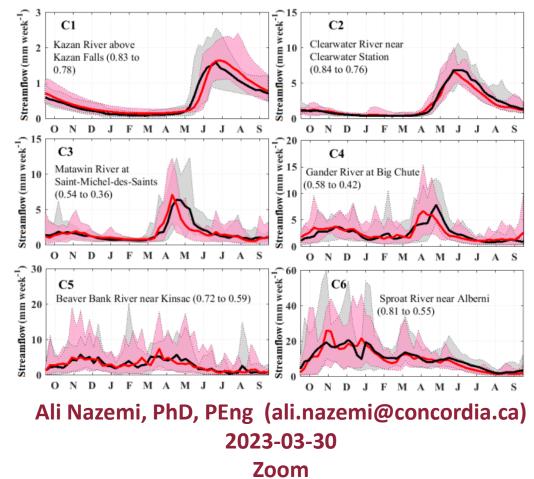


# Changing Canadian Natural Streamflow Regime

## (1966-2010)





# First things first

- The driving force behind this work has been a former PhD student
- A chapter in Masoud's thesis, which is also published in HESS as:

Zaerpour, M., Hatami, S., Sadri, J., & Nazemi, A. (2021). A global algorithm for identifying changing streamflow regimes: application to Canadian natural streams (1966–2010). *Hydrology and Earth System Sciences*, 25(9), 5193-5217.



<u>Masoud Zaerpour</u> <u>University of Calgary Contacts</u> <u>(ucalgary.ca)</u>



### Motivation and context

#### • Streamflow regime is changing during the "Anthropocene"

#### **Stressors**

- Climate change
- Human intervention in land and streams

#### **Climate change impacts in cold regions**

- Changes in the form of precipitation
- Changes in the amount of precipitation
- Changes in the hydrological processes

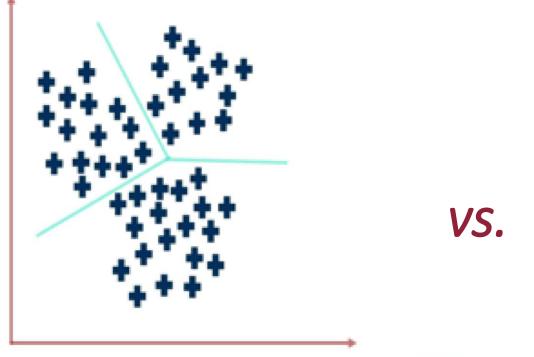
"A river is the report card for its watershed" Alan Levere

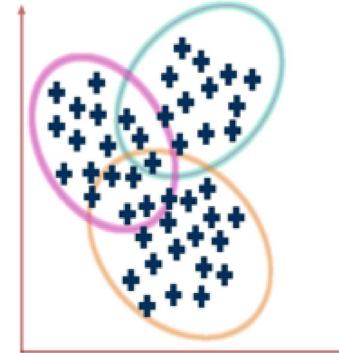




# **Problem definition**

- Streamflow regime is constituted by multiple streamflow characteristics → multiple dimensions
- Shift in natural streamflow regimes over landscape in rather gradual than sharp → Level of association.
- Climate change induced alterations in streamflow regime are caused by multiple physical processes that may not be easily distinguished from one another → multiple attributes
- Climate change induced transition from one streamflow regime to another is rather gradual than sharp → existence of trend





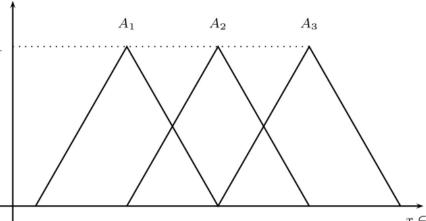
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## Breakthrough

