

This discussion paper is/has been under review for the journal Hydrology and Earth System Sciences (HESS). Please refer to the corresponding final paper in HESS if available.

Multi-variable evaluation of hydrological model predictions for a headwater basin in the Canadian Rocky Mountains

X. Fang¹, J. W. Pomeroy¹, C. R. Ellis^{1,2}, M. K. MacDonald^{1,3}, C. M. DeBeer^{1,4}, and T. Brown¹

¹Centre for Hydrology, University of Saskatchewan, Saskatoon, Canada

²Silvatech Consulting Ltd., Salmon Arm, Canada

³School of Geosciences, University of Edinburgh, Edinburgh, UK

⁴Canada North Environmental Services, Saskatoon, Canada

Received: 31 October 2012 – Accepted: 5 November 2012 – Published: 13 November 2012

Correspondence to: X. Fang (xif382@mail.usask.ca)

Published by Copernicus Publications on behalf of the European Geosciences Union.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Abstract

One of the purposes of the Cold Regions Hydrological Modelling platform (CRHM) is to diagnose inadequacies in the understanding of the hydrological cycle and its simulation. A physically based hydrological model including a full suite of snow and cold regions hydrology processes as well as warm season, hillslope and groundwater hydrology was developed in CRHM for application in the Marmot Creek Research Basin ($\sim 9.4 \text{ km}^2$), located in the Front Ranges of Canadian Rocky Mountains. Parameters were selected from digital elevation model, forest, soil and geological maps, and from the results of many cold regions hydrology studies in the region and elsewhere. Non-calibrated simulations were conducted for six hydrological years during 2005–2011 and were compared with detailed field observations of several hydrological cycle components. Results showed good model performance for snow accumulation and snowmelt compared to the field observations for four seasons during 2007–2011, with a small bias and normalized root mean square difference (NRMSD) ranging from 40 to 42 % for the subalpine conifer forests and from 31 to 67 % for the alpine tundra and tree-line larch forest environments. Overestimation or underestimation of the peak SWE ranged from 1.6 to 29 %. Simulations matched well with the observed unfrozen moisture fluctuation in the top soil layer at a lodgepole pine site during 2006–2011, with a NRMSD ranging from 17 % to 39 %, but with consistent overestimation of 7 to 34 %. Evaluations of seasonal streamflow during 2006–2011 revealed the model generally predicted well compared to observations at the basin scale, with a NRMSD of 77 % and small model bias (6 %), but at the sub-basin scale NRMSD were larger, ranging from 86 to 106 %; though overestimation or underestimation for the cumulative seasonal discharge was within 24 %. Timing of discharge was better predicted at the Marmot Creek basin outlet having a Nash-Sutcliffe efficiency (NSE) of 0.31 compared to the outlets of the sub-basins where NSE ranged from -0.03 to -0.76 . The Pearson product-moment correlation coefficient of 0.12 and 0.17 for comparisons between the simulated groundwater storage and observed groundwater level fluctuation at two wells indicate weak

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



but positive correlations. The model results are encouraging for uncalibrated prediction and indicate research priorities to improve simulations of snow accumulation at treeline, groundwater dynamics and small-scale runoff generation processes in this environment. The study shows that improved hydrological cycle model prediction can be derived from improved hydrological understanding and therefore is a model that can be applied for prediction in ungauged basins.

1 Introduction

The Canadian Rockies are an important water source for Northern North America; they form the headwaters of the eastward flowing Saskatchewan and Athabasca Rivers, whose water supplies are crucial to the urban centres of Alberta and Saskatchewan such as Edmonton, Calgary, Saskatoon, and Regina as well as to the agricultural sector and oil sands mining operations. The western slopes are the headwaters of the Columbia and Fraser Rivers whose water supports hydroelectricity generation, agriculture and municipalities in southern British Columbia and the US Pacific Northwest. Water supplies from runoff in the eastward flowing Canadian Rockies drainages have been declining (St. Jacques et al., 2010) and are predicted to drop further just as increasing demand is projected due to rising population and greater consumption from downstream agriculture and industry (Mannix et al., 2010).

Mountain runoff in this region is sensitive to climate variations. It is suggested that the rising number of winter days with air temperature above the freezing point (Lapp et al., 2005) and decreases in spring snowcover extent (Brown and Robinson, 2011) are resulting in earlier spring runoff (Stewart et al., 2004) and lower annual streamflows (St. Jacques et al., 2010). These climate changes have been associated with increasing rates of forest disturbance due to wildfire (Fauria and Johnson, 2006), insect infestation (Aukema et al., 2008), and disease (Woods et al., 2005). The hydrological cycle in mountain environments can be substantially altered by forest disturbance, leading to increased snow accumulation and snowmelt rates (Pomeroy and Gray, 1995; Boon,

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



2009; Burles and Boon, 2011; Pomeroy et al., 2012), enhanced surface runoff and peak flow (Whitaker et al., 2002; Pomeroy et al., 2012), and changing groundwater regimes (Rex and Dubé, 2006).

5 Many cold regions mountain basins are dominated by needleleaf forest cover, where snowmelt is the most important annual hydrological event (Gray and Male, 1981). Needleleaf forest foliage substantially reduces snow accumulation, with declines ranging from 30 % to 50 % compared to adjacent clearing sites (Pomeroy et al., 2002; Gelfan et al., 2004). The losses of snow accumulation in forests are attributed to the interception of snow by the evergreen needleleaf canopy (Lundberg and Halldin, 1994; Pomeroy and Gray, 1995; Hedstrom and Pomeroy, 1998; Gelfan et al., 2004). This intercepted snow is exposed to high rates of turbulent transfer and radiation input and so sublimates rapidly (Pomeroy et al., 1998) resulting in greatly reduced snow accumulation on the ground at the time of snowmelt (Pomeroy and Gray, 1995). However, snow unloading response to energy inputs adds uncertainty about the partition of snowfall between interception and unloading by the forest canopies, and further development of these algorithms for mountain slopes and forests is needed (Rutter et al., 2009). Besides interception effects, needleleaf forest cover also affects energy exchanges to snow and therefore the timing and duration of snowmelt. The forest canopy dampens turbulent energy fluxes when compared with open snowfields (Harding and Pomeroy, 1996; Reba et al., 2012). As a result, energy to melt sub-canopy snow is dominated by radiation fluxes, which in turn are altered by extinction of shortwave transmission through the canopy and enhancement of longwave emission from canopies and trunks (Link et al., 2004; Sicart et al., 2004; Essery et al., 2008; Boon, 2009; Pomeroy et al., 2009; Ellis et al., 2012; Varhola et al., 2010).

25 Elevation exerts a strong influence on air temperature, precipitation depth and phase in mountain basins (Storr, 1967; Marks et al., 2012), while slope and aspect are the additional factors controlling the patterns of snow accumulation and snowmelt in the mountain environments (Golding and Swanson, 1986; Pomeroy et al., 2003; DeBeer and Pomeroy, 2009; MacDonald et al., 2010; Ellis et al., 2011; Marsh et al., 2012). At

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



high elevations above treeline, snow is redistributed by wind (Föhn and Meister, 1983; Doorschot et al., 2001; Bernhardt et al., 2009), of which some is lost via sublimation to the atmosphere (MacDonald et al., 2010).

Temperate zone models have great difficulty in simulating the hydrological cycle of cold mountain regions (Swanson, 1998), and there remains a need for a model that is suitable for river basins originating in the Canadian Rockies. Cold regions hydrological processes have been represented in hydrological models such as ARHYTHM (Zhang et al., 2000), VIC (Bowling et al., 2004), and GENESYS (MacDonald et al., 2011). However, the Cold Regions Hydrological Modelling platform (CRHM) offers a more complete range of processes for the Canadian Rockies (i.e. blowing snow, interception and sublimation of snow, energy balance snowmelt, slope radiation, canopy influence on radiation, canopy gap effect on snow, infiltration to frozen soils) and the process algorithms have been extensively field tested. CRHM is a modular model assembling system that allows appropriate hydrological processes to be linked for simulating basin hydrological cycle (Pomeroy et al., 2007). The underlying philosophy is to use CRHM to create a model of appropriate physical and spatial complexity for the level of understanding and information available for the basin being modelled. Insight from field investigations has largely guided CRHM's development, with the expectation that an improved understanding of the underlying hydrological processes will yield benefits in terms of prediction capability and so new algorithms from field studies have been incorporated as modules in the platform. For example, new algorithms recently added to CRHM include those for estimating shortwave radiation through forest canopies on slopes (Ellis and Pomeroy, 2007), calculating enhanced longwave emissions from canopies (Pomeroy et al., 2009), and estimating snow surface temperature (Ellis et al., 2010). CRHM also now accounts for canopy gap radiative transfer and unloading of intercepted snow in a mass and energy module for needleleaf forests (Ellis et al., 2010, 2012). Other recent additions are modules for simulating blowing snow and sublimation affected by local wind and topography in the alpine treeline environment (MacDonald et al., 2010), improved simulation for the alpine snowmelt and snowmelt runoff (DeBeer

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



and Pomeroy, 2010) and improved soil system representation for runoff generation (Dornes et al., 2008a; Fang et al., 2010).

A physically based hydrological model incorporating these recent developments was set up using CRHM to simulate forest snow hydrology in a headwater basin of Canadian Rockies; preliminary tests showed adequate predictions for snow accumulation, melt, and snowmelt runoff (Pomeroy et al., 2012). More recent model developments have focused on incorporating a more physically realistic soil and groundwater system in the model and simulating groundwater-surface water interactions on hillslopes to improve simulation of soil moisture, evapotranspiration, baseflow, and groundwater storage. A comprehensive model addressing all major processes in the basin hydrological cycle that can be parameterised based on field and remote sensing measurements is expected to be a powerful and robust tool for examining the impacts of land use and climate change on basin runoff response. Such a tool would also provide a basis for identifying regionalised parameterisations for modelling similar but ungauged basins in the region (Dornes et al., 2008b) as well as helping identify those physical processes most critical in controlling the large-scale hydrology of the region (Pietroniro et al., 2007). Another advantage of models like CRHM is that they may be evaluated using multiple objectives to avoid equifinality problems (Bevan and Freer, 2001) by allowing a much more powerful evaluation of the model as a representation of many aspects of the hydrological cycle (Dornes et al., 2008b). Considering these issues, the objectives of this paper are to: (1) propose a comprehensive physically based model to simulate all the relevant hydrological processes for a headwater basin of Canadian Rocky Mountains; (2) evaluate the model performance against the field observations, including winter snow accumulation, spring snowmelt, spring and summer soil moisture fluctuation, streamflow discharge, and groundwater level fluctuation without any parameter calibration from streamflow records. It is expected that this will not only assess our understanding of hydrology in this environment, but substantially advance the practice of hydrological prediction for ungauged basins, and provide a predictive

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



tool that is sufficiently robust for describing hydrological responses in non-stationary environments.

2 Study area and field observations

2.1 Site description

5 The study was conducted in the Marmot Creek Research Basin (MCRB) (50° 57' N, 115° 09' W), Kananaskis Valley, Alberta, Canada, located within the Front Ranges of the Canadian Rocky Mountains (Fig. 1a). Marmot Creek is a tributary of the Kananaskis River and is a headwater basin of the Bow River basin. The MCRB totals 9.4 km² and is composed of three upper sub-basins: Cabin Creek (2.35 km²), Middle Creek (2.94 km²), and Twin Creek (2.79 km²), which converge into the confluence sub-basin above the main stream gauge (1.32 km²). Elevation ranges from 1600 m above sea level at the main stream gauge to 2825 m at the summit of Mount Allan. Most of MCRB is covered by needleleaf vegetation which is dominated by Engelmann spruce (*Picea engelmanni*) and subalpine fir (*Abies lasiocarpa*) in the higher elevations and lodgepole pine (*Pinus contorta* var. *Latifolia*) in the lower elevations (Kirby and Ogilvy, 1969). Forest management experiments conducted in the 1970s and 1980s left large clear-cutting blocks in the Cabin Creek sub-basin and numerous small circular clearings in the Twin Creek sub-basin (Golding and Swanson, 1986). Alpine larch (*Larix lyallii*) and short shrub are present around the treeline at approximately 2180 to 2250 m, and exposed rock surface and talus are present in the high alpine part of basin. The basin experiences seasonally frozen soils, and surficial materials are primarily poorly developed mountain soils consisting of glaciofluvial and till surficial deposits (Beke, 1969). Relatively impermeable bedrock is found at the higher elevations and headwater areas, while the rest of basin is covered by a deep layer of coarse and permeable soil allowing for rapid rainfall infiltration to subsurface layers overlying relatively impermeable shale (Jeffrey, 1965). In general, continental air masses control the weather in the region,

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



which has long and cold winters and cool and wet springs. Westerly warm and dry Chinook (foehn) winds lead to brief periods with the air temperature above 0°C during the winter months. In the MCRB, annual precipitation ranges from 600 mm at lower elevations to more than 1100 mm at the higher elevations, of which approximately 70 to 75% occurs as snowfall with the percentage increasing with elevation (Storr, 1967). Mean monthly air temperature ranges from 14°C in July to -10°C in January.

