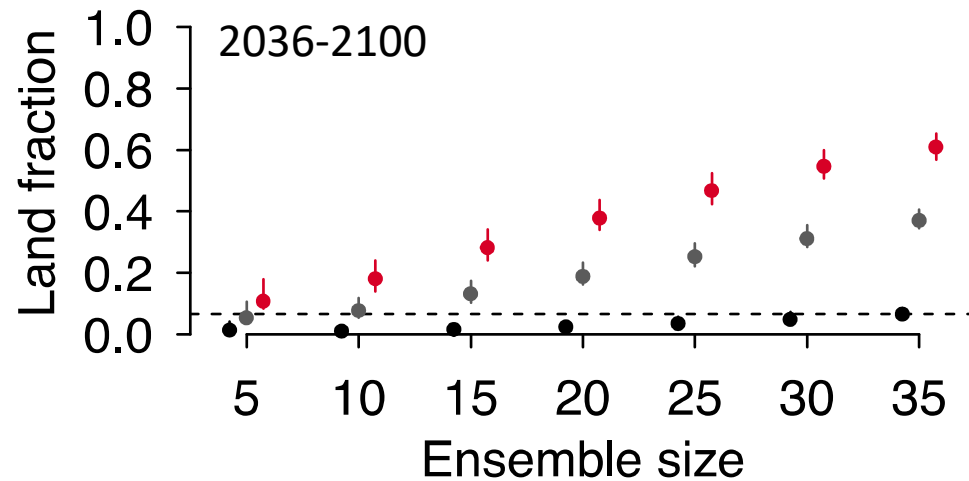
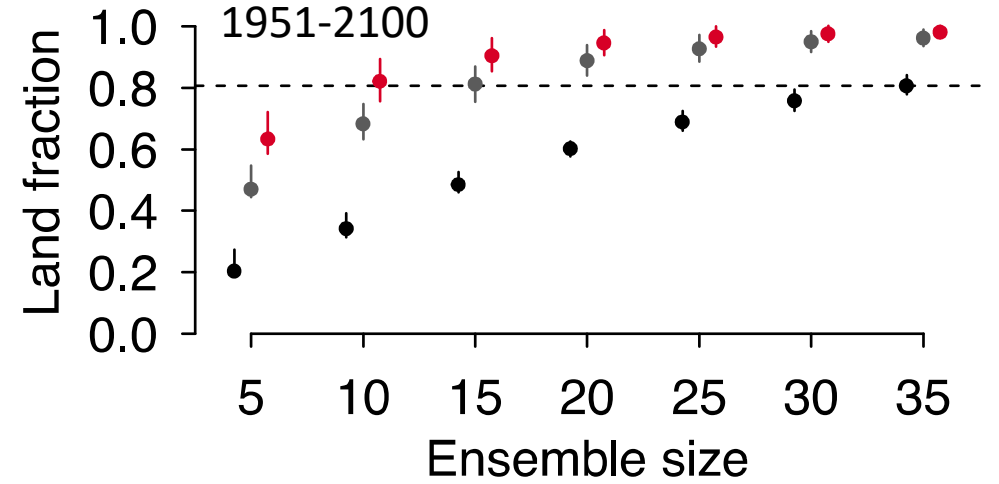
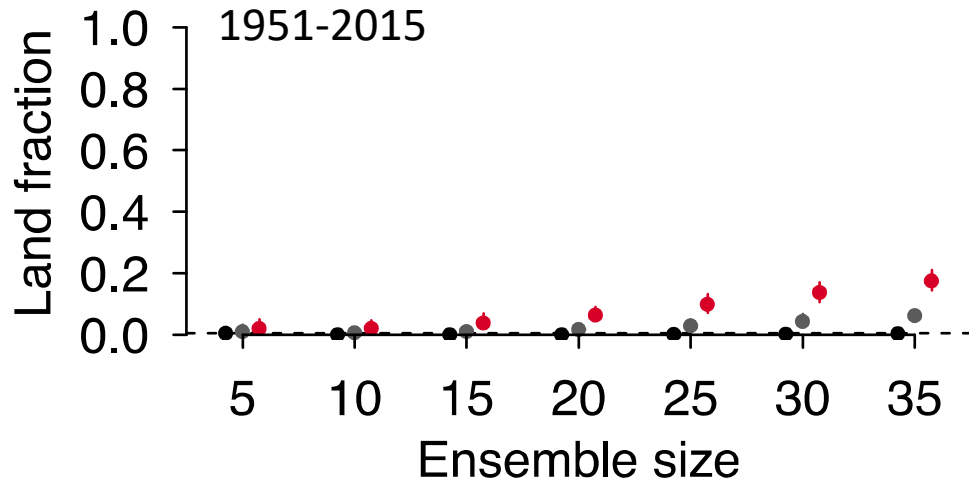
Chao Li, et al., in review