# • Regime is identified by the changes in long-term annual streamflow hydrograph and the variability

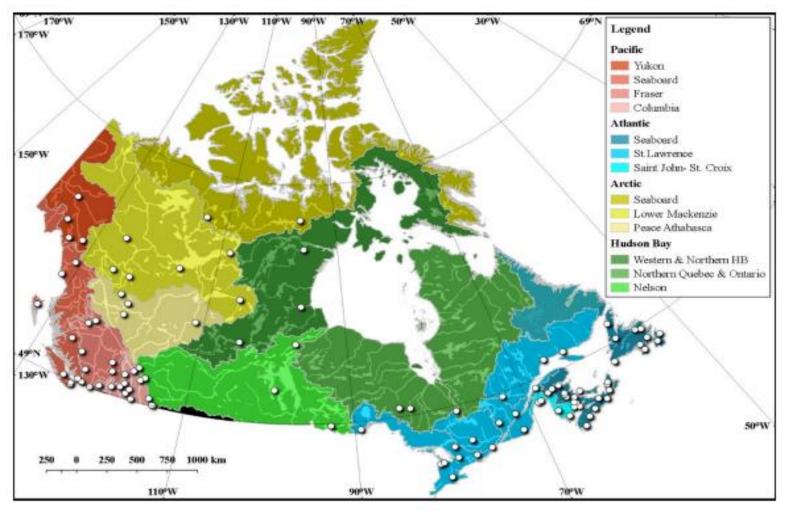
| Feature           | Notation                             | Feature               | Notation                             | Feature               | Notation                             | Feature                       | Notation                             | Feature                        | Notation                             |
|-------------------|--------------------------------------|-----------------------|--------------------------------------|-----------------------|--------------------------------------|-------------------------------|--------------------------------------|--------------------------------|--------------------------------------|
| October mean flow | Mean: $x_1$<br>Variance: $y_1$       | November<br>mean flow | Mean: $x_2$<br>Variance: $y_2$       | December<br>mean flow | Mean: $x_3$<br>Variance: $y_3$       | January mean flow             | Mean: $x_4$<br>Variance: $y_4$       | February mean flow             | Mean: $x_5$<br>Variance: $y_5$       |
| March mean flow   | Mean: $x_6$<br>Variance: $y_6$       | April mean<br>flow    | Mean: x7<br>Variance: y7             | May mean<br>flow      | Mean: $x_8$<br>Variance: $y_8$       | June mean<br>flow             | Mean: x9<br>Variance: y9             | July mean<br>flow              | Mean: $x_{10}$<br>Variance: $y_{10}$ |
| August mean flow  | Mean: $x_{11}$<br>Variance: $y_{11}$ | September mean flow   | Mean: $x_{12}$<br>Variance: $y_{12}$ | Annual<br>flow        | Mean: $x_{13}$<br>Variance: $y_{13}$ | Timing of the annual low flow | Mean: $x_{14}$<br>Variance: $y_{14}$ | Timing of the annual high flow | Mean: $x_{15}$<br>Variance: $y_{15}$ |

- Distinction between streamflow are fuzzy rather than sharp.
- Temporal transition in streamflow regime in a given stream can be identified by the trend in belongingness of streamflow regime to a set of known reference regime.