2.2 Field observations

Model forcing meteorological observations of air temperature, relative humidity, wind speed, precipitation, soil temperature, and incoming short-wave radiation were collected from the Centennial Ridge, Fisera Ridge, Vista View, Upper Clearing and Upper Forest, Level Forest, and Hay Meadow hydrometeorological stations. The locations of these meteorological stations in the MCRB are shown in Fig. 1a which are described in several recent publications (DeBeer and Pomeroy, 2010; Ellis et al., 2010; MacDonald et al., 2010). Precipitation was measured with an Alter-shielded Geonor weighing precipitation gauge at Hay Meadow, Upper Clearing, and Fisera Ridge and was corrected for wind-induced undercatch (MacDonald and Pomeroy, 2007). Meteorological data were spatially distributed across the basin with adjustments for temperature by a constant environmental lapse rate (0.75°C/100 m) and adjustments for precipitation based on observed seasonal gradients from several years of observations at multiple elevations. Vapour pressure was conserved for unsaturated conditions and not allowed to exceed saturation vapour pressure when extrapolated. Radiation inputs were adjusted for slope and sky view using the various methods outlined in the next section.

Snow surveys were conducted over the winter and spring from transects established near the meteorological stations. For each snow survey transect, at least 25 snow depth measurements with a ruler and at least six gravimetric snow density measurements with an ESC-30 snow tube were collected to estimate snow water equivalent (SWE). Soil moisture (0–25 cm) was continuously measured with Campbell Scientific CS616 soil moisture probes at Upper Clearing, Upper Forest and Level Forest. Environment

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Canada's Water Survey of Canada maintains a long-term streamflow gauge (05BF016) at the Marmot Creek basin outlet shown in Fig. 1a, providing seasonal (1 May–31 October) daily mean streamflow discharge. Additional measurements of streamflow were conducted at the outlets of Cabin Creek, Middle Creek and Twin Creek sub-basins (Fig. 1a) starting from spring 2007. Flow depth was measured with automated pressure transducers and discharge was calculated from velocity and depth profiles taken every few weeks from spring to fall for these sub-basin outlets. Several groundwater wells were established at the MCRB in 1960s and were continuously monitored until the mid-1980s. Some of these wells were re-activated in the mid-1990s of which recent data (December 2005–July 2010) was obtained from Alberta Environment and Sustainable Resource Development for the two wells GW305 and GW386 shown in Fig. 1a.

3 Model setup and parameterisation

3.1 Cold regions hydrological modelling platform

The Cold Regions Hydrological Modelling platform (CRHM) was used to develop a basin hydrological model to simulate the dominant hydrological processes in alpine and forested environments at the MCRB. CRHM is an object-oriented, modular and flexible platform for assembling physically based hydrological models. With CRHM, the user constructs a purpose-built model or “project”, from a selection of possible basin spatial configurations, spatial resolutions, and physical process modules of varying degrees of physical complexity. Basin discretization is performed via dynamic networks of hydrological response units (HRUs) whose number and nature are selected based on the variability of basin attributes and the level of physical complexity chosen for the project. Physical complexity is selected by the user in light of hydrological understanding, parameter availability, basin complexity, meteorological data availability and the objective flux or state for prediction. Models are chosen depending on the dominant

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

hydrological processes and controls on the basin. A full description of CRHM is provided by Pomeroy et al. (2007).

A set of physically based modules was constructed in a sequential manner to simulate the dominant hydrological processes for the MCRB. Figure 2 shows the schematic setup of these modules, which include:

1. Observation module: reads the forcing meteorological data (temperature, wind speed, relative humidity, vapour pressure, precipitation, and radiation), adjusting temperature with environmental lapse rate and precipitation with elevation and wind-induced undercatch, and providing these inputs to other modules.
2. Radiation module (Garnier and Ohmura, 1970): calculates the theoretical global radiation, direct and diffuse solar radiation, as well as maximum sunshine hours based on latitude, elevation, ground slope, and azimuth, providing radiation inputs to the sunshine hour module, the energy-budget snowmelt module, and the net all-wave radiation module.
3. Sunshine hour module: estimates sunshine hours from incoming short-wave radiation and maximum sunshine hours, generating inputs to the energy-balance snowmelt module and the net all-wave radiation module.
4. Slope radiation module: estimates incident short-wave to a slope using measurement of incoming short-wave radiation on a level surface. The measured incoming short-wave radiation from the observation module and the calculated direct and diffuse solar radiation from the radiation module are used to calculate the ratio for adjusting the short-wave radiation on the slope.
5. Long-wave radiation module (Sicart et al., 2006): estimates incoming long-wave radiation using measured short-wave radiation. This is inputted to the energy-balance snowmelt module.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Discussion Paper | Discussion Paper | Discussion Paper | Discussion Paper | Discussion Paper

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

6. Albedo module (Verseghy, 1991): estimates snow albedo throughout the winter and into the melt period and also indicates the beginning of melt for the energy-balance snowmelt module.
7. Canopy module (Ellis et al., 2010): estimates the snowfall and rainfall intercepted by the forest canopy and updates the under-canopy snowfall and rainfall and calculates short-wave and long-wave sub-canopy radiation. This module has options for open environment (no canopy adjustment of snow mass and energy), small forest clearing environment (adjustment of snow mass and energy based on diameter of clearing and surrounding forest height), and forest environment (adjustment of snow mass and energy from forest canopy).
8. Blowing snow module (Pomeroy and Li, 2000): simulates the inter-HRU wind redistribution of snow transport and blowing snow sublimation losses throughout the winter period.
9. Energy-balance snowmelt module (Marks et al., 1998): this is a version of the SNOBAL model developed to simulate the mass and energy balance of deep mountain snowpacks. This module estimates snowmelt and flow through snow by calculating the energy balance of radiation, sensible heat, latent heat, ground heat, advection from rainfall, and the change in internal energy for snowpack layers consisting of a top active layer and layer underneath it.
10. All-wave radiation module (Granger and Gray, 1990): calculates the net all-wave radiation from short-wave radiation for input to the evaporation module for snow-free conditions.
11. Infiltration module: Gray's parametric snowmelt infiltration algorithm (Zhao and Gray, 1999) estimates snowmelt infiltration into frozen soils; Ayers' infiltration (Ayers, 1959) estimates rainfall infiltration into unfrozen soils based on soil texture and ground cover. Both infiltration algorithms link moisture content to the soil

column in the hillslope module. Surface runoff forms when snowmelt or rainfall exceeds the infiltration rate.

12. Evaporation module: Granger's evaporation expression (Granger and Gray, 1989; Granger and Pomeroy, 1997) estimates actual evapotranspiration from unsaturated surfaces using an energy balance and extension of Penman's equation to unsaturated conditions; Priestley and Taylor evaporation expression (Priestley and Taylor, 1972) estimates evaporation from saturated surfaces such as stream channels. Both evaporation algorithms modify moisture content in the interception store, ponded surface water store and soil column and are restricted by water availability to ensure continuity of mass, and the Priestley and Taylor evaporation also updates moisture content in the stream channel.

13. Hillslope module: this recently developed module is for calculating sub-surface flow and simulating groundwater-surface water interactions using physically-based parameters and principles on hillslopes. This module was revised from an original soil moisture balance routine developed by Leavesley et al. (1983) and modified by Dornes et al. (2008a) and Fang et al. (2010) and now calculates the soil moisture balance, groundwater storage, subsurface and groundwater discharge, depressional storage, and runoff for control volumes of two soil layers, a groundwater layer and surface depressions. A conceptual representation of this module is shown in Fig. 3. In this diagram, the top layer is called the recharge layer, which obtains inputs from infiltration of ponded surface water, snowmelt or sub-canopy rainfall. Evaporation first extracts water from canopy interception and surface storage and then can withdraw moisture via transpiration from only the recharge layer or from both soil column layers depending on rooting characteristics, and is restricted to plant available soil moisture (Armstrong et al., 2010). Evaporation does not withdraw soil moisture until canopy interception and surface water storage are exhausted. Groundwater recharge occurs via percolation from the soil layers or directly from depressional storage via macropores. Subsurface

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



discharge occurs via horizontal drainage from either soil layer; groundwater discharge takes place through horizontal drainage in the groundwater layer. Surface runoff occurs if snowmelt or rainfall inputs exceed subsurface withdrawals from saturated soils or if the rate of snowmelt or rainfall exceeds the infiltration rate.

14. Routing module: the Muskingum method is based on a variable discharge-storage relationship (Chow, 1964) and is used to route runoff between HRUs in the sub-basins. The routing storage constant is estimated from the average distance from the HRU to the main channel and average flow velocity; the average flow velocity is calculated by Manning's equation (Chow, 1959) based on the average HRU distance to the main channel, average change in HRU elevation, overland flow depth and HRU roughness.

3.2 Model parameter estimation

3.2.1 Basin physiographic parameters

A CRHM modelling structure termed the "representative basin" (RB) was used to simulate the hydrological processes for sub-basins in the MCRB. In a RB, a set of physically based modules are assembled with a number of HRUs; the RB can be repeated as necessary for a basin, with each sub-basin possessing the same module configuration but varying parameter sets and varying numbers of HRUs. For the model application, the MCRB was divided into four sub-basins that are represented by four separate RBs (Fig. 4) for which a modelling structure comprising of Muskingum routing was used to route the streamflow output from these RBs along the main channels in the MCRB: Cabin Creek, Middle Creek, Twin Creek, and Marmot Creek. HRUs were decided based on forest cover, aspect, and slope. The forest cover types were derived from the existing basin forest cover maps by the Alberta Forest Service (1963) with recent changes updated from site visits. Figure 1b shows the updated cover types including alpine talus and exposed rock, alpine forest, mixed forest of spruce and lodgepole pine,

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



5 mixed forest of lodgepole pine and aspen, lodgepole pine forest, and forest clearings. A terrain pre-processing GIS analysis using a 2008 LiDAR 8-m DEM (Hopkinson et al., 2012) was employed to extract elevation, aspect, and slope for the basin. The extracted elevation, aspect, and slope were then intersected with the basin forest cover feature
10 in ArcGIS, which generates the HRUs based on elevation, aspect, slope, and forest cover (Fig. 5). For the Cabin Creek sub-basin 12 HRUs were generated, with seven, nine and eight HRUs were extracted for Middle Creek, Twin Creek and Marmot Creek confluence sub-basins, respectively. The area and the averaged values of elevation, aspect, and slope for these HRUs are listed in Table 1.

