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# Topography significantly influencing low flows in snow-dominated watersheds

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Hydrology and 9 Earth System Sciences Discussions

20 **Abstract.** Watershed topography plays an important role in determining the spatial heterogeneity of

ecological, geomorphological, and hydrological processes. Few studies have quantified the role of

topography on various flow variables. In this study, 28 watersheds with snow-dominated hydrological

regimes were selected with daily flow records from 1989 to 1996. The watersheds are located in the

Southern Interior of British Columbia, Canada and range in size from 2.6 to 1,780 km<sup>2</sup>. For each

watershed, 22 topographic indices (TIs) were derived, including those commonly used in hydrology

and other environmental fields. Flow variables include annual mean flow (Q<sub>mean</sub>), Q<sub>10%</sub>, Q<sub>25%</sub>, Q<sub>50%</sub>,

 $Q_{75\%}$ ,  $Q_{90\%}$ , and annual minimum flow ( $Q_{min}$ ), where  $Q_{x\%}$  is defined as flows that at the percentage (x)

occurred in any given year. Factor analysis (FA) was first adopted to exclude some redundant or

repetitive TIs. Then, stepwise regression models were employed to quantify the relative contributions

of TIs to each flow variable in each year. Our results show that topography plays a more important

role in low flows than high flows. However, the effects of TIs on flow variables are not consistent.

Our analysis also determines five significant TIs including perimeter, surface area, openness, terrain

characterization index, and slope length factor, which can be used to compare watersheds when low

flow assessments are conducted, especially in snow-dominated regions.

**Key words:** Topographic indices; Flow regime; Snow-dominated; Relative contribution; Low flow.

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Discussion started: 10 October 2017

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1. Introduction

Topography plays a critical role in geomorphological, biological, and hydrological processes (Moore

et al., 1991; Quinn et al., 1995). Many topographic indices (TIs) have been derived to describe the

spatial patterns of a landscape (Yokoyama et al., 2002), locate spatial patterns of species (Jenness,

2004), and simulate spatial soil moisture (Park et al., 2001). In hydrology, hydrological responses are

forced by climatic inputs (e.g. precipitation) but are somehow controlled by topography and other

factors such as land use and land cover (Beven and Kirkby, 1979; Hewlett and Hibbert, 1967). In

describing the role of topography on hydrology, numerous TIs have been developed and applied to

help understand hydrological processes and to explain the variation between watersheds (Moore et al.,

1991). Although the importance of topography in controlling flow regimes has been widely recognized

(Price, 2011), the quantitative relationship of specific TIs to various flow variables is not well

understood.

50 TIs can be categorized into two groups, namely, primary and secondary (or compounded) indices

(Moore et al., 1988). Primary indices (e.g. slope, elevation, and aspect) are normally directly calculated

from a digital elevation model (DEM), while secondary indices are the combination of primary indices

that are used to explain the role of topography in geomorphology, biology, and hydrological processes.

For instance, the topographic wetness index (TWI) is defined as:  $\ln (\alpha/\tan \beta)$ , where  $\alpha$  is the upslope

contributing area per unit contour length and  $\beta$  is the slope. TWI is a major input for TOPMODEL and

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Discussion started: 10 October 2017

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Hydrology and 9 Earth System Sciences Discussions

other hydrological applications (Beven, 1995; Beven and Kirkby, 1979; Quinn et al., 1995).

Hydrological studies mainly focus on primary TIs and a few secondary TIs with limited explanatory

powers as they largely fail to explain the variation in hydrological processes. Several TIs (e.g., terrain

characterization index, topographic openness) have been widely adopted in geomorphology and

biology, but they are seldom used in hydrologic studies. A thorough examination of existing TIs is

needed to identify those best accounting for hydrological variations between watersheds.

Studies of watershed topography on hydrological processes often include topics such as specific

discharge (Karlsen et al., 2016), spatial baseflow distribution (Shope, 2016), transit time (McGuire and

McDonnell, 2006; McGuire et al., 2005), and hydrological connectivity (Jencso and McGlynn, 2011).