# Case study

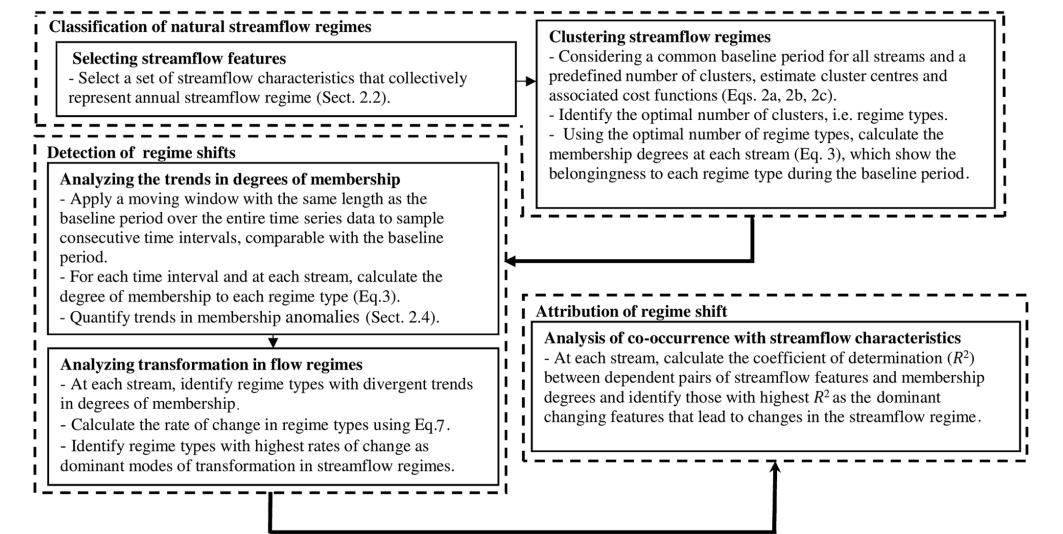


| Major Basin | Sub-basin                 | Area (1000 km <sup>2</sup> ) | # of stations | Abbreviation |  |
|-------------|---------------------------|------------------------------|---------------|--------------|--|
|             | Yukon                     | 330.4                        | 4             | P1           |  |
| Pacific     | Seaboard                  | 334.2                        | 8             | P2           |  |
| Pacific     | Fraser                    | 232.5                        | 8             | P3           |  |
|             | Columbia                  | 102.8                        | 10            | P4           |  |
|             | Seaboard                  | 499.7                        | 28            | At1          |  |
| Atlantic    | St. Lawrence              | 860.1                        | 16            | At2          |  |
|             | Saint John- St. Croix     | 41.9                         | 5             | At3          |  |
|             | Seaboard                  | 1,739.3                      | 2             | Arl          |  |
| Arctic      | Lower Mackenzie           | 1,321.1                      | 7             | Ar2          |  |
|             | Peace Athabasca           | 482.7                        | 3             | Ar3          |  |
|             | Western & Northern HB     | 1,243.9                      | 3             | H1           |  |
| Hudson Bay  | Northern Quebec & Ontario | 1,889.2                      | 3             | H2           |  |
| -           | Nelson                    | 1,138.5                      | 8             | H3           |  |



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# Fuzzy clustering

$$\mathbf{1} \qquad \overline{X}_{i,j} = \frac{X_{i,j} - \min\{X_{i=1:N,j}\}}{\max\{X_{i=1:N,j}\} - \min\{X_{i=1:N,j}\}} \forall j \in \{1, ..., n\}, \\ \overline{y}_{i,j} = \frac{Y_{i,j} - \min\{Y_{i=1:N,j}\}}{\max\{Y_{i=1:N,j}\} - \min\{Y_{i=1:N,j}\}} \forall j \in \{1, ..., n\}, \\ \mathbf{2} \qquad \mathbf{J} \left(\mathbf{U}, \mathbf{V} | \overline{\mathbf{X}}, \overline{\mathbf{Y}}\right) = \sum_{c=1}^{C} \cdot \sum_{i=1}^{N} (u_{i,c})^{2} \\ \cdot \mathbf{d}^{2} \left([\overline{X}_{i,j=1:n} \overline{Y}_{i,j=1:n}], V_{c,m=1:2n}\right)$$

This objective function is subject to the following two constraints:

$$\begin{split} &\sum_{c=1}^{C} u_{i,c} = 1 \forall i \in \{1, \dots, N\}, \\ &0 < \sum_{i=1}^{N} u_{i,c} < N \forall c \in \{1, \dots, C\}, \end{split}$$