10 3.2.2 Blowing snow parameters

The values of vegetation density in the alpine talus and forest HRUs were determined by MacDonald et al. (2010) from field observations and used here; the values of the density for the treeline forest HRUs (i.e. alpine larch/spruce) were estimated from site observations during recent field work. Vegetation heights for alpine talus and treeline
15 forest HRUs were measured by MacDonald et al. (2010). Based on these measurements, 3 m was set for the regenerated forest HRU at clearing blocks at Cabin Creek sub-basin, 8 m was set for the circular forest clearing HRUs at Twin Creek sub-basin and a uniform height of 15 m was set for the other forest cover HRUs. These heights are the average values for various forest covers and were determined from many site
20 observations. For the blowing snow fetch distance, 300 m (minimum value) was used for all HRUs in the basin due to the short upwind distance. The blowing snow sequence was decided based on the predominant wind direction in the basin. For Cabin Creek sub-basin, blowing snow initiates from the south-facing alpine talus HRU to the north-facing alpine talus HRU, and snow is redistributed to the north-facing alpine forest HRU and then blown to the south-facing alpine forest HRU where the redistribution of snow
25 ends. For both Middle Creek and Twin Creek sub-basins, snow is transported from the north-facing alpine talus HRU to the south-facing alpine talus HRU, and snow is subsequently redistributed to the south-facing alpine forest HRU, from which snow is blown to

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



the north-facing alpine forest HRU. For other HRUs in the lower elevation part of basin including the mix of spruce, fir, and lodgepole pine HRUs and all HRUs in the Marmot Confluence sub-basin, blowing snow is inconsequential and hence was inhibited in the model.

3.2.3 Forest snow mass- and energy-balance module parameters

Leaf area index (LAI) (–) was quantified based on measurements from hemispheric images by Ellis et al. (2011), from which average values of 2.07 and 1.44 were estimated for spruce and lodgepole pine forest HRUs. A LAI value of 1.1 was given to alpine forest (i.e. larch) and forest clearings HRUs (i.e. regenerated forest), and this value is similar to the reported values for the forest regeneration (Bewley et al., 2010). For the canopy snow interception capacity, 6.6 kg m^{-2} was assigned to lodgepole pine forest HRU; this is value found for similar forest types (Schmidt and Gluns, 1991; Hedstrom and Pomeroy, 1998). A lower value of 3.3 kg m^{-2} was assigned to the young trees in the forest clearing HRU. A higher value of 8.8 kg m^{-2} was calculated for spruce forest, and mixed spruce and lodgepole pine forest HRUs using the method outlined by Ellis et al. (2010). The unloading temperature threshold defines the ice bulb temperature above which intercepted snow starts to unload as either snow or liquid water (i.e. drip). For MCRB, -3°C and 6°C were set as the temperature thresholds determining when canopy snow is unloaded purely as snow and as meltwater, respectively. Values of unloading temperatures were informed by measurements of a weighed suspended tree and sub-canopy lysimeters that collected unloaded snow from the canopy over several seasons (MacDonald, 2010). For the small circular forest clearings at Twin Creek sub-basin, diameter and surrounding tree height for these clearings were set from the reported values by Golding and Swanson (1986).

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



3.2.4 Long-wave radiation module parameter

The terrain view factor parameter was calculated from the sky view factor (i.e. terrain view = 1 – sky view factor). The sky view factor was measured for the alpine environment by DeBeer and Pomeroy (2009) and was quantified for the subalpine forest environment by Essery et al. (2008) using hemispherical digital photographs.

3.2.5 Soil infiltration parameters

To parameterise Gray's parametric infiltration into frozen soils (Zhao and Gray, 1999), initial soil saturation was determined from fall soil moisture measurements, and initial soil temperature was taken from the measured value prior to snowmelt at various hydrometeorological stations in the basin. For the surface saturation, a value of 1 was given due to preferential flow through snowpacks of early meltwater reaching the surface before the start of the main melt period (Marsh and Pomeroy, 1996). Infiltration opportunity time was calculated by the model run using snowmelt rates and snow water equivalent. For the Ayers' infiltration into unfrozen soil (Ayers, 1959), the soil texture parameter was decided by the Marmot Creek soil analysis conducted by Beke (1969), and the surface cover parameter was determined based on the forest cover type from basin and site surveys.

3.2.6 Hillslope module parameters

For the soil layers (i.e. recharge and lower layers), the water storage capacity defines the maximum amount of water that can be stored in the soil layers; this was estimated using soil properties such as depth and porosity reported by Beke (1969). For the soil recharge layer corresponding to the shallow top soil layer, 250 mm (maximum value) was set for all HRUs as the water storage capacity ($\text{soil}_{\text{rechr}_{\text{max}}}$, mm). The soil water storage capacity of the combined recharge and lower layers ($\text{soil}_{\text{moist}_{\text{max}}}$, mm) was estimated as 550 mm and 425 mm, respectively for the alpine HRUs (i.e. rocks/talus and

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



larch forest) and subalpine forest HRUs (i.e. spruce and lodgepole pine), and estimated as 750 mm for all forest HRUs at Marmot confluence sub-basin. No surface depressions are present in the basin, thus the surface depression capacity (sd_{max} , mm) was set to 0 mm. The maximum water storage capacity in the groundwater layer (gw_{max} , mm) was estimated as 500 mm for all HRUs based on previous analysis of the basin hydrogeology (Stevenson, 1967). Values of various water storage capacities are listed in Table 2 and are comparable to, and within the range found in other mountainous environments (Clow et al., 2003; McClymont et al., 2010).

The rates for lateral flow rate in soil layers and groundwater layer (i.e. subsurface and groundwater discharges) as well as vertical flow of excess soil water to groundwater (i.e. groundwater recharge) shown in Fig. 3 are controlled by several drainage factors: $rechr_{ssr_K}$ ($mm\ day^{-1}$), $lower_{ssr_K}$ ($mm\ day^{-1}$), gw_K ($mm\ day^{-1}$) and $soil_{gw_K}$ ($mm\ day^{-1}$). $rechr_{ssr_K}$, $lower_{ssr_K}$ and gw_K are the drainage factors for lateral flows in soil recharge, lower soil, and groundwater layers, respectively; $soil_{gw_K}$ is the drainage factor for the vertical flow from soil to groundwater layer. Previous versions of CRHM had great difficulty in estimating these drainage factors; in the new hillslope module, Darcy's law for unsaturated flow was used to calculate them based on Eq. (1):

$$v = K \left(\frac{\Delta h}{\Delta L} \right) \quad (1)$$

where v ($m\ s^{-1}$) is Darcy's flux (i.e. volume flux per unit area perpendicular to the flow direction), K ($m\ s^{-1}$) is unsaturated hydraulic conductivity of soil, $\Delta h/\Delta L$ (-) is hydraulic gradient in which h (m) is hydraulic head and L (m) is flow path length. The hydraulic head is the sum of pressure head and elevation as in Eq. (2):

$$h = p/\rho g + z \quad (2)$$

where z (m) is elevation and $p/\rho g$ (m) is pressure head in which p ($N\ m^{-2}$) is water pressure, ρ ($kg\ m^{-3}$) is water density and g ($m\ s^{-2}$) is the acceleration of gravity. For the purpose of estimating Darcy's flux in unconfined flow along steep hillslopes in

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



a mountain basin, the pressure head term is assumed to be inconsequential and hence is neglected. Thus, Darcy's flux in the lateral direction can be calculated based on Eq. (3):

$$v = K \left(\frac{\Delta z}{\Delta L} \right) = K \tan(\theta) \quad (3)$$

5 where $\Delta z/\Delta L$ (-) is change of elevation over the flow path length which is approximated by $\tan(\theta)$ where θ (radian) is the ground slope. Consequently, Darcy's flux in the vertical direction can be estimated based on Eq. (4):

$$v = K \left(\frac{\Delta z}{\Delta L} \right) = K \left(\frac{\Delta z}{\Delta z} \right) = K \quad (4)$$

10 In addition, the Brooks and Corey (1964) relationship was used to estimate unsaturated hydraulic conductivity according to Eq. (5):

$$K = K_s S^{(3+2/\lambda)} \quad (5)$$

where K_s ($m s^{-1}$) is the saturated hydraulic conductivity of soil, S (-) is the saturation of soil and λ (-) is the pore size distribution index. This relationship is well tested and there is a large database of information for parameterisation in various environments.

15 The drainage factors needed for CRHM can now be calculated by combining Eqs. (3) to (5):

$$\text{rechr}_{\text{SSR}_K} = cK_{\text{S}_{\text{upper}}} S^{(3+2/\lambda)} \tan(\theta) = cK_{\text{S}_{\text{upper}}} \left(\frac{\text{soil}_{\text{rechr}}}{\text{soil}_{\text{rechr}_{\text{max}}}} \right)^{(3+2/\lambda)} \tan(\theta) \quad (6)$$

$$\text{lower}_{\text{SSR}_K} = cK_{\text{S}_{\text{lower}}} S^{(3+2/\lambda)} \tan(\theta) = cK_{\text{S}_{\text{lower}}} \left(\frac{\text{soil}_{\text{lower}}}{\text{soil}_{\text{lower}_{\text{max}}}} \right)^{(3+2/\lambda)} \tan(\theta) \quad (7)$$

12842

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



$$gw_K = cK_{s_{gw}} S^{(3+2/\lambda)} \tan(\theta) = cK_{s_{gw}} \left(\frac{gw}{gw_{max}} \right)^{(3+2/\lambda)} \tan(\theta) \quad (8)$$

$$soil_{gw_K} = cK_{s_{lower}} S^{(3+2/\lambda)} = cK_{s_{lower}} \left(\frac{soil_{moist}}{soil_{moist_{max}}} \right)^{(3+2/\lambda)} \quad (9)$$

5 where $K_{s_{gw}}$ ($m s^{-1}$), $K_{s_{upper}}$ ($m s^{-1}$) and $K_{s_{lower}}$ ($m s^{-1}$) are the saturated hydraulic conductivities of the groundwater, recharge, and lower of soil layers, respectively. gw (mm), $soil_{rechr}$ (mm) and $soil_{moist}$ (mm) are the storage of water in the groundwater, recharge and entire soil (i.e. recharge and lower layers) layers, respectively; $soil_{lower}$ (mm) is the storage of water in the lower layer and is the difference between $soil_{moist}$ and $soil_{rechr}$ and c (-) is a units conversion factor from $m s^{-1}$ to $mm day^{-1}$ equal to 86.4×10^6 .
 10 The maximum values of the water storage capacity in each layer are described above. Values of various saturated hydraulic conductivities and pore size distribution indexes are shown in Table 2 as determined based upon soil texture (Brooks and Corey, 1966; Clapp and Hornberger, 1978). These values are comparable to the findings for similar soil textures (Wallis et al., 1981; Hendry, 1982; Stankovich and Lockington, 1995; Zhang et al., 2010).
 15

3.2.7 Routing parameters

The surface and channel flow routing sequences established in CHRM for the MCRB are shown in Fig. 4. In each RB, all non-channel HRUs including alpine rock and forest, other subalpine forests, and forest clearings are routed to the valley bottom HRU. The valley bottom HRU represents a deeply incised gully, and the runoff from this HRU is routed along the main channel in each RB. Then the channels flow from Cabin Creek, Middle Creek, and Twin Creek in the upper part of basin to merge into the main stem of Marmot Creek, which subsequently flows out of the basin. Muskingum routing (Chow, 1964) was used for both routing within and between RBs as it is a well-established
 20
 25

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page	
Abstract	Introduction
Conclusions	References
Tables	Figures
⏪	⏩
◀	▶
Back	Close
Full Screen / Esc	
Printer-friendly Version	
Interactive Discussion	



**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

procedure with parameters that can be measured from site visits and DEM extraction. For routing between RBs, the routing length is the total distance of the main channel in each sub-basin as estimated from the terrain pre-processing GIS analysis using a 2008 LiDAR DEM. For routing within RBs, the routing length is the distance from each HRU to the main channel in each sub-basin, which was calculated from the modified Hack's law length-area relationship outlined by Fang et al. (2010). Manning's equation (Chow, 1959) was used to estimate the average flow velocity, which requires parameters: longitudinal channel slope, Manning's roughness coefficient, and hydraulic radius. The longitudinal channel slope of a HRU or a sub-basin was estimated from the average slope of the corresponding HRU or sub-basin, which was derived from the terrain pre-processing GIS analysis using the 2008 LiDAR DEM. Manning's roughness coefficient was assigned based on surface cover and channel condition using a Manning's roughness lookup table (Mays, 2001). The hydraulic radius was determined from the lookup table using channel shape and depth of channel as criteria; channel shape was set as parabolic as determined from field observation, and channel depth was measured in the field. The flow travel time was calculated from the routing length and average flow velocity. The dimensionless weighting factor controls the level of attenuation, ranging from 0 (maximum attenuation) to 0.5 (no attenuation), and can be determined by a number of techniques (Wu et al., 1985; Kshirsagar et al., 1995). However, information for approximating this parameter is lacking, so a medium value of 0.25 was assigned for the basin.