These studies were often conducted based on a short period of data (< 5 years), limiting our ability to

draw general conclusions about how topography affects flows. Moreover, hydrological responses are

compounded by the spatially diverse effects of climate, vegetation, soil, and topography (Li et al., 2017;

Zhang et al., 2017). For example, several hydrological models have been applied to test the effect of

the spatial distribution of a hydrological variable (e.g. specific discharge, soil moisture, or groundwater

recharge) (Erickson et al., 2005; Gómez-Plaza et al., 2001; Li et al., 2014). However, the effects of

topography alone on hydrology are not usually addressed in those studies. Finally, understanding how

topography influences hydrology has important implications for sustainable management of aquatic

ecosystems (Zhang et al., 2015). Therefore, the major objectives of this study were: 1) to examine the

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Discussion started: 10 October 2017

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Hydrology and 9 Earth System Sciences Discussions

75 role of TIs in various flow variables in 28 selected watersheds with snow-dominated hydrological

regimes in the Southern Interior of British Columbia, Canada; and 2) to identify the most important

TIs that can be used to compare variations in flow regimes between watersheds under similar climatic

conditions.

2. Data

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2.1. Study watersheds

In this study, 28 watersheds were selected ranging in sizes ranging from 2.6 to 1,780 km<sup>2</sup> (Fig. 1 and

Table S1 in the Supplementary Information (SI)). The watersheds are located between 51°N 122°W

and 49°N 118°W in the Southern Interior of British Columbia, Canada where hydrological regimes are

snow-dominated. In this region, the Pacific Decadal Oscillation shifted from a cool to a warm phase

around 1977 (Fleming et al., 2007; Wei and Zhang, 2010), resulting in more precipitation and lower

temperatures, and consequently affecting flow regimes. In addition, an extensive mountain pine beetle

infestation caused large scale forest cover change from 2003 onwards. To avoid the uncertainties

associated with these perturbations and maximize the sample size, the period of 1989-1996 was

selected during which daily flow records are complete. In addition, we further confirm that vegetation

changes (using LAI, as a proxy) did not significantly change annual mean flow during this period (see

the SI, section 2).

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Discussion started: 10 October 2017

10 October 2017

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Hydrology and Earth System Sciences

Discussions

Annual mean temperature (T) and precipitation (P) of the study watersheds were calculated from the

ClimateBC dataset (Wang et al., 2006). ClimateBC is a standalone program that extracts and

downscales PRISM (Daly et al., 2008) monthly climate normal data and calculates seasonal and annual

climate variables for specific locations based on latitude, longitude, and elevation. Annual P, T, and

potential evapotranspiration (PET) were determined at 500 x 500 m points and averaged for each

watershed. PET was calculated using the Hargreaves method (Liu et al., 2016; Zhang and Wei, 2014).

The average mean annual P and PET of all 28 watersheds were  $813 \pm 205$  mm and  $586 \pm 58$  mm for

1989-1996, respectively (Fig. 2 and Figs. S1-S4).

2.2. Topographic indices

Based on availability and representation of TIs in literature, 22 topographic indices (TIs) were derived

using a gridded DEM at a spatial resolution of 25 m (Table 1). The DEM, geospatial streamflow

networks, lakes and wetland coverage were obtained from GeoBC (Government of British Columbia,

http://www2.gov.bc.ca/gov/content/data/about-data-management/geobc/geobc-products). All data

were transformed to the same projected coordinate system prior to the calculations of TIs. Calculation

of the TIs was made in ArcGIS10.4.1 (ERSI®) and SAGA GIS 2.1.2. Detailed information on the

calculation and interpretation of TIs can be found in the references listed in Table 1.

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Discussion started: 10 October 2017

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**Figure 1.** Locations of the 28 study watersheds and hydrometric stations.

**Table 1.** Topographic indices and descriptions

3. Methods

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3.1. Definitions of the selected flow variables

Annual mean flow (Q<sub>mean</sub>) and other flow variables generated by annual flow duration curve (FDC)

were used in this study. The selected flow variables include: Q<sub>10%</sub>, Q<sub>25%</sub>, Q<sub>50%</sub>, Q<sub>75%</sub>, Q<sub>90%</sub>, and annual

minimum flow (Q<sub>min</sub>) (in millimeters). They are defined as the daily flow that is at the given percentage

occurred in each year. For example,  $Q_{90\%}$  is the flow at 90% of the time in a year (Cheng et al., 2012).