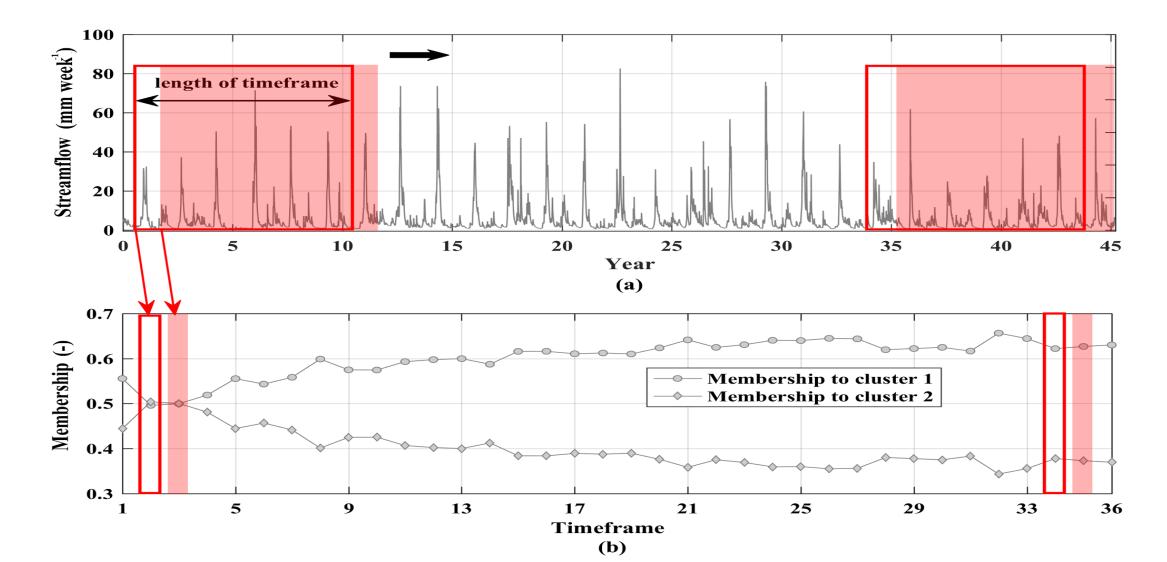
3  

$$U_{i,c} = \frac{\left(\frac{1}{d^{2}([\overline{x}_{i,j=1:n}\overline{y}_{i,j=1:n}], V_{c,m=1:2n})}\right)}{\sum_{C=1}^{C} \left(\frac{1}{d^{2}([\overline{x}_{i,j=1:n}\overline{y}_{i,j=1:n}], V_{c,m=1:2n})}\right)};$$

$$i \in \{1, \dots, N\}, c \in \{1, \dots, C\}.$$

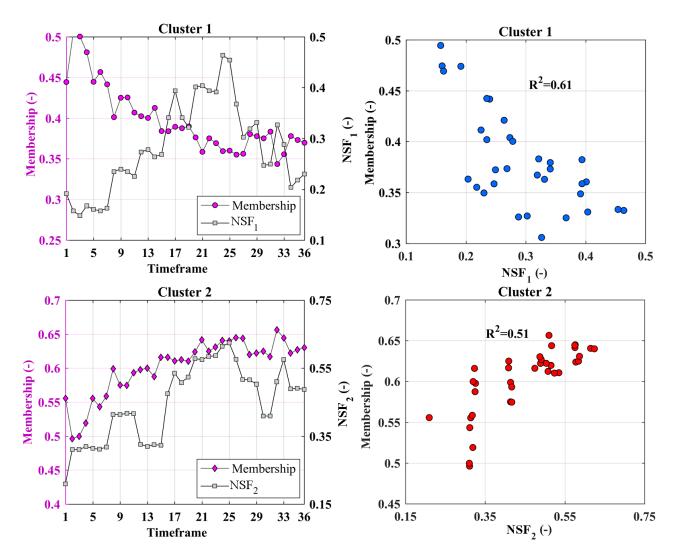


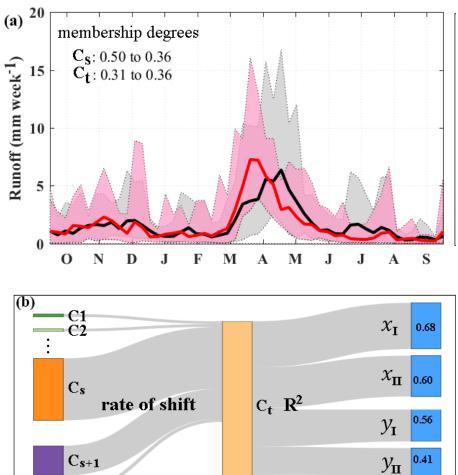
#### Detection of change in streamflow regime