4 Evaluations for model simulations

Model simulations of snow accumulation, springtime snowmelt, soil moisture, streamflow, and groundwater storage were conducted in the MCRB for six hydrological years (i.e. 1 October to 30 September) from 2005 to 2011 for which good measurements to run and evaluate the model existed. The simulated hydrological variables were evaluated against available observations of snow accumulation, snowmelt, soil moisture,

streamflow, and groundwater level. To assess the performance of model, five statistical indexes: root mean square difference (RMSD), normalized RMSD (NRMSD), model bias (MB), Nash-Sutcliffe efficiency (NSE) (Nash and Sutcliffe, 1970), and Pearson product-moment correlation coefficient (r) were calculated as:

$$5 \quad \text{RMSD} = \sqrt{\frac{1}{n} \sum (X_s - X_o)^2} \quad (10)$$

$$\text{NRMSD} = \frac{\text{RMSD}}{\bar{X}_o} \quad (11)$$

$$\text{MB} = \frac{\sum X_s}{\sum X_o} - 1 \quad (12)$$

$$\text{NSE} = 1 - \frac{\sum (X_o - X_s)^2}{\sum (X_o - \bar{X}_o)^2} \quad (13)$$

$$10 \quad r = \frac{\sum (X_o - \bar{X}_o)(X_s - \bar{X}_s)}{\sqrt{\sum (X_o - \bar{X}_o)^2 \sum (X_s - \bar{X}_s)^2}} \quad (14)$$

where n is number of samples, and X_o , X_s , \bar{X}_o and \bar{X}_s are the observed, simulated, mean of the observed and mean of simulated values, respectively. The RMSD is a weighted measure of the difference between observation and simulation and has the same units as the observed and simulated values, while NRMSD is the RMSD normalized against the mean of the observed values. The MB indicates the ability of model to reproduce the measured variable; a positive value or a negative value of MB implies model overprediction or underprediction, respectively. The NSE is a measure for model efficiency to reproduce the time evolution of hydrological variables and is particularly appropriate for evaluating streamflow hydrograph prediction (Nash and Sutcliffe, 1970). A NSE value equal to 1 indicates perfect model predictions with respect to observations; a value equal to 0 implies that estimated values are not different from the

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



average of observed values. Thus, any positive value of NSE suggests that model has some predictive power with higher values indicating progressively better model performance. The Pearson coefficient r ranges from -1 to 1 and measures the correlation between two variables, with positive and negative values indicating that two variables are positively and negatively correlated, respectively.

4.1 Snow accumulation and snowmelt evaluation

Predictions of snow accumulation (SWE) for specific HRUs were compared to corresponding SWE determinations from extensive surveys of snow depth and density of same HRUs in the MCRB. Model evaluations were conducted at subalpine mature spruce forest and clearings sites (i.e. Upper Forest and Upper Clearing) as well as at alpine larch forest, ridge top, and north and south facing slopes near Fisera Ridge for the pre-melt accumulation and ablation periods during 2007–2011. Figure 6 shows the observed and predicted SWE over the snow courses at the relatively sheltered Upper Forest and Upper Clearing sites, while Fig. 7 illustrates the observations and simulations of SWE at various locations at the windblown Fisera Ridge site. The results demonstrate that model predictions were in close agreement with the observations and the SWE regime simulated by model generally matched the observed one in both subalpine and alpine environments. Exceptions were found for south-facing slope and larch forest HRUs during the season of 2009/2010 (Fig. 7c, d and e) where overestimations of SWE were notable. This may have been due to exceptional wind directions or flow separation causing a different blowing snow regime from the constant redistribution sequence and flow direction parameterised in the model.

Table 3 shows the RMSD for SWE predictions over four snow seasons during 2007–2011, which were 19.4 and 41.2 mm for the mature spruce forest and forest clearings HRUs, respectively. These relatively small values of RMSD for the subalpine needle-leaf forest indicate that model was able to simulate the major snow hydrological processes (e.g. forest snow interception and sublimation, extinction of short-wave and enhanced long-wave radiation under-canopy, and other energetics for snowmelt) that

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



site for the non-frozen period as reported by CS616 soil water content probes at the site. The seasonal soil moisture was reasonably well simulated although there were overestimations for the summer months that may have been due to the measurement depth being above much of the model layer depth. These favourable results suggest that the model has some capability of simulating the many hydrological processes (e.g. infiltration of both snowmelt and rainfall, evapotranspiration, drainage) controlling soil moisture fluctuation in the lodgepole forest environments at Marmot Creek. Table 4 shows the calculated RMSD for the simulated seasonal daily volumetric soil moisture in each season during 2006–2011. RMSD values ranged from 0.025 to 0.055 for the simulations at the Level Forest site, suggesting that on average, the difference between the observed and simulated volumetric soil moisture was between 2.5 % to 5.5 % volumetric water content. However, the NRMSD ranged only from 0.17 to 0.39, which indicates that RMSD is relatively small, being equal to 17 % to 39 % of seasonal mean observed volumetric soil moisture. The MB ranged from 0.07 to 0.34, implying that model tended to overpredict the seasonal soil moisture but overestimations were less than 34 % and are likely due to the soil moisture probes measuring only a shallow soil layer above the simulated soil layers.

4.3 Groundwater evaluation

Simulated groundwater storage was assessed by comparing to the observed groundwater level at two groundwater wells (i.e. GW 305 and GW 386) that were available from Alberta Environment over 13 December 2005–21 July 2010. The hourly groundwater storage was estimated for the groundwater water layer located around these two wells and was compared to the observed hourly groundwater level fluctuation (Fig. 9). The figure demonstrates that the seasonal pattern (i.e. increase and decrease) in groundwater storage somewhat followed the pattern (i.e. rise and decline) of groundwater level except for the seasons of 2006 and 2009, while the seasonal peak in groundwater storage slightly fell behind the seasonal peak in groundwater level hydrograph. Pearson product-moment correlation coefficient of 0.12 and 0.17 were calculated for

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



the correlations between groundwater storage and level for GW305 and GW386 during 13 December 2005–21 July 2010, respectively. These low positive correlation coefficient values indicate a positive but weak correlation between the groundwater storage and well level. The low values are attributed to delayed simulated groundwater storage corresponding to groundwater level in three seasons (i.e. 2007, 2008 and 2010) and pattern of simulated groundwater storage mismatching the groundwater level in two seasons (i.e. 2006 and 2009). The simplified groundwater routing module in CRHM clearly does not have the capability of accurately simulating complex groundwater interactions, but does show some aspects seasonal recharge and drawdown.

4.4 Streamflow evaluation

Streamflow simulations conducted for the sub-basins of Cabin Creek, Middle Creek and Twin Creek were compared to the observations made at the outlets of three sub-basins, which usually extended from May to September during the years of 2007–2011. These simulations provide information on the results of all surface and sub-surface hydrological processes at sub-basin scales. Streamflow simulations for the entire basin were evaluated using Water Survey of Canada observations at the Marmot Creek outlet, from 1 May to 30 September during 2006–2011. Figure 10 shows the comparisons of observed and predicted daily streamflow discharge for Cabin Creek, Middle Creek, Twin Creek, and Marmot Creek. Simulations of the daily discharge for the upper three sub-basins over the five-season period (i.e. 2007–2011) generally matched the magnitude of the observed, with a few unexplained spikes in the simulated daily hydrographs. The simulated peak discharges for the upper three sub-basins were greater than the observed ones. The timing of peak discharge was better simulated in 2007 and 2010 for all sub-basins, and 2009 for Cabin and Middle Creeks compared to the poorer results in 2008 and 2011 for all sub-basins, and 2009 for Twin Creek (Fig. 10a–c). Table 5 lists the calculated NSE of -0.26 , -0.76 , and -0.03 for the simulated discharge at Cabin Creek, Middle Creek, and Twin Creek over the five-season period, respectively. This suggests that the model was unable to adequately reproduce the time-series evolution

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



of discharge from these sub-basins. Nevertheless, on average, difference between the daily simulated and observed discharge was relatively small for these sub-basins, with RMSD ranging from 0.048 to 0.13 m³s⁻¹ shown in Table 5, and NRMSD ranged from 0.99 to 1.06. The MB listed in Table 5 over the five-season period for these sub-basins ranged from -0.24 to 0.23, indicating that the predicted total discharge from the five seasons varied from 24 % underestimation for Twin Creek sub-basin to 23 % overestimation for Cabin Creek sub-basin and therefore was not consistently over or underestimated.

The model performed much better in predicting streamflow discharge for the Marmot Creek basin outlet compared to the simulations of streamflow discharge for the sub-basins. Figure 10d illustrates that the simulated daily discharge hydrograph over the six-year period (i.e. 2006–2011) was quite comparable to the observed, with fewer spikes and closer estimations of magnitude and timing of peak discharge than simulations for the sub-basins. Table 5 shows a NSE equal to 0.31 for simulated discharge at the Marmot Creek basin outlet over the six-season period, indicating that the model was generally capable of reproducing the temporal evolution of daily discharge for entire basin in this period. In addition, Table 5 demonstrates that RMSD and MB were 0.1888 m³s⁻¹ and 0.06, respectively, for the simulation of daily discharge at Marmot Creek basin over the six-year period. This means on average, the difference between the observation and simulation of Marmot Creek basin daily discharge was quite small, with only a 6 % overestimation for the cumulative discharge in this period. The improvement in prediction for Marmot Creek compared to its sub-basins is likely due to the spatial implementation of the model with 36 HRUs for Marmot Creek but 12 or less HRUs for any individual sub-basin.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



5 Discussion and conclusions

A physically based hydrological model was set up in the CRHM platform for the Marmot Creek Research Basin, a headwater basin in the Canadian Rocky Mountains, based on the current understanding of the hydrological cycle in this basin. No calibration from streamflow was used in setting any parameters in the model, but the results of extensive scientific investigations of basin snow and hydrology were used where available and applicable. Various hydrological cycle components were simulated and evaluated against the corresponding observations. Evaluations of snow accumulation and snowmelt revealed that model performed fairly well in the subalpine forest environments. This verifies that the major snow-related hydrological processes (e.g. snow interception, sublimation and unloading, short-wave extinction and long-wave enhancement) were well represented in the recently added and modified modules of forest snow mass- and energy-balance (Ellis et al., 2010), long-wave radiation (Sicart et al., 2006; Pomeroy et al., 2009), and energy-budget snowmelt (Marks et al., 1998). The predictions of snow accumulation and snowmelt also generally compared well with the large range of field observations on different aspects and landcovers (i.e. north-facing and south-facing slopes, ridge top, and forests) in the alpine and treeline environments. Large model overestimations in the season of 2009/2010 for the south-facing slope and larch forest sites suggest that the simplified flow parameterisation might not be adequate under certain conditions in the alpine environment. The redistribution of snow from the north-facing slope to the south-facing slope and then to the larch forest was overestimated during the season of 2009/2010. This is possibly due to unanticipated flow separation and transport of blowing snow into the atmosphere or due to varying wind flow directions during transport that would have caused deviation from the redistribution parameterisation in this PBSM implementation.

Soil moisture evaluations showed the predicted seasonal pattern in soil moisture fluctuation matched observations quite well at the lodgepole pine site. This confirms that model's snowmelt infiltration into frozen soils (Zhao and Gray, 1999), rainfall

HESSD

9, 12825–12877, 2012

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

infiltration (Ayers, 1959), canopy interception (Ellis et al., 2010) and evaporation algorithms (Priestley and Taylor, 1972; Granger and Gray, 1989) were able to simulate the water dynamics and storage in the top soil layer for the lodgepole pine forest. Differences in mean values of soil moisture are likely due to observation depths being shallower than modelling depths.