To account for the confounding effects of climate, each annual flow variable was standardized with

annual (P) and expressed as  $Q_X/P$ .

3.2. Factor analysis

Because some initially selected TIs may be highly related, the first step was to use factor analysis (FA) 125

to reduce the number of TIs while still retaining important topographic information. FA can be

interpreted in a similar manner as principal component analysis (PCA). The difference between the

two approaches is that FA not only considers the total variance but also makes the distinction between

common and unique variances (Lyon et al., 2012). As TIs were calculated in a region with similar

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130 topography, the average TIs may not vary greatly between watersheds (McGuire and McDonnell, 2006;

Price, 2011). Therefore, to ensure better differentiation, the standard deviations of TIs in a watershed

were used for the FA test. It should be noted that the flow variables were not included in the FA test.

Three criteria are used in the FA procedure to exclude redundant TIs: Kaiser-Meyer-Olkin (KMO),

Bartlett's test, and anti-image correlation. KMO is a measure of sampling adequacy, which tests that

partial correlations among variables are small enough to ensure the validity of the FA test. Bartlett's

test of sphericity assesses the level of correlation between the variables in the FA to determine if the

combination of variables is suitable for such analysis (Lyon et al., 2012). The diagonals of anti-image

correlation matrix are a measure of sampling adequacy, which ensures that TIs are adequate for the

FA. If a TI makes the FA indefinite, namely KMO < 0.7, Bartlett' test P > 0.05, and the diagonals of

anti-image correlation < 0.7, then this TI is excluded from further consideration. With this iterative

approach, the groups of TIs with largest KMO and Barlett's test P < 0.05 are determined as the final

group of TIs. In this study, FA tests were conducted in the IBM® SPSS® Statistics Version 22.

3.3. Relative contributions of each TI to flow variables

The nonparametric Kendall tau correlation examines the flow variables and FA selected TIs in the 28

study watersheds. If a significant correlation is detected, it indicates a high topographic control on that

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Discussion started: 10 October 2017

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Hydrology and § Earth System Sciences Discussions

flow variable. Stepwise regression models were then built for each year between 1989 and 1996 for

each flow variable (see section 6 of the SI for details). Each flow variable was treated as the dependent

variable, while each TI was the independent variable. The purposes of the stepwise regression models

were: 1) to further exclude those TIs that were insignificantly related to flow variables; and 2) to

quantify the relative contributions of selected TIs to each flow variable in each year. The detailed

procedure can be found in Li et al. (2014). The R package "relaimpo" was used to quantify the relative

contributions of the selected TIs to each flow variable (Gromping, 2006). Specifically, the relative

contributions of each dependent variable to R<sup>2</sup> were calculated for each model.

To quantify the role of each TI in regulating each flow variable, we defined a contribution index (CI),

which can be expressed as:  $CI = O \times C$ , where, O is the number of occurrences of a TI in a flow

variable model (the maximum number is eight because each flow variable is studied for eight years),

and C is the average relative contribution of each TI. Therefore, a higher CI indicates a higher influence

of that TI on a flow variable. Finally, the lumped CI of each TI is presented as the total contribution of

the TI to all flow variables. The TIs with the CI values that are higher than the average of lumped CI

of all TIs were selected as the final set of TIs.

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Discussion started: 10 October 2017

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#### 4. Results

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### 4.1. Factor analysis

A sub-set of 11 TIs were selected from the initial 22 calculated TIs using the FA procedure. The KMO test (0.853) and Barlett's test (P<0.001) on the 11 TIs further confirm that our selected TIs are adequate to represent topography in our study region. In the FA analysis, the first and second factors explained 80.9% and 11.7% of total variance, respectively (Fig. 3). TIs included in the first factor are: DDG, LS, openness, relief, slope, SA, TCI, and TRI, while those in the second factor include SCA, perimeter, and UCA. Based on the definition of each TI, we conclude that the first factor TIs represent watershed roughness or complexity, while the second factor TIs is about watershed size. Therefore, the selected 11 TIs were subsequently classified into two groups representing complexity (Group 1) and area (Group 2) (Fig. 3).