# Questions and approach

- Are individual, 65-year rainfall records sufficient to reliably estimate how extreme rainfall is changing with warming?
- If not, can some variant of regional frequency analysis come to the rescue?
- How much data is really needed to confidently identify the impact of warming?
- Framework for answering these questions
  - A large ensemble of 35 regional climate simulations for North America
  - Based on CanESM2/CanRCM4, 1951-2100, 50 km spatial resolution
  - Historical period (1951-2015) provides  $35 \times 65 = 2275$  annual maxima
  - Entire period provides  $35 \times 150 = 5250$  annual maxima
- Fit non-stationary statistical extreme value models at individual grid boxes and in  $350 \times 350$  km regions (using the “index flood” approach)

# Proportion of grid boxes where the magnitude of the 100-year 1-hour event is well estimated by temperature



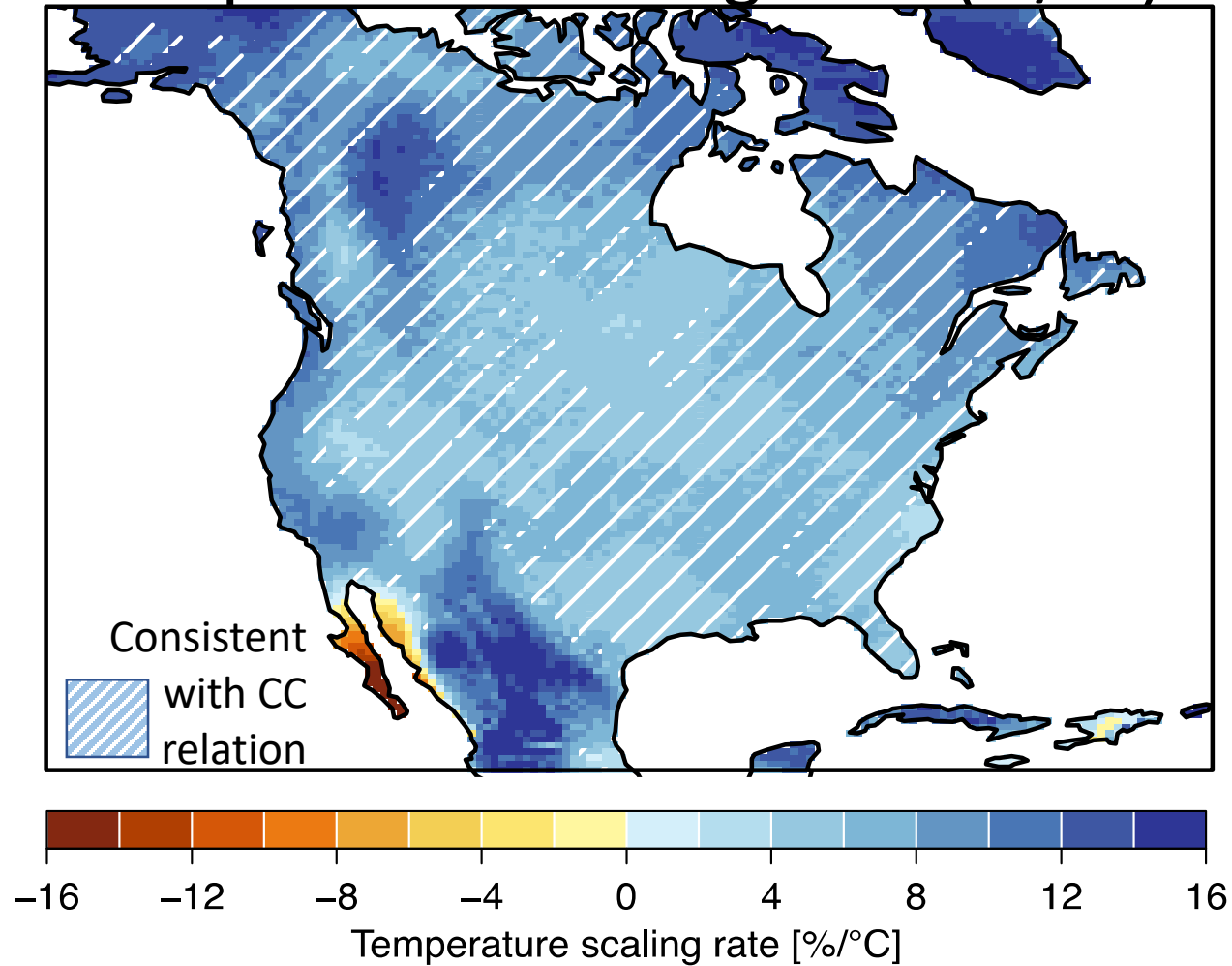
Local (at site) analysis

RFA with 150x150 km regions

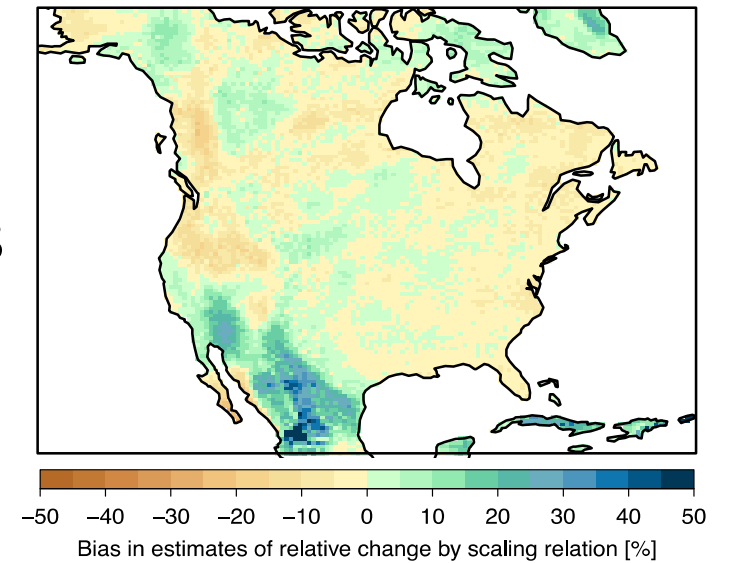
**RFA with 350x350 km regions**

# Results for 100-year annual maximum hourly rainfall

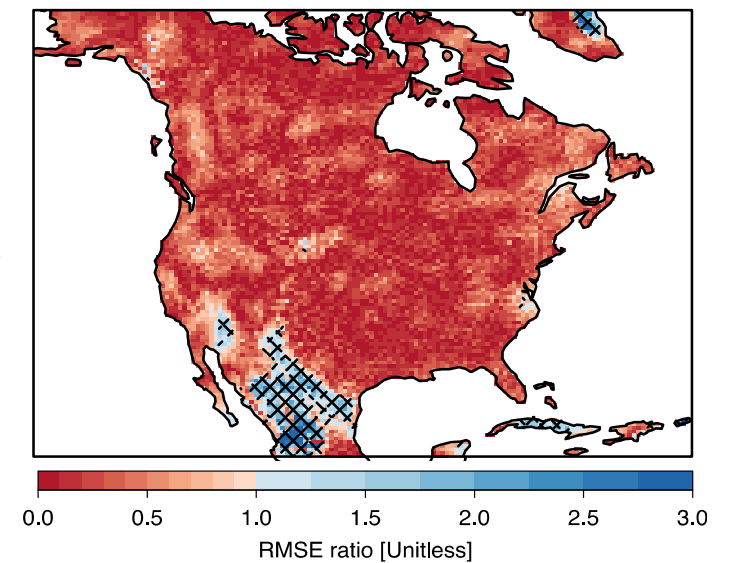
## Temperature Scaling Rate (%/°C)