Results showed a weak positive correlation between the simulated groundwater storage and groundwater level fluctuation. Groundwater storage was predicted with the newly developed mountain hillslope module described in Sect. 3.2.6, in which storage capacity and drainage factor for lateral discharge in groundwater layer as well as the drainage factor for recharge (i.e. percolation) from overlaid soil layer were modelled. This is based on a relatively simple conceptualisation of groundwater system and groundwater-surface water interactions and might not be sufficiently detailed to simulate groundwater dynamics in Marmot Creek. Successful groundwater simulations in mountain basins generally require finite difference sub-surface flow models (e.g. Freeze and Harlan, 1969) and there was insufficient information to parameterise such a model in Marmot Creek at this time. Further research such as tracer experiment methods (Clow et al., 2003) or geophysical investigations such as that conducted by McClymont et al. (2010) and Langston et al. (2011) is warranted to improve the understanding of the groundwater system in Marmot Creek.

Simulations of streamflow discharge were generally in close agreement with the observed seasonal variations at all scales, while the simulated hydrographs were well simulated at the basin scale and less-well simulated for sub-basins. The improvement in streamflow regime prediction with increasing scale is due to the model complexity being designed for basin scale streamflow prediction, rather than sub-basin prediction. Alternatively, if the objective had been prediction of a particular sub-basin then more HRU and site specific selection of routing parameters would be expected to improve model performance. DeBeer (2012) demonstrated this in a series of snowmelt-driven streamflow simulations of Upper Middle Creek using CRHM with a more spatially complex model structure. It should be noted that no calibrations against streamflow were

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



conducted for the parameters in the Muskingum routing and newly developed mountain hillslope modules. The parameters of routing length, channel slope, Manning's roughness coefficient, hydraulic radius, soil saturated hydraulic conductivity, and pore size distribution index were determined based on GIS terrain analysis and lookup table values from surface and channel conditions and soil texture class. The flashy appearance of simulated hydrographs for the sub-basins could likely be reduced by introducing calibrated small-scale routing parameters such as subsurface runoff storage constant, but reliance on such "curve-fitting" is method not in the scope and objective of this paper. The scientific basis to set small-scale hillslope runoff routing parameters is not sufficiently well understood in Marmot Creek Research Basin.

This study has demonstrated an interesting and beneficial relationship between model development, field process studies and a developing understanding of basin hydrology that can be a useful model for how to predict where streamflow measurements are not available. A hydrological model was constructed and applied based on improved basin hydrological understanding from several years of extensive site observations and process study. This improved understanding was used to develop and to parameterise the model, which was then tested against multiple types of observations that reflect differing hydrological cycle components of snow accumulation and melt, soil moisture, groundwater storage and streamflow at various scales. Because the model is designed to predict the basin hydrological cycle rather than simply streamflow generation, it performed well in the multi-objective evaluation. By selecting model parameters based on GIS terrain analysis, land cover, soil and geological surveys, field measurements, and lookup tables, the model required no calibration from streamflow. This achieved one of the main objectives of the International Association of Hydrological Sciences Decade on Prediction in Ungauged Basins (PUB): prediction based on improved understanding (Sivapalan et al., 2003). This worked well in Marmot Creek which is one of the most well understood basins in the Canadian Rocky Mountains and where basin parameters had relatively small uncertainty. However, this strategy can also contribute to guiding PUB approaches for modelling ungauged basins where

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

basin information is less detailed. The model processes and physics appear to have simulated the hydrological cycle well and showed better prediction at the largest scale of evaluation. Given the global commonality of many cold regions hydrological processes (Gelfan et al., 2004) and the capability of transferring physically based parameters 1000s of km (Dornes et al., 2008b), the parameters determined from scientific investigations at Marmot Creek can likely be applied to ungauged basins where there is little information beyond meteorology, landcover and elevation. As atmospheric models, digital elevation models and satellite imagery provide improved and finer scale information every decade, there is little doubt that with the appropriate driving meteorology and physically realistic land surface parameters that prediction of ungauged cold region mountain basins can be accomplished for the right scientific reasons and with adequate predictive ability. The inaccuracies of the model for groundwater regime, for streamflow at small sub-basin scales and for snow accumulation in certain treeline environments were also instructive and set the agenda for the next phase of research.

Acknowledgement. The authors would like to gratefully acknowledge the funding assistance provided through the Alberta Department of Sustainable Resource Development, the IP3 Cold Regions Hydrology Network funded by the Canadian Foundation for Climate and Atmospheric Sciences, the Natural Sciences and Engineering Research Council of Canada through Discovery Grants, Research Tools and Instrument Grants and Alexander Graham Bell Scholarships, and the Canada Research Chairs programme. Logistical assistance was received from the Biogeoscience Institute, University of Calgary and the Nakiska Ski Area and is greatly appreciated. Field work by many graduate students in and visitors to the Centre for Hydrology and research officers Michael Solohub and May Guan was essential in data collection. The authors also acknowledge Chris Hopkinson for his work on collecting and creating the LiDAR DEM for Marmot Creek. This paper is a contribution to the IAHS Decade for Prediction in Ungauged Basins (PUB).

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

References

Alberta Forest Service: Marmot Creek Watershed Research Basin: Forest Cover Type Map, Information and Technical Services Division, Graphics Section, Department of Forestry of Canada, Ottawa, Ontario, 1963.

5 Armstrong, R. N., Pomeroy, J. W., and Martz, L. W.: Estimating evaporation in a Prairie landscape under drought conditions, *Can. Water Resour. J.*, 35, 173–186, 2010.

Aukema, B. H., Carroll, A. L., Zheng, Y., Zhu, J., Raffa, K. F., Moore, R. D., Stahl, K., and Taylor, S. W.: Movement of outbreak populations of mountain pine beetle: influence of spatiotemporal patterns and climate, *Ecography*, 31, 348–358, doi:10.1111/j.0906-7590.2007.05453.x, 10 2008.

Ayers, H. D.: Influence of soil profile and vegetation characteristics on net rainfall supply to runoff, in: *Proceedings of Hydrology Symposium No.1: Spillway Design Floods*, National Research Council Canada, Ottawa, 198–205, 1959.

15 Beke, G. J.: Soils of three experimental watersheds in Alberta and their hydrological significance, Ph.D. thesis, Department of Soil Science, University of Alberta, Edmonton, Alberta, Canada, 456 pp., 1969.

Bernhardt, M., Zängl, G., Liston, G. E., Strasser, U., and Mauser, W.: Using wind fields from a high-resolution atmospheric model for simulating snow dynamics in mountainous terrain, *Hydrol. Process.*, 23, 1064–1075, doi:10.1002/hyp.7208, 2009.

20 Beven, K. and Freer, J.: Equifinality, data assimilation, and uncertainty estimation in mechanistic modelling of complex environmental systems using the GLUE methodology, *J. Hydrol.*, 249, 11–29, 2001.

Bewley, D., Alila, Y., and Varhola, A.: Variability of snow water equivalent and snow energetics across a large catchment subject to Mountain Pine Beetle infestation and rapid salvage logging, *J. Hydrol.*, 388, 464–479, doi:10.1016/j.jhydrol.2010.05.031, 2010.

25 Boon, S.: Snow ablation energy balance in a dead forest stand, *Hydrol. Process.*, 23, 2600–2610, doi:10.1002/hyp.7246, 2009.

Bowling, L. C., Pomeroy, J. W., and Lettenmaier, D. P.: Parameterisation of the sublimation of blowing snow in a macroscale hydrology model, *J. Hydrometeorol.*, 5, 745–762, 2004.

30 Brooks, R. H. and Corey, A. T.: Hydraulic properties of porous media, *Hydrology Paper 3*, Colorado State University, Fort Collins, CO., 27 pp., 1964.

HESSD

9, 12825–12877, 2012

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

[Title Page](#)
[Abstract](#)
[Introduction](#)
[Conclusions](#)
[References](#)
[Tables](#)
[Figures](#)
[Back](#)
[Close](#)
[Full Screen / Esc](#)
[Printer-friendly Version](#)
[Interactive Discussion](#)


- Brooks, R. H. and Corey, A. T.: Properties of porous media affecting fluid flow, *J. Irrig. Drain. Div. Am. Soc. Civ. Eng.*, 92, 61–88, 1966.
- Brown, R. D. and Robinson, D. A.: Northern Hemisphere spring snow cover variability and change over 1922–2010 including an assessment of uncertainty, *The Cryosphere*, 5, 219–229, doi:10.5194/tc-5-219-2011, 2011.
- Burles, K. and Boon, S.: Snowmelt energy balance in a burned forest plot, Crowsnest Pass, Alberta, Canada, *Hydrol. Process.*, 25, 3012–3029, doi:10.1002/hyp.8067, 2011.
- Chow, V. T.: *Open Channel Hydraulics*, McGraw-Hill, Inc., New York, 1959.
- Chow, V. T.: *Handbook of Applied Hydrology*, McGraw-Hill, Inc., New York, 1964.
- Clapp, R. B. and Hornberger, G. M.: Empirical equations for some soil hydraulic properties, *Water Resour. Res.*, 14, 601–604, 1978.
- Clow, D. W., Schrott, L., Webb, R., Campbell, D. H., Torizzo, A., and Dorblaser, M.: Ground water occurrence and contributions to streamflow in an alpine catchment, Colorado Front range, *Ground Water*, 41, 937–950, 2003.
- DeBeer, C. M.: Simulating areal snowcover depletion and snowmelt runoff in alpine terrain, PhD thesis, Department of Geography and Planning, University of Saskatchewan, Saskatoon, Saskatchewan, Canada, 251 pp., 2012.
- DeBeer, C. M. and Pomeroy, J. W.: Modelling snow melt and snowcover depletion in a small alpine cirque, Canadian Rocky Mountains, *Hydrol. Process.*, 23, 2584–2599, doi:10.1002/hyp.7346, 2009.
- DeBeer, C. M. and Pomeroy, J. W.: Simulation of the snowmelt runoff contributing area in a small alpine basin, *Hydrol. Earth Syst. Sci.*, 14, 1205–1219, doi:10.5194/hess-14-1205-2010, 2010.
- Doorschot, J., Raderschall, N., and Lehning, M.: Measurements and one-dimensional model calculations of snow transport over a mountain ridge, *Ann. Glaciol.*, 32, 153–158, 2001.
- Dornes, P. F., Pomeroy, J. W., Pietroniro, A., Carey, S. K., and Quinton, W. L.: Influence of landscape aggregation in modelling snow-cover ablation and snowmelt runoff in a sub-arctic mountainous environment, *Hydrolog. Sci. J.*, 53, 725–740, 2008a.
- Dornes, P. F., Tolson, B. A., Davison, B., Pietroniro, A., Pomeroy, J. W., and Marsh, P.: Regionalisation of land surface hydrological model parameters in subarctic and arctic environments, *Phys. Chem. Earth*, 33, 1081–1089, doi:10.1016/j.pce.2008.07.007, 2008b.
- Ellis, C. R. and Pomeroy, J. W.: Estimating sub-canopy shortwave irradiance to melting snow on forested slopes, *Hydrol. Process.*, 21, 2581–2593, doi:10.1002/hyp.6794, 2007.