Figure 2. Factor analysis of topographic indices (TIs) among 28 watersheds. The first and second factors explained 80.9% and 11.7% of the total variance, respectively.

#### 4.2. Relative contributions of TIs to flow variables

The nonparametric Kendall tau test revealed significant correlations between the TIs and each flow variable from 1989 to 1996 (Tables S2 to S8 in SI). Of the selected 11 TIs by FA, a total of 1, 1, 4, 8, 9, 10, and 11 TIs were significantly related to Q<sub>mean</sub>, Q<sub>10%</sub>, Q<sub>25%</sub>, Q<sub>50%</sub>, Q<sub>75%</sub>, Q<sub>90%</sub>, and Q<sub>min</sub>, respectively, in at least one year during the study period. A larger number of the TIs were correlated

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Discussion started: 10 October 2017

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185 to low flow variables (Q<sub>50%</sub>, Q<sub>75%</sub>, Q<sub>90%</sub>, and Q<sub>min</sub>), indicating that topography plays a more pronounced

role in regulating lower flows. Here, flows lower than  $Q_{75\%}$  are defined as the low flows. Thus, stepwise

regression modeling was only carried out for Q<sub>75%</sub>, Q<sub>90%</sub>, and Q<sub>min</sub>.

The regression models between flow variables and the selected TIs were all significant (P<0.01) with

 $R^2$  values > 0.5, indicating that selected TIs can be used to explain the variations of flow variables

(Table S9). The details of regression models are listed in the SI. The TIs that were included in each

model are shown in Fig. 3. The relative contributions of each TI to  $Q_{75\%}$ ,  $Q_{90\%}$ , and  $Q_{min}$  showed large

variations between years (Fig. 4-7). Fig. 3 revealed that each TI influences flow variables differently

(e.g. SA played a prominent role in Q<sub>min</sub> but did not significantly contribute to the variation of Q<sub>75%</sub>.

while DDG had the opposite role). This means that each TI cannot be used to explain variation in the

same way for each flow variable. Based on the lumped CI values, the relative contribution of the

perimeter TI was the highest in Group 2 as well as among all TIs (Fig. 3). In Group 1, the TIs above

the average of lumped CI were SA, openness, TCI, and LS receiving high contributions to low flows.

Therefore, we conclude that the above-mentioned 5 TIs are significant topographic indices influencing

low flow variables, which can be used to assess and compare low flows in watershed studies.

Figure 3. Relative contributions of each topographic index (TI) to Q<sub>75%</sub> (Panel A), Q<sub>90%</sub> (B), and

Q<sub>min</sub> (Panel C) from 1989 to 1996. Note that the numbers above the bars indicate the number of years

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Discussion started: 10 October 2017

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when the given TIs were included in the regression models. Panel D: Contribution index (CI) of the 11 topographic indices (TIs) selected by factor analysis (FA) to Q<sub>75%</sub>, Q<sub>90%</sub>, and Q<sub>min.</sub> respectively.

#### 5. Discussion

In this study, our results show that a limited number of TIs are significantly related to the  $Q_{mean}$ ,  $Q_{10\%}$ , and Q<sub>25%</sub>, suggesting that topography plays a limited role in the variations of average to high flows. This study area is characterized by snow-dominated hydrological regimes, with high flows (e.g., Q<sub>25%</sub> or greater) coming predominantly from the snow-melt process in early March to late May (e.g. Fig. S5). Snow-melting processes are normally related to elevation and climate. As the study watersheds in the Southern Interior of BC, Canada have similar elevation ranges and climate variability, it is not surprising that only a limited TIs were significantly related to high or mean flows. In contrast, more TIs were significantly associated with low flows, suggesting that topography plays a more important role in low flows than high flows in the study region. Low flows occur in the later summer (late August) and winter (October to February) (e.g. Fig. S5) and are mainly driven by small return periods of precipitation events of relatively short durations, soil water storage, and groundwater discharge or baseflow. A watershed with more complexities of topography would likely have higher water retention ability due to longer flow paths and residence time, and consequently promote more groundwater recharging and higher low flows (Price, 2011). Our correlation tests uncover a positive relationship between the selected TIs and low flow variables, indicating that the rougher or more complex that a

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Discussion started: 10 October 2017

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Hydrology and § Earth System Sciences Discussions

watershed is, the higher the yields of low flows. Therefore, topography plays more important role in

low flows than in high flows in the study region.