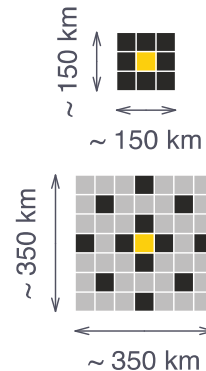
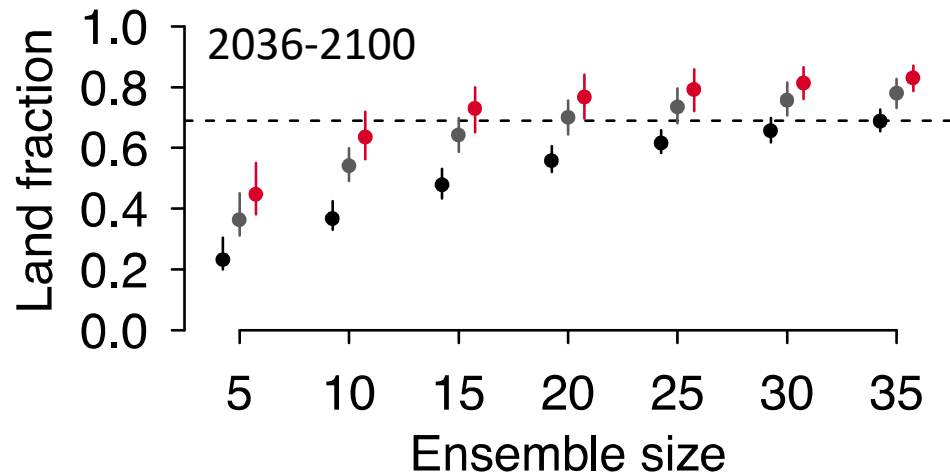
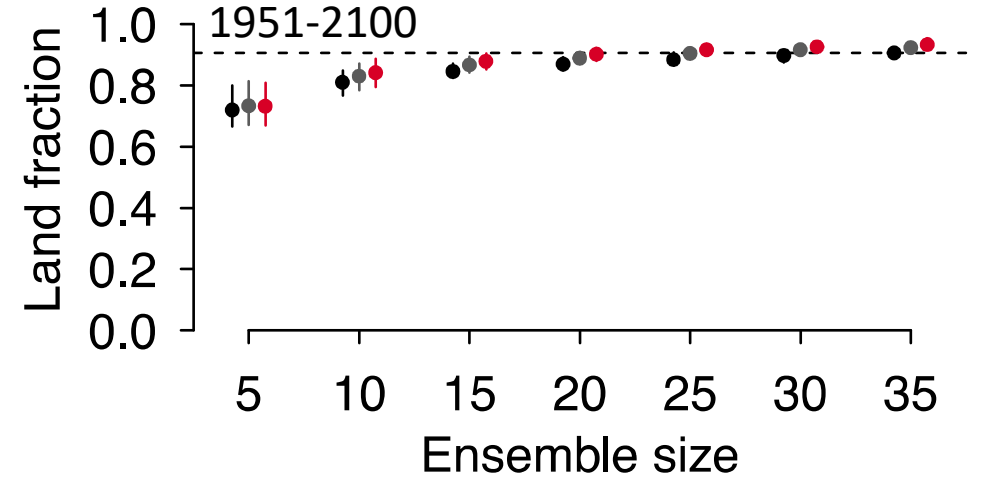
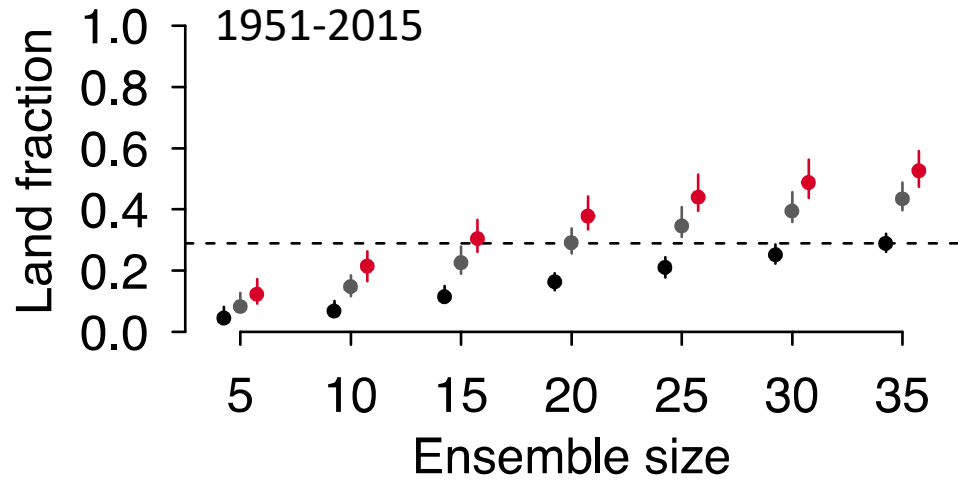
## Bias