#### Attribution and shift detection

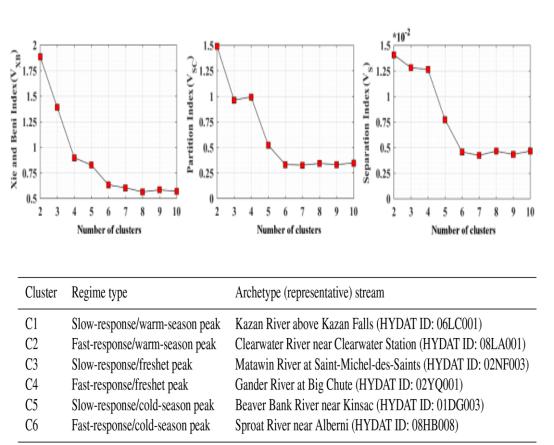


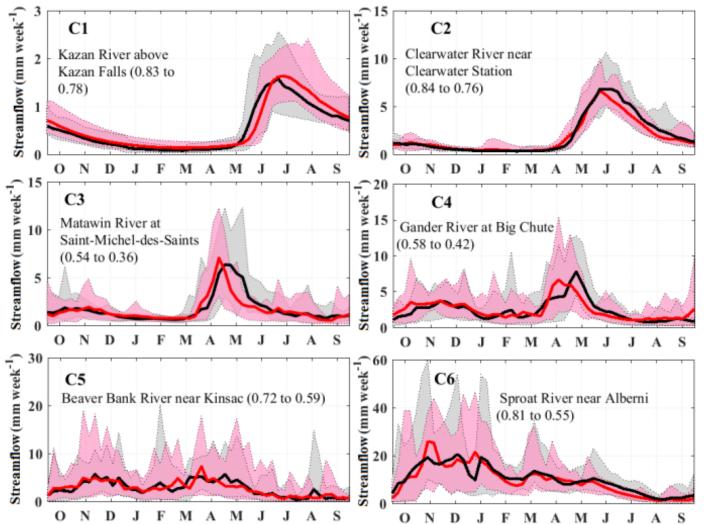


У<sub>Ш</sub> 0.39



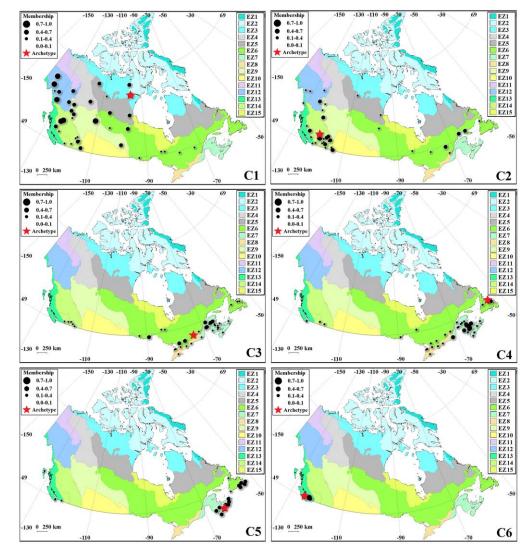
### Streamflow types in Canada

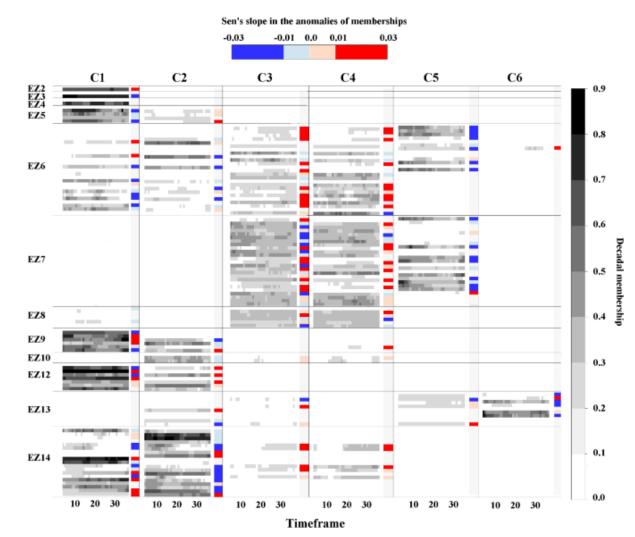






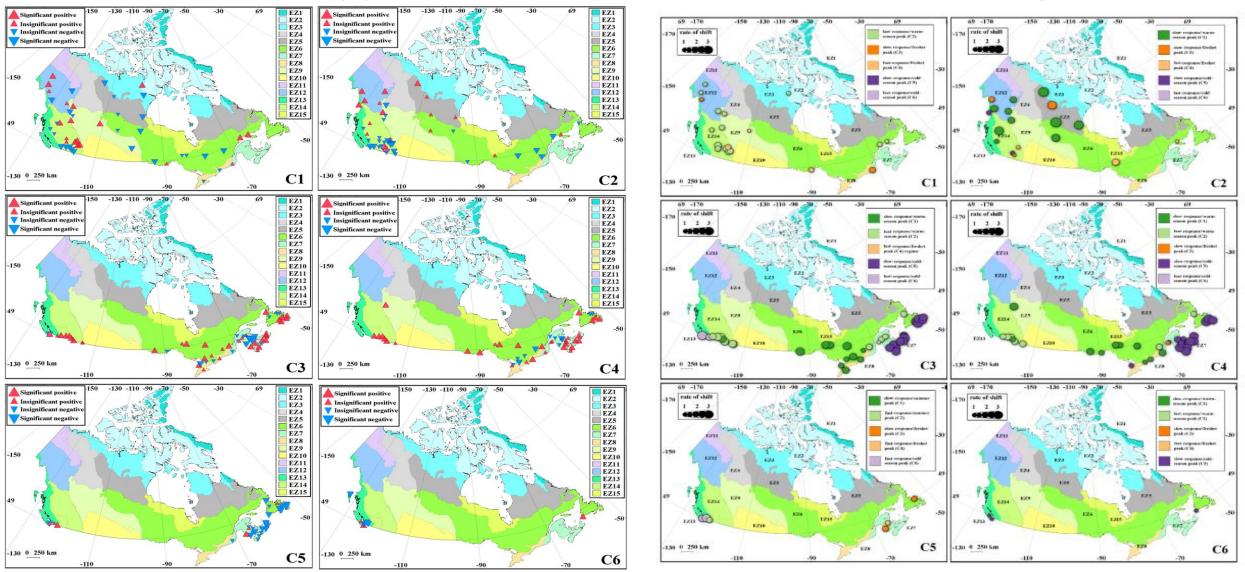
#### Streamflow types in Canada and their changes