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Five TIs including perimeter, SA, openness, TCI, and LS were identified as the major contributors to

flow variables in this study. As far as we know, no studies have quantified topographic controls on

various flow magnitudes. Nevertheless, the relationship between topography and the mean transit time

(McGuire and McDonnell, 2006), temporal specific discharge (Karlsen et al., 2016), and hydrological

connectivity (Jencso and McGlynn, 2011) have been investigated. It is no doubt that topography is one

of the major contributors to hydrological variations (Price, 2011; Smakhtin, 2001). Although these

studies pinpointed specific TIs and their interactions with hydrological responses, only a limited

number of TIs were included. In contrast, a total number of 22 TIs were calculated for 28 watersheds

in this study. The much higher number of TIs included, along with our filtering methods applied allows

us to select more suitable and significant TIs in this study. Through this study design, we expect that

the selected five TIs can be effectively used to support assessment or comparisons of low flows

between watersheds in the study region. It should also be noted that we only selected the first 5 TIs

that had substantially higher contributions than the other calculated TIs. The rest of the hydrological-

related TIs had a minor ability for explaining flow variations.

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Discussion started: 10 October 2017

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Hydrology and 9 Earth System Sciences Discussions

Among the selected 5 TIs, one primary TI (perimeter) is commonly used in scientific studies. Our

study further proves that it has high influence on flow variables. However, the 4 secondary TIs (SA,

openness, TCI, and LS) are mainly used in geomorphology to characterize ruggedness or roughness of

landscapes and to identify topographic functioning of ecosystems. For examples, TCI has been used

to map soil organic matter concentration (Zeng et al., 2016), while SA was used to estimate animal

species and habitat (Jenness, 2004), map the spatial patterns of a flood plain (Scown et al., 2015).

Openness was initially adopted to identify the boundary of different geological units (Yokoyama et al.,

2002) and calderas (Yoshida et al., 1999). LS is one of the key inputs to the universal soil loss equation

(USLE) used to quantify soil erosion hazards (Desmet and Govers, 1996). Park et al. (2001) indicated

that TCI is a better TI to predict soil depth than TWI, plan curvature, and profile curvature (see

definitions in Table 1). Openness is considered a robust index that is used to identify surface

convexities and concavities, which is better than the commonly used profile and plan curvature

(Yokoyama et al., 2002). In this study, the selected 5 TIs were initially filtered by the FA test,

indicating that this sub-set of TIs each has uniqueness in describing watershed topographic

characteristics, and outperformed the other tested TIs in describing variation in flow variables.

To our surprise, some commonly used TIs in hydrology, such as slope, median elevation, upslope

contribution area, wetland areas, TWI, etc. are not included in the final list as the topographic

information contained in those primary TIs also exists in some secondary TIs. Secondary TIs have the

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Discussion started: 10 October 2017

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advantage of describing the hydrology-related landscapes in a fuller detail. For example, slope is

directly included in calculations of the TWI (secondary) and DDG (secondary). UCA (primary TI) is

included in TWI and TCI (secondary). The TWI has long been used as a key input variable for

TOPMODEL, and is an indicator of soil moisture (Beven, 1995). Our study identified that TWI and

wetland area were not significantly related to flow variables, indicating that these factors had a limited

role in the selected flow variables in our region. This may be because the watersheds in this area need

to overcome a soil moisture storage threshold prior to releasing water (Karlsen et al., 2016). In

summary, our 5 selected TIs significantly represent low flow characteristics of the watersheds in the

southern interior of British Columbia, Canada, which is characterized by a snow-dominated

hydrological regime. As far as we know, there are no such studies conducted in either snow- or rain-

dominated regions. Our research framework was developed based on a large number of watersheds

with long-term hydrological data all in a similar climatic region that snow-dominated. To explore how

topography controls flow regimes in rain-dominated regions, we recommend applying our framework

in an area with large numbers of long-term monitoring stations.