## RMSE



# Proportion of grid boxes where the magnitude of the 2-year 1-hour event is well estimated by temperature



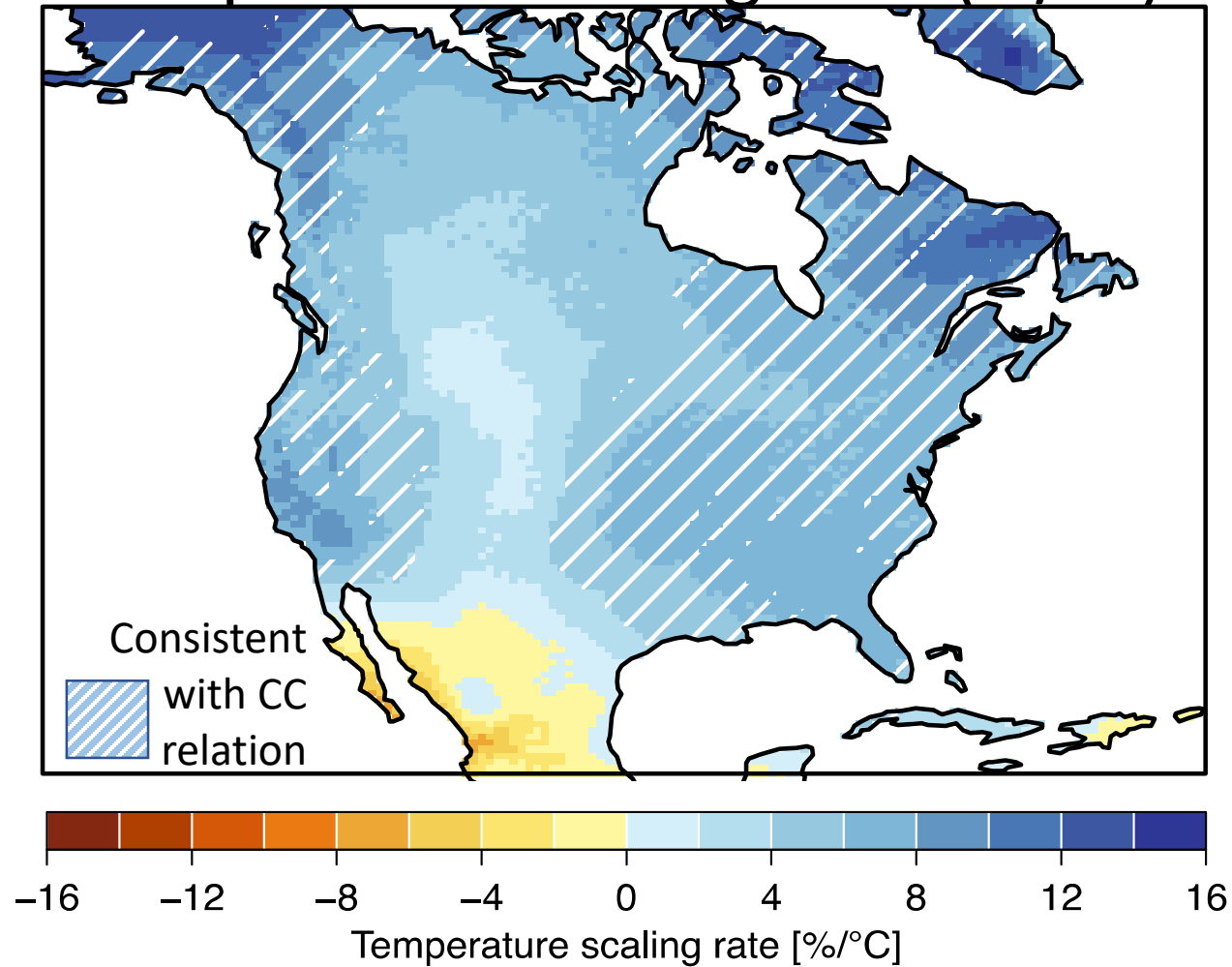
Local (at site) analysis

RFA with 150x150 km regions

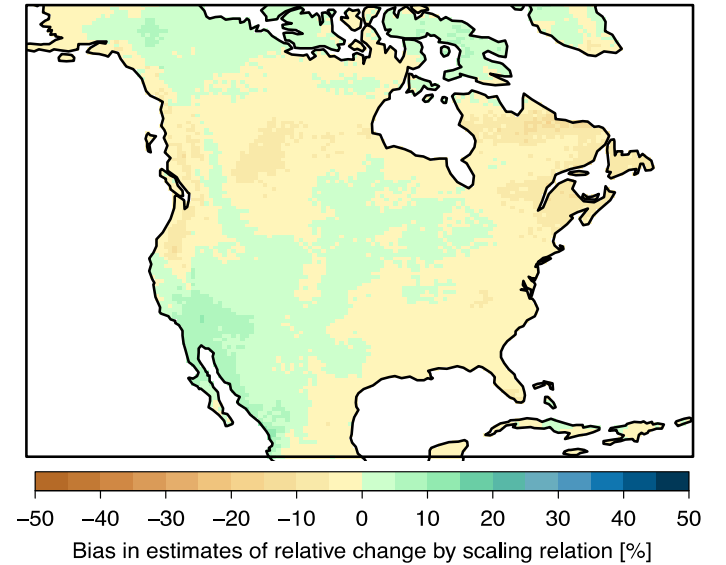
RFA with 350x350 km regions

# Results for 2-year annual maximum hourly rainfall

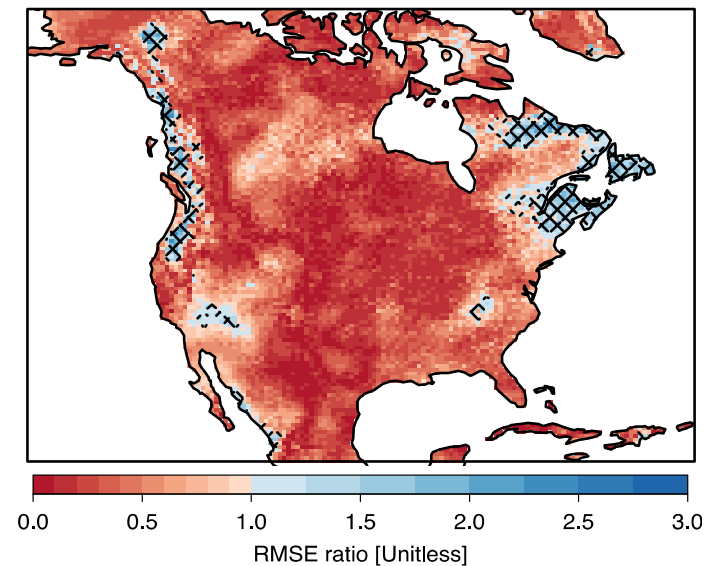
## Temperature Scaling Rate (%/°C)



## Bias



## RMSE



# What do we learn from this?

- At site analysis based on single records not sufficient
- RFA helps a bit, but still doesn't provide enough information to describe non-stationarity well
- Temperature scaling is effective over most of North America (there are some areas where thermodynamics alone don't describe simulated changes in extreme precipitation well)
- But ... need much more than a single 65-year record to reliably identify such relationships