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

- Ellis, C. R., Pomeroy, J. W., Brown, T., and MacDonald, J.: Simulation of snow accumulation and melt in needleleaf forest environments, *Hydrol. Earth Syst. Sci.*, 14, 925–940, doi:10.5194/hess-14-925-2010, 2010.
- 5 Ellis, C. R., Pomeroy, J. W., Essery, R. L. H., and Link, T. E.: Effects of needleleaf forest cover on radiation and snowmelt dynamics in the Canadian Rocky Mountains, *Can. J. Forest Res.*, 41, 608–620, doi:10.1139/X10-227, 2011.
- Ellis, C. R., Pomeroy, J. W., and Link, T. E.: Modeling increases in snowmelt yield and desynchronization resulting from forest gap thinning treatments in a northern mountain catchment, *Water Resour. Res.*, accepted, 2012.
- 10 Essery, R., Pomeroy, J., Ellis, C., and Link, T.: Modelling longwave radiation to snow beneath forest canopies using hemispherical photography or linear regression, *Hydrol. Process.*, 22, 2788–2800, doi:10.1002/hyp.6930, 2008.
- Fang, X., Pomeroy, J. W., Westbrook, C. J., Guo, X., Minke, A. G., and Brown, T.: Prediction of snowmelt derived streamflow in a wetland dominated prairie basin, *Hydrol. Earth Syst. Sci.*, 14, 991–1006, doi:10.5194/hess-14-991-2010, 2010.
- 15 Fauria, M. M. and Johnson, E. A.: Large-scale climatic patterns control large lightning fire occurrence in Canada and Alaska forest regions, *J. Geophys. Res.*, 111, G04008, doi:10.1029/2006JG000181, 2006.
- Föhn, P. M. B. and Meister, R.: Distribution of snow drifts on ridge slopes, *Ann. Glaciol.*, 4, 52–57, 1983.
- 20 Freeze, R. A. and Harlan, R. L.: Blueprint for a physically-based, digitally-simulated hydrologic response model, *J. Hydrol.*, 9, 237–258, 1969.
- Garnier, B. J. and Ohmura, A.: The evaluation of surface variations in solar radiation income, *Sol. Energy*, 13, 21–34, 1970.
- 25 Gelfan, A., Pomeroy, J. W., and Kuchment, L.: Modelling forest-cover influences on snow accumulation, sublimation and melt, *J. Hydrometeorol.*, 5, 785–803, 2004.
- Golding, D. L. and Swanson, R. H.: Snow distribution patterns in clearings and adjacent forest, *Water Resour. Res.*, 22, 1931–1940, 1986.
- Granger, R. J. and Gray, D. M.: Evaporation from natural non-saturated surfaces, *J. Hydrol.*, 111, 21–29, 1989.
- 30 Granger, R. J. and Gray, D. M.: A new radiation model for calculating daily snowmelt in open environments, *Nord. Hydrol.*, 21, 217–234, 1990.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



- Granger, R. J. and Pomeroy, J. W.: Sustainability of the western Canadian boreal forest under changing hydrological conditions – 2. Summer energy and water use, in: Sustainability of Water Resources under Increasing Uncertainty, edited by: Rosjberg, D., Boutayeb, N., Gustard, A., Kundzewicz, Z., and Rasmussen, P., IAHS Publication No. 240, IAHS Press, Wallingford, UK, 243–250, 1997.
- Gray, D. M. and Male, D. H. (Eds.): Handbook of Snow: Principles, Processes, Management and Use, Pergamon Press, Toronto, Canada, 776 pp., 1981.
- Harding, R. J. and Pomeroy, J. W.: The energy balance of the winter boreal landscape, *J. Climate*, 9, 2778–2787, 1996.
- Hedstrom, N. R. and Pomeroy, J. W.: Measurements and modelling of snow interception in the boreal forest, *Hydrol. Process.*, 12, 1611–1625, 1998.
- Hendry, M. J.: Hydraulic conductivity of a glacial till in Alberta, *Ground Water*, 20, 162–169, 1982.
- Hopkinson, C., Pomeroy, J. W., DeBeer, C., Ellis, C., and Anderson, A.: Relationships between snowpack depth and primary LiDAR point cloud derivatives in a mountainous environment, *Remote Sensing and Hydrology 2010*, IAHS Publ. 352, 2012.
- Jeffrey, W. W.: Experimental watersheds in the Rocky Mountains, Alberta, Canada, in: Symposium of Budapest (Proceedings of the Symposium on Representative and Experimental Areas), Budapest, Hungary, 28 September–5 October 1965, 502–521, 1965.
- Kirby, C. L. and Ogilvy, R. T.: The forest of Marmot Creek watershed research basin, Canadian Department of Fisheries and Forestry, Ottawa, Ontario, Canadian Forestry Service Publication No. 1259, 37 pp., 1969.
- Kshirsagar, M. M., Rajagopalan, B., and Lall, U.: Optimal parameter estimation for Muskingum routing with ungauged lateral inflow, *J. Hydrol.*, 169, 25–35, 1995.
- Langston, G., Bentley, L. R., Hayashi, M., McClymont, A., and Pidlisceky, A.: Internal structure and hydrological functions of an alpine proglacial moraine, *Hydrol. Process.*, 25, 2967–2982, doi:10.1002/hyp.8144, 2011.
- Lapp, S., Byrne, J., Townshend, I., and Kienzie, S.: Climate warming impacts on snowpack accumulation in an alpine watershed, *Int. J. Climatol.*, 25, 521–536, 2005.
- Leavesley, G. H., Lichty, R. W., Troutman, B. M., and Saindon, L. G.: Precipitation-runoff modelling system: user's manual, Water-Resources Investigations Report 83-4238, US Geological Survey, Reston, Virginia, 1983.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



- Link, T. E., Marks, D., and Hardy, J. P.: A deterministic method to characterize canopy radiative transfer properties, *Hydrol. Process.*, 18, 3583–3594, doi:10.1002/hyp.5793, 2004.
- Lundberg, A. and Halldin, S.: Evaporation of intercepted snow, analysis of governing factors, *Water Resour. Res.*, 30, 2587–2598, 1994.
- 5 MacDonal, J.: Unloading of intercepted snow in conifer forests, M.Sc. thesis, Department of Geography and Planning, University of Saskatchewan, Saskatoon, Saskatchewan, Canada, 93 pp., 2010.
- MacDonal, J. and Pomeroy, J. W.: Gauge undercatch of two common snowfall gauges in a prairie environment, in: *Proceedings of the 64th Eastern Snow Conference*, St. John's, Newfoundland, Canada, 29 May-1 June, 2007, 119–126, 2007.
- 10 MacDonal, M. K., Pomeroy, J. W., and Pietroniro, A.: On the importance of sublimation to an alpine snow mass balance in the Canadian Rocky Mountains, *Hydrol. Earth Syst. Sci.*, 14, 1401–1415, doi:10.5194/hess-14-1401-2010, 2010.
- MacDonal, R. J., Byrne, J. M., Kienzle, S. W., and Larson, R. P.: Assessing the potential impacts of climate change on mountain snowpacks in the St. Mary River watershed, Montana, *J. Hydrometeorol.*, 12, 262–273, doi:10.1175/2010JHM1294.1, 2011.
- 15 Mannix, A. E., Dridi, C., and Adamowicz, W. L.: Water availability in the oil sands under projections of increasing demands and a changing climate: an assessment of Lower Athabasca water management framework (phase 1), *Can. Water Resour. J.*, 35, 29–52, 2010.
- 20 Marks, D., Kimball, J., Tingey, D., and Link, T.: The sensitivity of snowmelt processes to climate conditions and forest cover during rain-on-snow: a case study of the 1996 Pacific Northwest flood, *Hydrol. Process.*, 12, 1569–1587, 1998.
- Marks, D., Domingo, J., Susong, D., Link, T., and Garen, D.: A spatially distributed energy balance snowmelt model for application in mountain basins, *Hydrol. Process.*, 13, 1935–1959, 1999.
- 25 Marks, D., Winstral, A., Reba, M., Pomeroy, J., and Kumar, M.: An evaluation of methods for determining during-storm precipitation phase and the rain/snow transition elevation at the surface in a mountain basin, *Adv. Water Resour.*, in press, 2012.
- Marsh, C. B., Pomeroy, J. W., and Spiteri, R. J.: Implications of mountain shading on calculating energy for snowmelt using unstructured triangular meshes, *Hydrol. Process.*, 26, 1767–1778, doi:10.1002/hyp.9329, 2012.
- 30 Marsh, P. and Pomeroy, J. W.: Meltwater fluxes at an arctic forest-tundra site, *Hydrol. Process.*, 10, 1383–1400, 1996.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Reba, M. L., Pomeroy, J., Marks, D., and Link, T. E.: Estimating surface sublimation losses from snowpacks in a mountain catchment using eddy covariance and turbulent transfer calculations, *Hydrol. Process.*, online first: doi:10.1002/hyp.8372, 2012.

Rex, J. and Dubé, S.: Predicting the risk of wet ground areas in the Vanderhoof Forest District: project description and progress report, *BC J. Ecosyst. Manage.*, 7, 57–71, 2006.

Rutter, N., Essery, R., Pomeroy, J., Altimir, N., Andreadis, K., Baker, I., Barr, A., Bartlett, P., Boone, A., Deng, H., Douville, H., Dutra, E., Elder, K., Ellis, C., Feng, X., Gelfan, A., Goodbody, A., Gusev, Y., Gustafsson, D., Hellström, R., Hirabayashi, Y., Hirota, T., Jonas, T., Koren, V., Kuragina, A., Lettenmaier, D., Li, W-P, Martin, E., Nasanova, O., Pumpanen, J., Pyles, R., Samuelsson, P., Sandells, M., Schadler, G., Shmakin, A., Smirnova, T., Stahli, M., Stockli, R., Strasser, U., Su, H., Suzuki, K., Takata, K., Tanaka, K., Thompson, E., Vesala, T., Viterbo, P., Wiltshire, A., Xia, K., Xue, Y., and Yamazaki, T.: Evaluation of forest snow process models (SnowMip2), *J. Geophys. Res.*, 114, D06111, doi:10.1029/2008JD011063, 2009.

Schmidt, R. A. and Gluns, D. R.: Snowfall interception on branches of three conifer species, *Can. J. Forest Res.*, 21, 1262–1269, 1991.

Sicart, J. E., Pomeroy, J. W., Essery, R. L. H., Hardy, J., Link, T., and Marks, D.: A sensitivity study of daytime net radiation during snowmelt to forest canopy and atmospheric conditions, *J. Hydrometeorol.*, 5, 774–784, 2004.

Sicart, J. E., Pomeroy, J. W., Essery, R. L. H., and Bewley, D.: Incoming longwave radiation to melting snow: observations, sensitivity and estimation in northern environments, *Hydrol. Process.*, 20, 3697–3708, doi:10.1002/hyp.6383, 2006.

Sivapalan, M., Takeuchi, K., Franks, S. W., Gupta, V. K., Karambiri, H., Lakshmi, V., Liang, X., McDonnell, J. J., Mendiondo, E. M., O’Connell, P. E., Oki, T., Pomeroy, J. W., Schertzer, D., Uhlenbrook, S., and Zehe, E.: IAHS Decade on Predictions in Ungauged Basins (PUB), 2003–2012: Shaping an exciting future for the hydrological sciences, *Hydrolog. Sci. J.*, 48, 857–880, 2003.

Stankovich, J. M. and Lockington, D. A.: Brooks-Corey and van Genuchten soil-water-retention models, *J. Irrig. Drain. Eng.-ASCE*, 121, 1–7, 1995.