There are several uncertainties in our study. Firstly, hydrological responses are the combined effects

of climate, soil, vegetation, topography, and geology (Price, 2011; Smakhtin, 2001). In this study, LAI

representing the variations of vegetation cover in different watersheds was included in our analysis in

order to minimize the effects of different vegetation coverages in the studied watersheds. However, it

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Discussion started: 10 October 2017

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Hydrology and § Earth System Sciences Discussions

was excluded by the FA test, confirming that the differences in vegetation cover and their effects were

minor so that our selected watersheds are comparable in terms of forest coverage. Secondly, LS, TCI,

and SA are commonly-used indicators of soil erodibility, and were included in this study to capture

the influence of soil conditions. For example, Park et al. (2001) showed that the areas with high values

of TCI have high rates of soil erosion. Therefore, the variation of soil properties was considered to

some degree by the inclusion of these TIs, but not in a full detail. In fact, it is impossible to derive

accurate soil properties over a large area. Thirdly, potential impacts of the DEM resolution on the

calculation of TIs were not considered. However, Panagos et al., (2015) indicated that the resolution

of 25 meters is adequate for calculation of slope factor at the European scale. Similarly, DEM

resolutions were not found to significantly affect the calculation of DDG (Hjerdt et al., 2004). Thus,

considering the same DEM data with the resolution of 25-meter, we assume the error caused by the

DEM resolution would also be minor.

6. Conclusion

This study concludes that topography plays a significant role in low flows, while its role is high flows

is limited. A total number of 5 topographic indices, including perimeter, LS (slope length factor), SA

(surface area), TCI (topographic characteristic index), and openness, were identified with significant

contributions to low flow variables. It is recommended that those above-mentioned 5 TIs can be used

to assess the magnitude of low flows in the study region which is characterized by a snow-dominated

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hydrological regime. The application of our research framework to rain-dominated regions is recommended to investigate how topography controls flow regimes in these areas.

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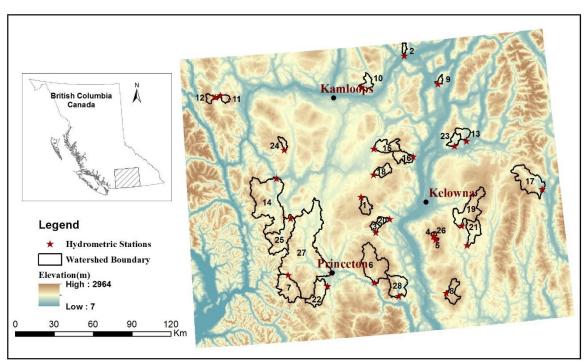
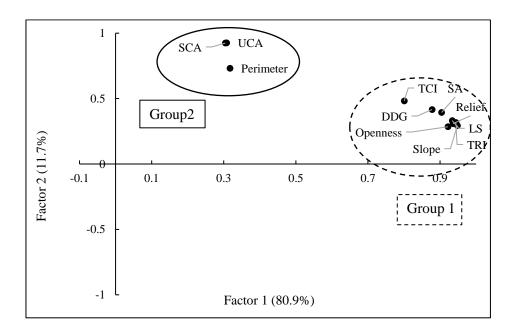


Figure 1. Locations of the 28 study watersheds and hydrometric stations.

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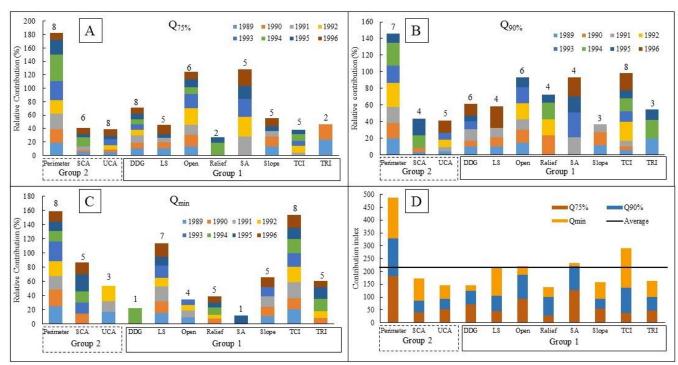
**Figure 2.** Factor analysis of topographic indices (TIs) among 28 watersheds. The first and second factors explained 80.9% and 11.7% of the total variance, respectively.