# Review/Discussion



# Review/Discussion

- Evidence suggests that we are intensifying precipitation extremes and altering flood regimes
- Definitive statements about storm activity and other aspects of the hydrological cycle remain difficult
- The engineering community increasingly recognizes the need to account for a changing climate, which alters environmental “loads” to which infrastructure is exposed
  - Wind/temperature/snow/rainfall/ice loading, etc
- Stationarity is dead, but nevertheless, it is challenging to reliably and defensibly account for non-stationarity in local and regional engineering design





# Questions?

<https://www.pacificclimate.org/>

*Photo: F. Zwiers*



Additional topics

# Storms



# Storms

- Some evidence of attributable change in surface pressure distribution (indicative of long-term circulation change)
- Few, if any, D&A studies of long-term change in position of extratropical storm tracks, storm frequency or intensity
- Models (eg, broad range of frequency biases in the occurrence of explosive extra-tropical cyclones in CMIP5 class models – Seiler and Zwiers, [2015a](#), [2015b](#))
  - Dynamical downscaling with a regional climate model helps reduce this bias somewhat (Seiler et al, [2017](#))
- Projections do not show large increases in storm frequency, but suggest that the intensity of the strongest storms may increase
- Some evidence that extra-tropical storm tracks will shift somewhat poleward (e.g., Seiler and Zwiers, [2015b](#))