Stevenson, D. R.: Geological and groundwater investigations in the Marmot Creek experimental basin of southwestern Alberta, Canada, M. Sc. Thesis, Department of Geology, University of Alberta, Edmonton, Alberta, 106 pp., 1967.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



- Stewart, I. T., Cayan D. R., and Dettinger, M. D.: Changes in snowmelt runoff timing in western North America under a 'business as usual' climate change scenario, *Climatic Change*, 62, 217–232, 2004.
- St. Jacques, J.-M., Sauchyn, D. J., and Zhao, Y.: Northern Rocky Mountain streamflow records: Global warming trends, human impacts or natural variability?, *Geophys. Res. Lett.*, 37, L06407, doi:10.1029/2009GL042045, 2010.
- Storr, D.: Precipitation variations in a small forested watershed, in: Proceedings of the 35th Western Snow Conference, Boise, Idaho, United States, 18–20 April 1967, 11–17, 1967.
- Swanson, R. H.: Forest hydrology issues for the 21st century: a consultant's viewpoint, *J. Am. Water Resour. As.*, 34, 755–763, 1998.
- Varhola, A., Coops, N. C., Weiler, M., and Moore, R. D.: Forest canopy effects on snow accumulation and ablation: An integrative review of empirical results, *J. Hydrol.*, 392, 219–233, doi:10.1016/j.jhydrol.2010.08.009, 2010.
- Verseghy, D. L.: CLASS-A Canadian land surface scheme for GCMs. I. soil model, *Int. J. Climatol.*, 11, 111–133, 1991.
- Wallis, P. M., Hynes, H. B. N., and Talang, S. A.: The importance of groundwater in the transportation of allochthonous dissolved organic matter to the streams draining a small mountain basin, *Hydrobiologia*, 79, 77–90, 1981.
- Whitaker, A., Alila, Y., Beckers, J., and Toews, D.: Evaluating peak flow sensitivity to clear-cutting in different elevation bands of a snowmelt-dominated mountainous catchment, *Water Resour. Res.*, 38, 1172, doi:10.1029/2001WR000514, 2002.
- Woods, A., Coates, K. D., and Hamann, A.: Is an unprecedented dothistroma needle blight epidemic related to climate change?, *BioScience*, 55, 761–769, 2005.
- Wu, J. S., King, E. L., and Wang, M.: Optimal identification of Muskingum routing coefficients, *Water Resour. Bull.*, 21, 417–421, 1985.
- Zhang, Y., Carey, S. K., Quinton, W. L., Janowicz, J. R., Pomeroy, J. W., and Flerchinger, G. N.: Comparison of algorithms and parameterisations for infiltration into organic-covered permafrost soils, *Hydrol. Earth Syst. Sci.*, 14, 729–750, doi:10.5194/hess-14-729-2010, 2010.
- Zhang, Z., Kane, D. L., and Hinzman, L. D.: Development and application of a spatially-distributed Arctic hydrological and thermal process model (ARHYTHM), *Hydrol. Process.*, 14, 1017–1044, 2000.
- Zhao, L. and Gray, D. M.: Estimating snowmelt infiltration into frozen soils, *Hydrol. Process.*, 13, 1827–1842, 1999.

Table 1. Area and mean elevation, aspect, and slope for HRUs in sub-basins of the Marmot Creek Research Basin. Note that the aspect is in degree clockwise from North.

HRU Name	Area (km ²)	Mean elevation (m a.s.l.)	Mean aspect (°)	Mean slope (°)
Cabin Creek Sub-basin with total basin area 2.35 km ²				
South-facing Alpine Rock	0.23	2387	122	36
North-facing Alpine Rock	0.17	2379	69	37
North-facing Alpine Larch/Spruce	0.02	2222	60	35
South-facing Alpine Larch/Spruce	0.02	2194	115	32
North-facing Spruce/Fir/Lodgepole Pine	0.35	2046	62	24
South-facing Spruce/Fir/Lodgepole Pine	0.93	1972	151	18
Level Spruce/Fir/Lodgepole Pine	0.05	1931	0	4
Forest Clearings	0.40	1927	140	11
Level Lodgepole Pine	0.05	1882	0	3
South-facing Lodgepole Pine	0.07	1798	204	18
North-facing Lodgepole Pine	0.01	1780	76	25
Valley Bottom	0.04	1951	135	18
Middle Creek Sub-basin with total basin area 2.94 km ²				
North-facing Alpine Rock	0.52	2462	82	31
South-facing Alpine Rock	1.37	2422	148	30
South-facing Alpine Larch/Spruce	0.26	2246	138	20
North-facing Alpine Larch/Spruce	0.08	2211	46	18
North-facing Spruce/Fir/Lodgepole Pine	0.16	1995	76	21
South-facing Spruce/Fir/Lodgepole Pine	0.52	1953	134	22
Valley Bottom	0.03	2057	115	16
Twin Creek Sub-basin with total basin area 2.79 km ²				
North-facing Alpine Rock	0.79	2386	67	28
South-facing Alpine Rock	0.15	2380	106	22
South-facing Alpine Larch/Spruce	0.28	2228	116	23
North-facing Alpine Larch/Spruce	0.28	2182	37	22
North-facing Spruce/Fir/Lodgepole Pine	0.38	1966	34	17
South-facing Spruce/Fir/Lodgepole Pine	0.36	2014	113	21
North-facing Circular Clearings	0.26	1966	34	17
South-facing Circular Clearings	0.24	2014	113	21
Valley Bottom	0.04	1988	119	16
Marmot Confluence Sub-basin with total basin area 1.32 km ²				
Forest Clearings	0.01	1903	55	11
North-facing Lodgepole Pine/Aspen	0.38	1786	54	13
South-facing Lodgepole Pine/Aspen	0.24	1725	159	13
Level Lodgepole Pine/Aspen	0.04	1688	0	4
South-facing Lodgepole Pine	0.44	1752	172	17
Level Lodgepole Pine	0.02	1724	0	4
North-facing Lodgepole Pine	0.15	1687	71	14
Valley Bottom	0.02	1664	163	8

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Table 2. Parameters for the hillslope module. $soil_{rechr_{max}}$ (mm), $soil_{moist_{max}}$ (mm) and gw_{max} (mm) are the water storage capacity for the recharge, soil of both recharge and lower and groundwater layers, respectively. $K_{s_{gw}}$ ($m s^{-1}$), $K_{s_{upper}}$ ($m s^{-1}$) and $K_{s_{lower}}$ ($m s^{-1}$) are the saturated hydraulic conductivity in the groundwater, recharge, and lower of soil layers, respectively. λ (–) is the pore size distribution index.

HRUs Sub-basins	Alpine Rocks/Talus			Alpine Forest			Subalpine Forest			Confluence
	Cabin Creek	Middle Creek	Twin Creek	Cabin Creek	Middle Creek	Twin Creek	Cabin Creek	Middle Creek	Twin Creek	
$soil_{rechr_{max}}$	250	250	250	250	250	250	250	250	250	250
$soil_{moist_{max}}$	550	550	550	550	550	550	425	425	425	750
gw_{max}	500	500	500	500	500	500	500	500	500	500
$K_{s_{gw}}$	6.95×10^{-7}									
$K_{s_{upper}}$	1.76×10^{-4}	1.76×10^{-4}	6.95×10^{-5}							
$K_{s_{lower}}$	6.95×10^{-6}									
λ	2.55	2.55	2.55	2.55	2.55	2.55	2.55	2.55	2.55	2.55

Discussion Paper | Discussion Paper | Discussion Paper | Discussion Paper | Discussion Paper

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Table 3. Evaluation of simulated snow accumulations via the root mean square difference (RMSD, mm SWE), normalized RMSD (NRMSD), and model bias (MB) at Upper Forest/Clearing and Fisera Ridge sites, Marmot Creek Research Basin during 2007–2011.

	Upper Forest/Clearing		North-facing Slope	Ridge Top	Fisera Ridge		Larch Forest
	Spruce Forest	Forest Clearings			Top South-facing Slope	Bottom South-facing Slope	
RMSD	19.4	41.2	53.3	53.3	88.4	165.5	274.9
NRMSD	0.42	0.40	0.67	0.44	0.31	0.39	0.59
MB	0.004	0.12	0.040	-0.015	-0.11	-0.006	0.36

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Multi-variable evaluation of hydrological model predictions

X. Fang et al.

Table 4. Evaluation of the simulated seasonal volumetric soil moisture via the root mean square difference (RMSD, mm mm^{-1}), normalized RMSD (NRMSD), and model bias (MB) at Level Forest site, Marmot Creek Research Basin.

	RMSD	NRMSD	MB
2006	0.055	0.39	0.25
2007	0.048	0.39	0.34
2008	0.046	0.33	0.27
2009	0.025	0.17	0.07
2010	0.037	0.26	0.19
2011	0.040	0.35	0.28

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

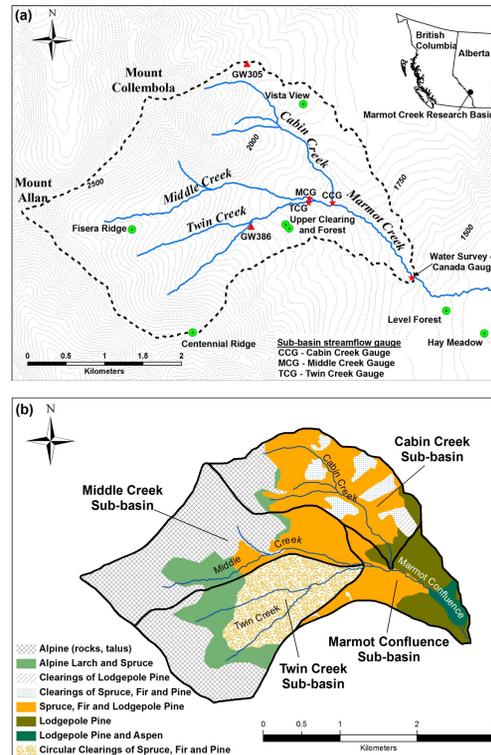


Fig. 1. (a) Contour map (m) of the Marmot Creek Research Basin (MCRB) showing stream names, the locations of groundwater wells (GW, red triangular), hydrometeorological stations (green dot circles) and streamflow gauge stations (red star), and (b) landcovers types corresponding to the major forest zones. Note that the area where there are small irregular circular clearings is shown, but size of clearings are too small to be shown at this scale.

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

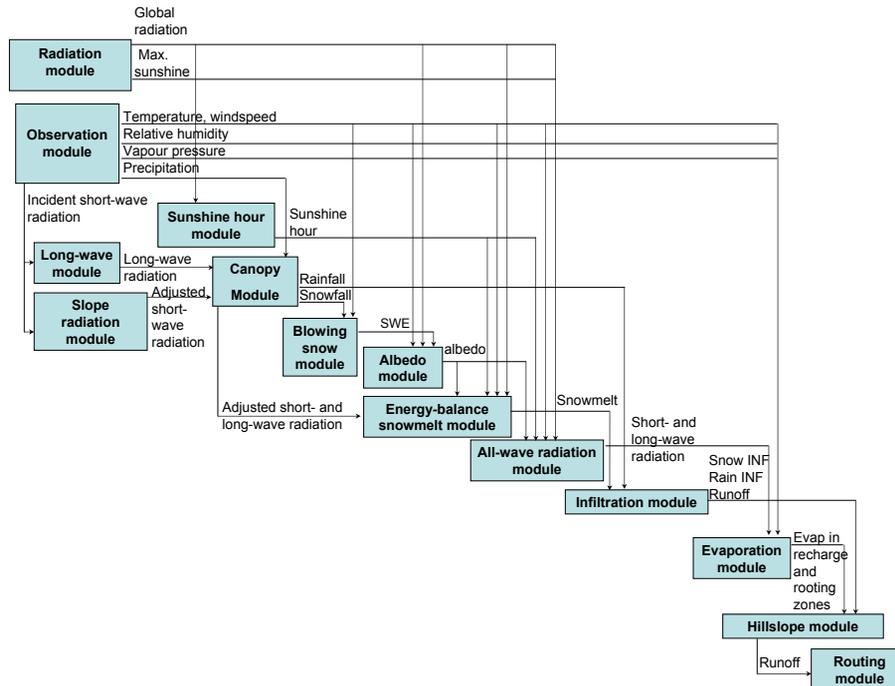


Fig. 2. Flowchart depicting the configuration of physically based hydrological modules in CRHM for simulating hydrological processes. This setup is repeated for each HRU to develop a mountain hydrology model in the Marmot Creek Research Basin.