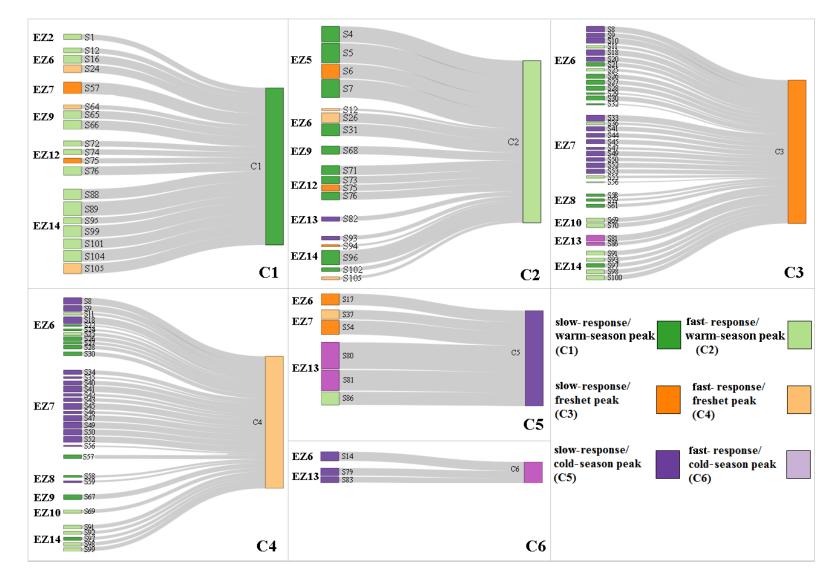
#### Streamflow types in Canada and their changes

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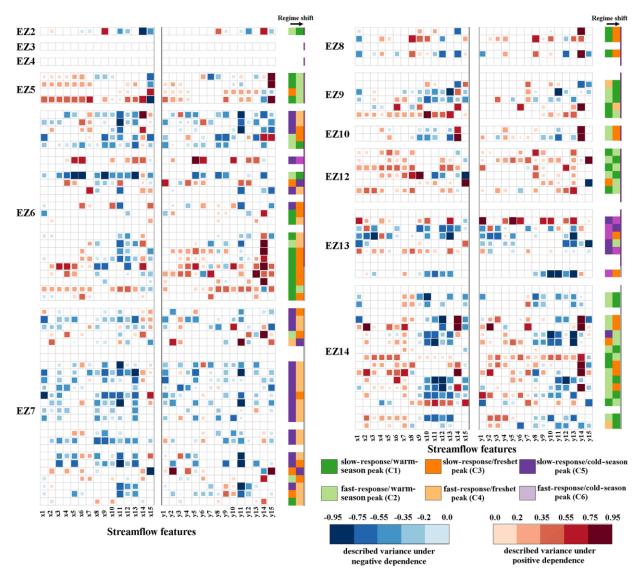