# Terrestrial hydrological cycle



# Hydrologic extremes

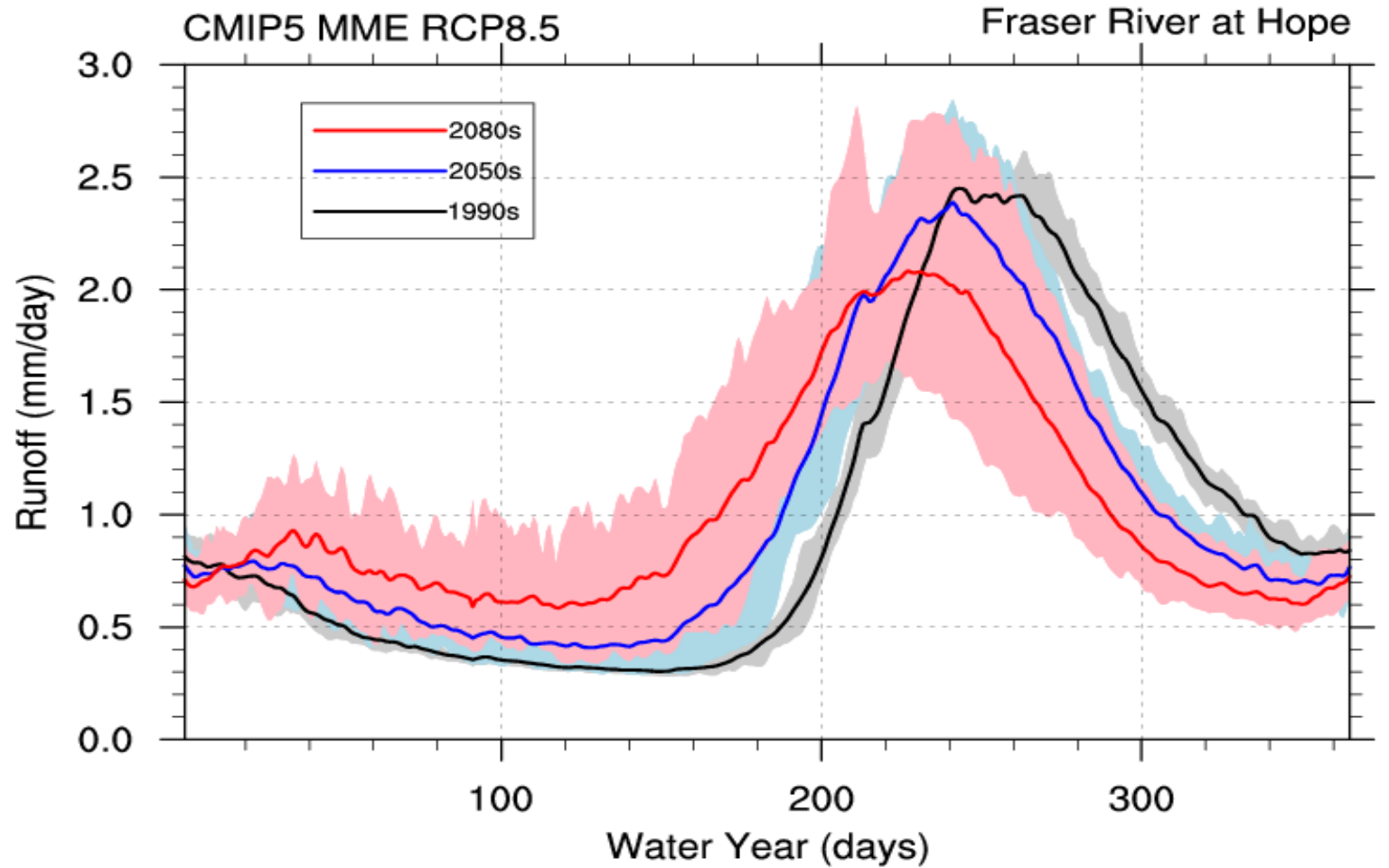
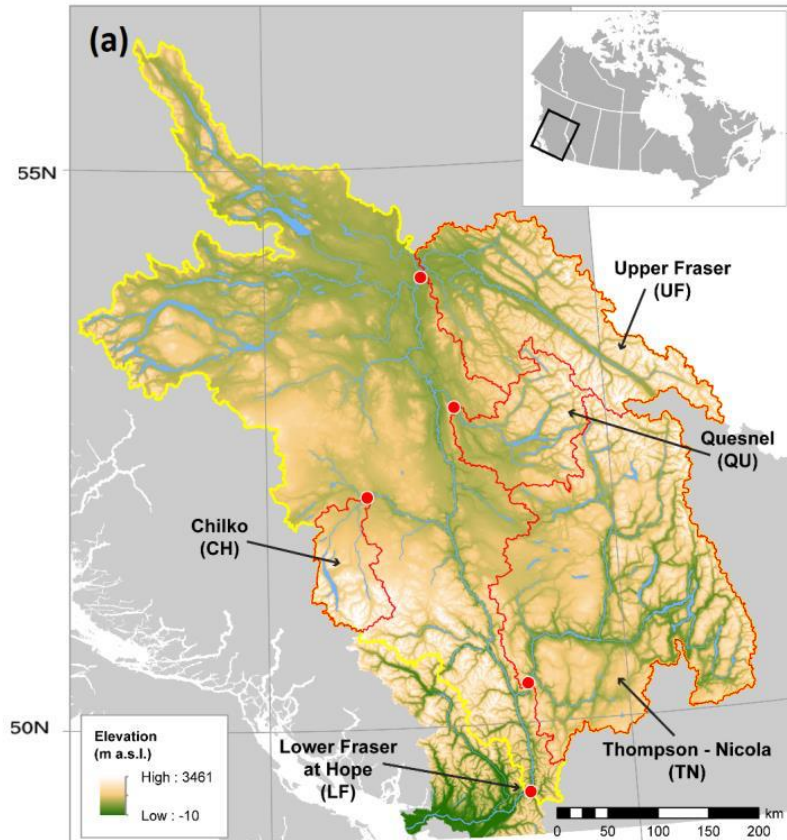
- Few studies linking change in mean hydrologic conditions to GHGs
  - Barnett et al, [2008](#), Fyfe et al., [2017](#) (Western US)
  - Najafi et al, [2016](#), [2017](#) (part of British Columbia)
  - Detect the effect of warming on snowpack and/or streamflow characteristics
  - Also detect the effect of warming on snow cover extent
  - Complex spatial variation in hydrologic sensitivity (Grieve et al, [2014](#); Kumar et al, [2015](#)) complicates robust detection of responses (Kumar et al, [2016](#))
- IPCC assessed low confidence in the understanding of historical changes in drought and only medium confidence in modelling evidence that suggests a likely intensification of drought
- There is greater confidence in projected changes in extreme precipitation, and therefore flash flooding in smaller basins