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**Figure 3**. Relative contributions of each topographic index (TI) to Q<sub>75%</sub> (Panel A), Q<sub>90%</sub> (B), and Q<sub>min</sub> (Panel C) from 1989 to 1996. Note that the numbers above the bars indicate the number of years when the given TIs were included in the regression models. Panel D: Contribution index (CI) of the 11 topographic indices (TIs) selected by factor analysis (FA) to Q<sub>75%</sub>, Q<sub>90%</sub>, and Q<sub>min</sub> respectively.

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Table 1. Topographic indices and descriptions

No.	Abbreviation	TI	Description and references
1	UCA	Upslope contributing area	UCA is the area that can potentially produce runoff to a given location (Erskine et al., 2006).
2	DDG	Downslope Distance Gradient	DDG is a hydrologic measure of the impact of the local slope characteristics on a hydraulic gradient. Values are lower on concave slope profiles and higher on convex slope profiles (Hjerdt et al., 2004).
3	DDGD	Downslope Distance Gradient Difference	The difference between DDG and local or neighbor gradients (Hjerdt et al., 2004).
4	FLD	Downstream flow length	The downslope distance of a pixel along the flow path to the outlet of a watershed (Greenlee, 1987).
5	ME	Median Elevation	Median elevation among all DEM pixels in a watershed.
6	Relief	Relief	The difference between the highest and lowest elevations within a local analysis window. 11×11 grid cell window is used in this paper.
7	Roughness	Roughness	Roughness is calculated as 1/cos(slope) of each DEM pixel.
8	Slope	Slope Degree	Slope degree of each DEM pixel (Burrough et al., 2015).
9	LS	Slope Length Factor	LS is a combined factor of slope length and slope gradient. It represents the ratio of soil loss per unit area on a site to the corresponding loss from a 22.1 m long experimental plot with a 9% slope (Desmet and Govers, 1996).
10	SCA, also known as A <sub>s</sub>	Specific Contributing area	Upslope contributing area per unit length of contour (Quinn et al., 1991).
11	STD	Stream Density	Ratio of the sum of all stream length to watershed area.
12	TCI	Terrain Characterization Index	TCI = Cs *log <sub>10</sub> (SCA), where Cs is the surface curvature index; The higher positive TCIs reflect higher aggradation of soil materials at a certain point along the hillslope (Park and van de Giesen, 2004).
13	TRI	Terrain Ruggedness Index	TRI expresses the degrees of difference in elevation among adjacent cells (Riley, 1999).
14	TPI	Topographic Position Index	$TPI \approx 0$ indicates flat area. $TPI > 0$ tends towards ridge tops and hilltops. $TPI < 0$ tends towards the valley and canyon bottoms (Jenness, 2006). A $9 \times 9$ grid cell window is used in this paper.
15	TWI	Topographic Wetness Index	TWI = ln (SCA/Tan(slope)), it shows the spatial distribution of zones of surface saturation and soil water content (Ambroise et al., 1996; Quinn et al., 1995).
16	Wetland	Wetland coverage	Percentage wetland area to total watershed area.
17	Length	Length of Main River	Total length of main stream,

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18	Roundness	Roundness coefficient	The ratio of watershed area to the area of a circle with the same perimeter. A lower value indicates a longer and narrow watershed.
19	Openness	Positive topographic openness	Describe the degree of dominance or enclosure of a location on an irregular surface. Values are high for convex forms (Yokoyama et al., 2002).
20	SA	Surface Area	Land area of each DEM, which may provide a better estimation of the surface roughness than planimetric area (Jenness, 2004).
21	Perimeter	Perimeter of a watershed	Perimeter of a watershed.
22	Total	Total curvature	Standard curvature combines profile and planform curvatures (Moore et al., 1991).