### **Regime shifts**



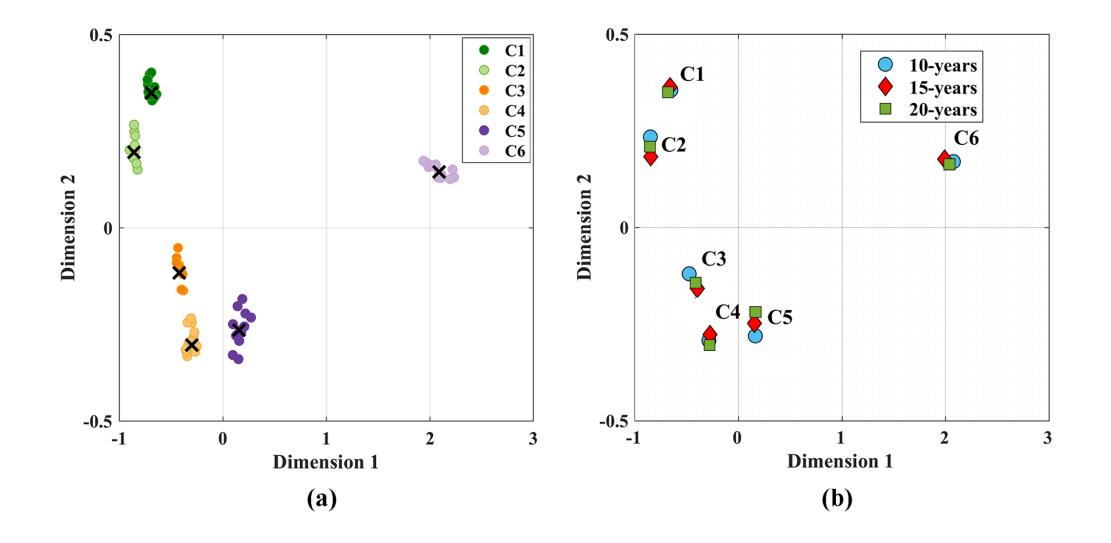


#### Attribution to changes in streamflow characteristics



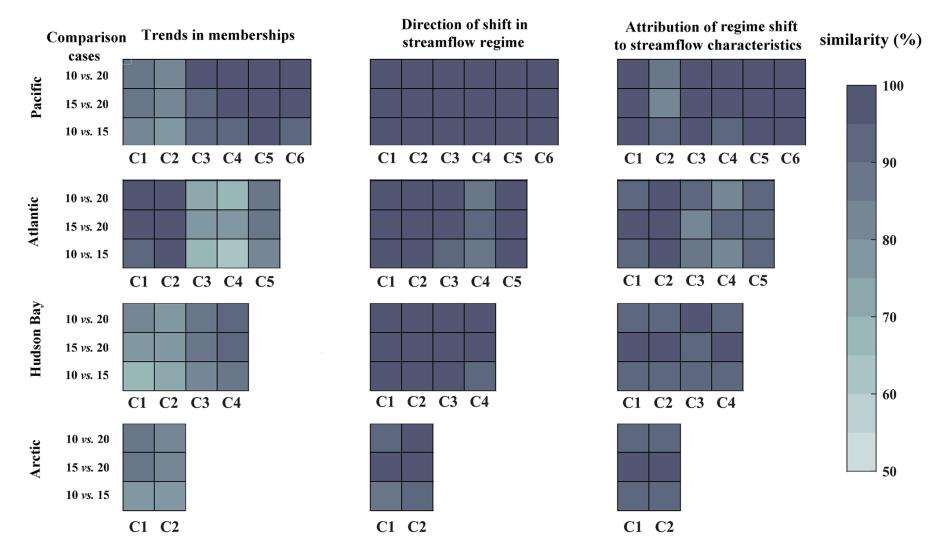


### Validation





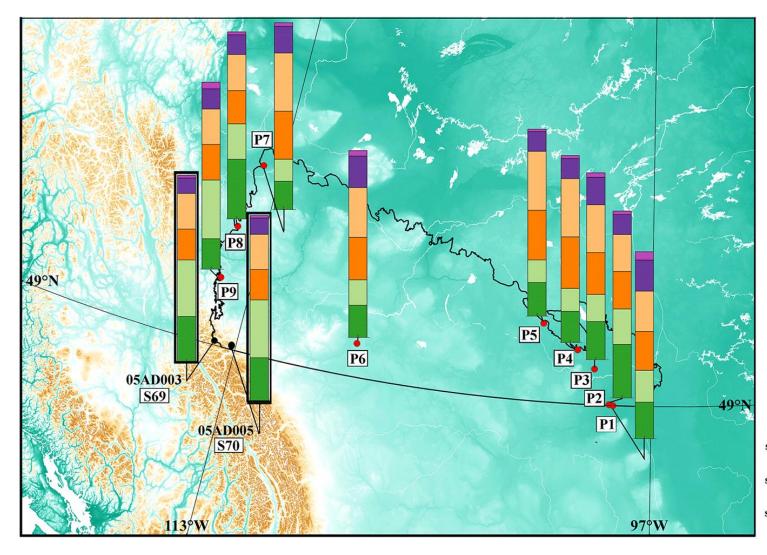
#### Validation

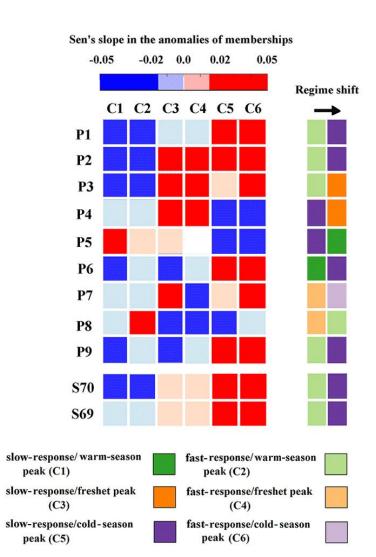


**Streamflow regimes** 



### Validation







# Verification

| Basin   | Sub-basin (stream loca-<br>tion) | Dominant regime shifts               | Earlier findings on changes in streamflow char-<br>acteristics<br>(reconfirmed in this study)   | New findings on changes in streamflow charac-<br>teristics<br>(discovered exclusively in this study)<br>Increasing flow in September; increasing flow<br>variability in April and May   |  |
|---------|----------------------------------|--------------------------------------|---|---|--|
|         | Yukon                            | C3 to C1                             | Earlier timing of low and high flows; greater<br>variability in timing of high flows (Burn, 2008;<br>Brabets and Walvoord, 2009; St. Jacques and<br>Sauchyn, 2009)                            |   |  |
|         | Seaboard (north)                 | C1 to C2                             | Increasing winter flows (Déry et al., 2009)   | Increasing monthly flow in May; earlier tim-<br>ing of low flow; increasing variability in March,<br>May, and annual flows  |  |
|         | Seaboard (south)                 | C1 to C3                             | Decreasing annual and monthly flows from<br>April to June; decreasing flow in fall (Déry et<br>al., 2009; Pike et al., 2010)  | Delayed and more variable timing of annual<br>low flow; increasing variability in February's<br>monthly flow  |  |
| Pacific | Fraser (north)                   | Case 1: C1 to C2<br>Case 2: C2 to C1 | No earlier study in this region found   | Case 1: increasing mean of and variance in<br>annual and summer flows; increasing monthly<br>flows in May and June; increasing variation in<br>timing of low flow and the quantity of spring<br>flows. Case 2: decreasing mean of and vari-<br>ance in annual flow; decreasing monthly flows<br>in July and October; earlier timing of high flow;<br>decreasing variability in monthly flows in May,<br>August, and September |  |