# Riverine Flooding



Figure 2.8: Alexandra Bridge during Flood of 1894

# Projected Fraser River streamflow under RCP 8.5



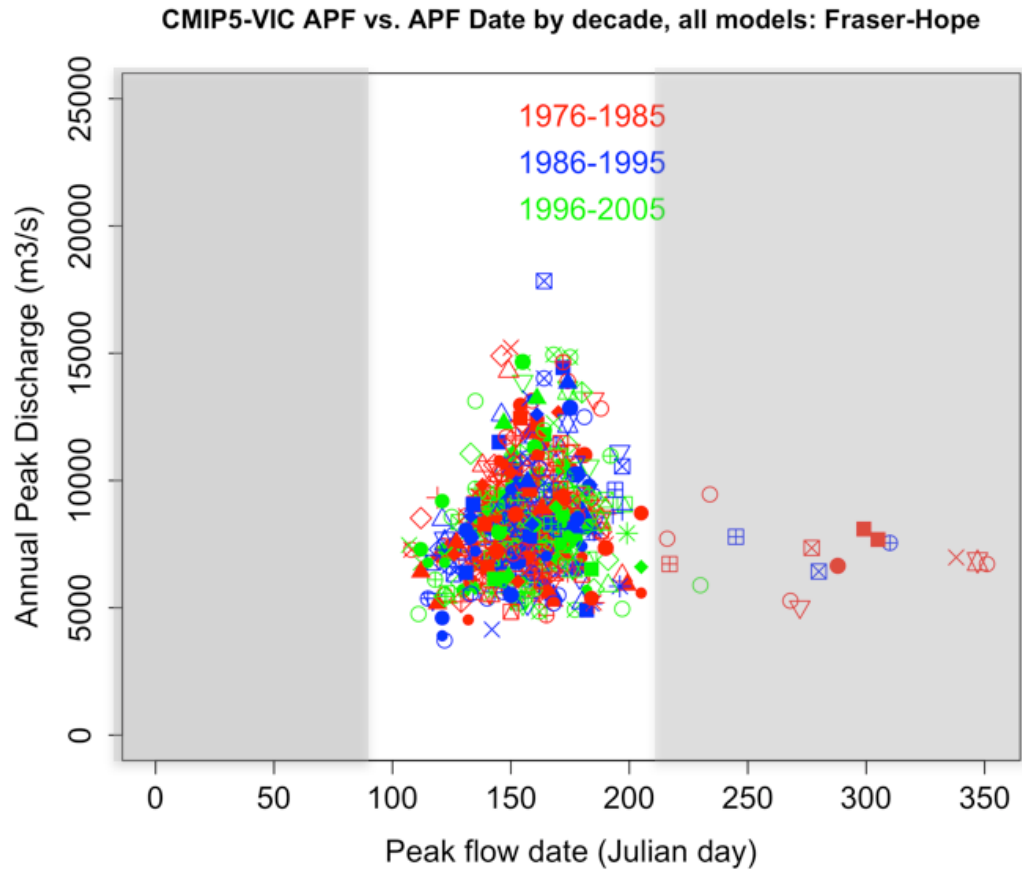
Courtesy Siraj Ul Islam



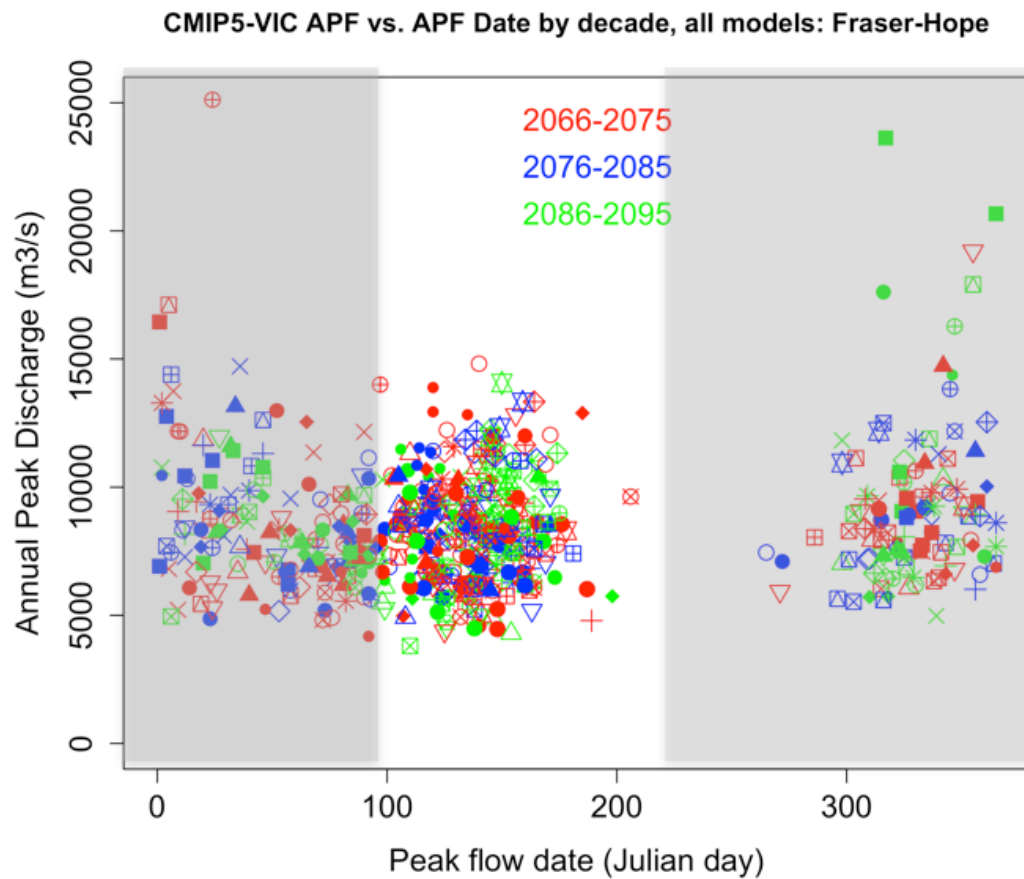
# Annual peak flow timing and magnitude

Late 20<sup>th</sup> century

Late 21<sup>st</sup> century



Days 1-90 & 215-365: 16 occurrences over 10 different runs (2.5% of total = 630)



Days 1-90 & 215-365: 167 occurrences over all 21 runs (27% of total = 630)