|         | Fraser (south) C2 to C5          |                                      | Decreasing summer flows (Stahl and Moore, 2006); Increasing variability in monthly flows in November and April (Déry et al., 2012; Thorne and Woo, 2011)                                      | Earlier timing of high flows; increasing mean monthly flows in November and April   |  |
|         | Columbia (north)                 | C2 to C1                             | Decreasing annual and summer flows (Stahl and<br>Moore, 2006; Fleming and Weber, 2012; Forbes<br>et al., 2019)  | Decreasing variability in annual flow and<br>monthly flows of August and September  |  |
|         | Columbia (south)                 | C1 to C3                             | Increasing flow in April and decreasing flow in<br>September (Whitfield and Cannon, 2000; Whit-<br>field, 2001); earlier timing of high flow (Burn<br>and Whitfield, 2016; Burn et al., 2016) | Delayed timing and greater variability in the an-<br>nual low flow; increasing mean of and variance<br>in November's flow   |  |



## Conclusion and further remark

- The first consistence (temporally and spatially) pan-Canadian study on understanding climate-change induced changes in streamflow regime.
- A globally-relevant algorithm was provided to (1) cluster streamflow regime based on the characteristics of the annual streamflow hydrograph, (2) detect regime shift and understanding where the regime is approaching, (3) attribute regime shifts to changes in the streamflow characteristics.
- While changes in regime was attributed to changes in streamflow characteristics, we know that changes in streamflow characteristics are caused by changes in hydrological processes.
- What are the hydrological causes of the shifts?

# Show must go on...



## Dedication

• This study is dedicated to the memory of Richard Janowicz, the iconic Yukon-based hydrologist who made fundamental discoveries on recent changes in natural streamflow regimes in the Great White North.

Northern hydrology owes you, *Ric*...



#### Richard Janowicz 1953-2018