Title Page

[Abstract](#) [Introduction](#)
[Conclusions](#) [References](#)
[Tables](#) [Figures](#)

⏪ ⏩
◀ ▶
[Back](#) [Close](#)

[Full Screen / Esc](#)
[Printer-friendly Version](#)
[Interactive Discussion](#)

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

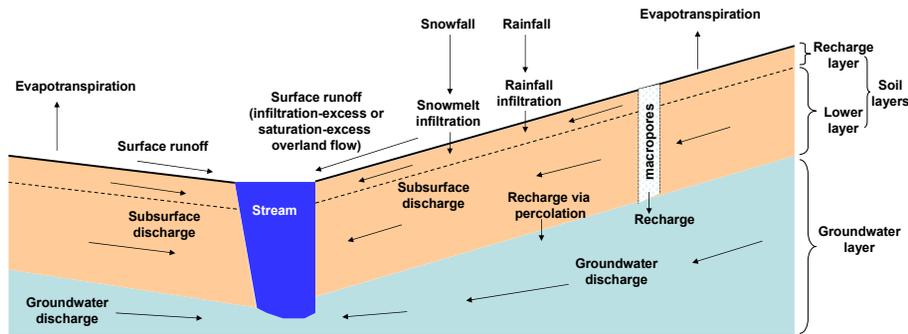


Fig. 3. Conceptual representation of CRHM's hillslope module with control volumes of two soil layers, groundwater layer and surface depressions or macropores and their interactions. Note that saturated porous media flow always occurs in the groundwater layer and can episodically occur in the soil layers.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

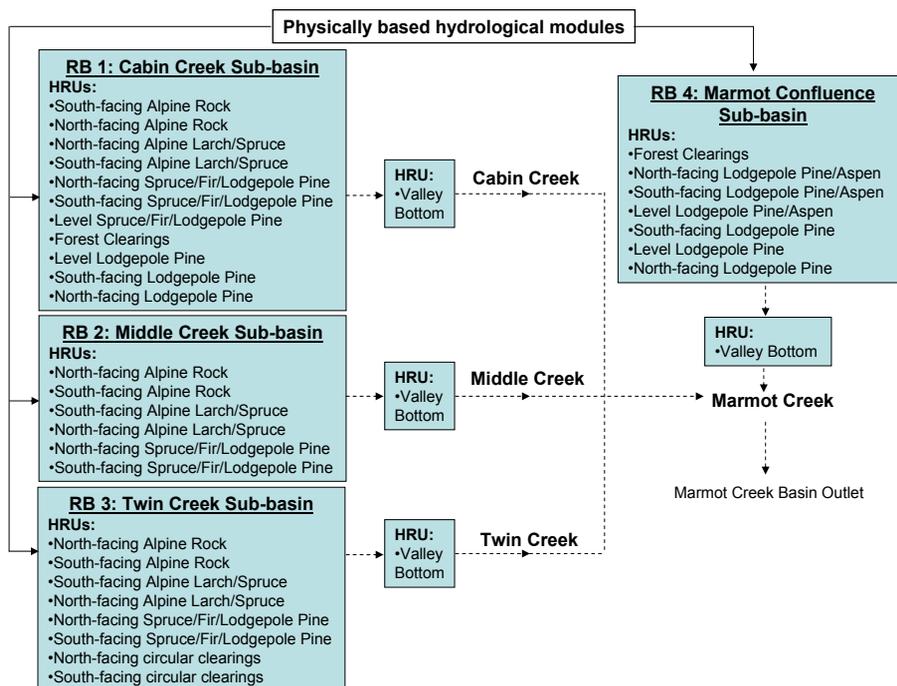


Fig. 4. CRHM modelling structure. The four sub-basins comprising Marmot Creek are simulated as “representative basins” (RBs) which are composed of various HRUs (listed in blue boxes), and each HRU contains the physically based hydrological module internal structure shown in Fig. 2. Muskingum routing (shown by the dashed line) routes flow from non-channel HRUs to valley bottom HRU in each RB and then connects all four RBs and routes flow to the basin outlet.

[Title Page](#)

[Abstract](#)

[Introduction](#)

[Conclusions](#)

[References](#)

[Tables](#)

[Figures](#)

⏪

⏩

◀

▶

[Back](#)

[Close](#)

[Full Screen / Esc](#)

[Printer-friendly Version](#)

[Interactive Discussion](#)

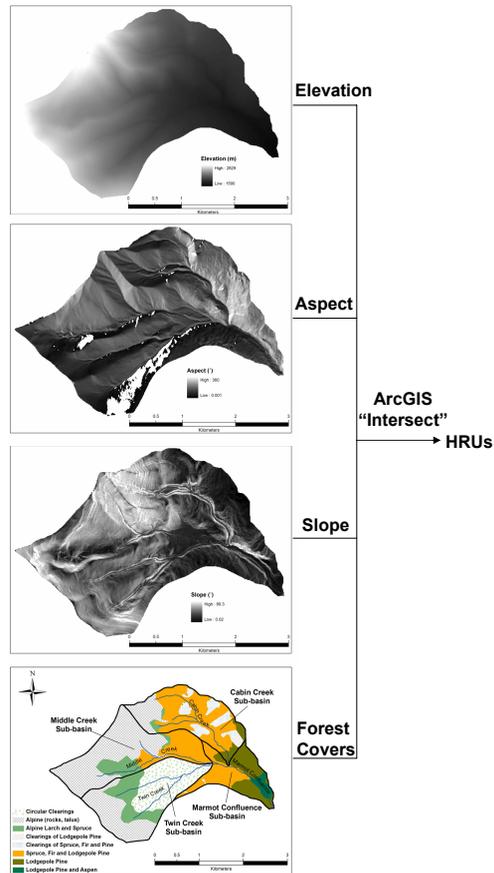


Fig. 5. Pre-processing procedure showing the spatial layers used for generating HRUs in the Marmot Creek Research Basin. A LiDAR DEM and forest cover map provided the information used in this delineation.

**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

⏪ ⏩

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

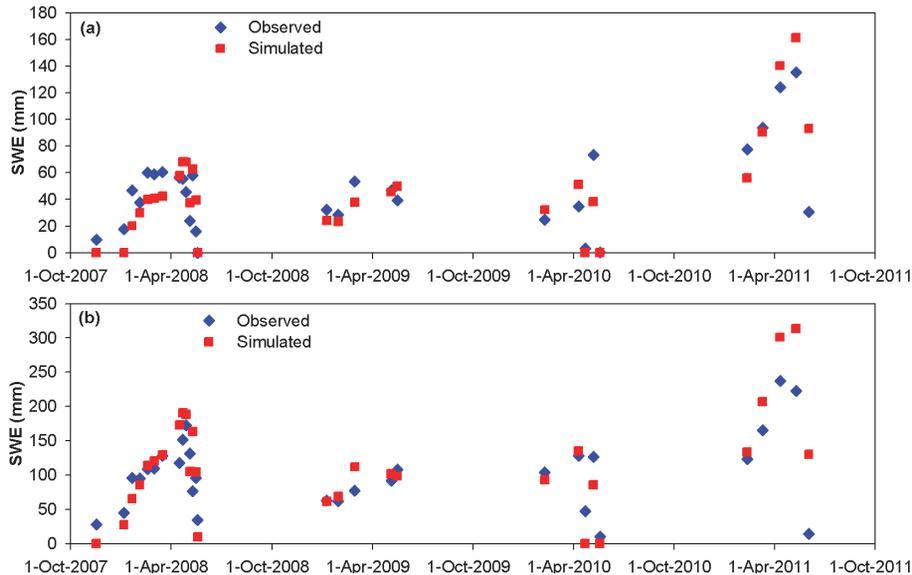


Fig. 6. Comparisons of the observed and simulated snow accumulation (SWE) during 2007–2011 at the sheltered, mid-elevation Upper Forest and Upper Clearing sites in the MCRB. **(a)** mature spruce forest and **(b)** forest clearings.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

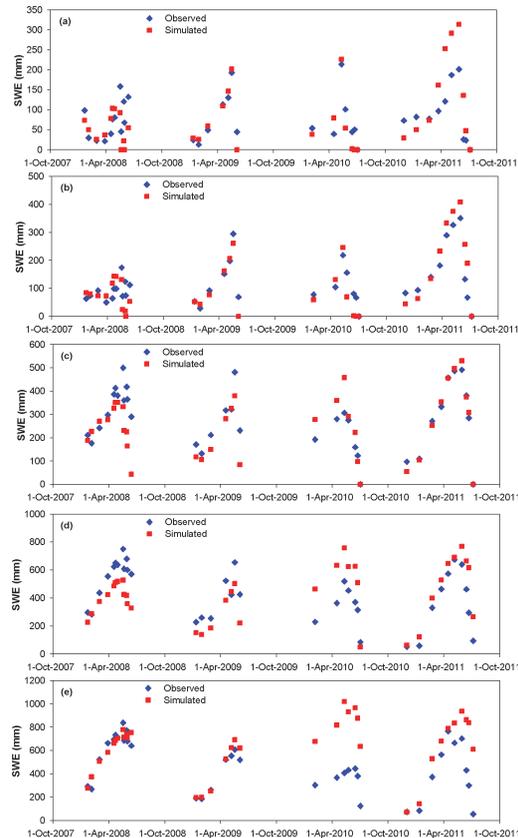


Fig. 7. Comparisons of the observed and simulated snow accumulation (SWE) during 2007–2011 at the wind-blown, high elevation Fisera Ridge in the MCRB. **(a)** north-facing slope, **(b)** ridge top, **(c)** top south-facing slope, **(d)** bottom south-facing slope, and **(e)** larch forest.

[Title Page](#)
[Abstract](#)
[Introduction](#)
[Conclusions](#)
[References](#)
[Tables](#)
[Figures](#)
[⏪](#)
[⏩](#)
[◀](#)
[▶](#)
[Back](#)
[Close](#)
[Full Screen / Esc](#)
[Printer-friendly Version](#)
[Interactive Discussion](#)

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

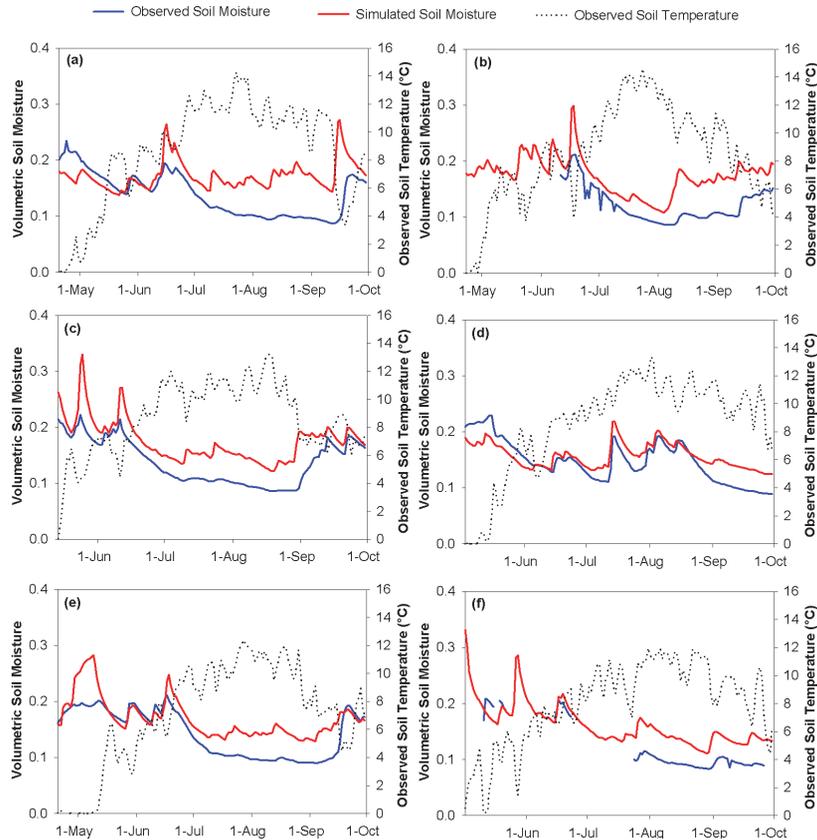


Fig. 8. Comparisons of the observed and simulated seasonal daily volumetric soil moisture at Level Forest in the MCRB. **(a)** 2006, **(b)** 2007, **(c)** 2008, **(d)** 2009, **(e)** 2010, and **(f)** 2011. Note that comparisons are valid only when the observed soil temperature is above 0 °C.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

Multi-variable evaluation of hydrological model predictions

X. Fang et al.

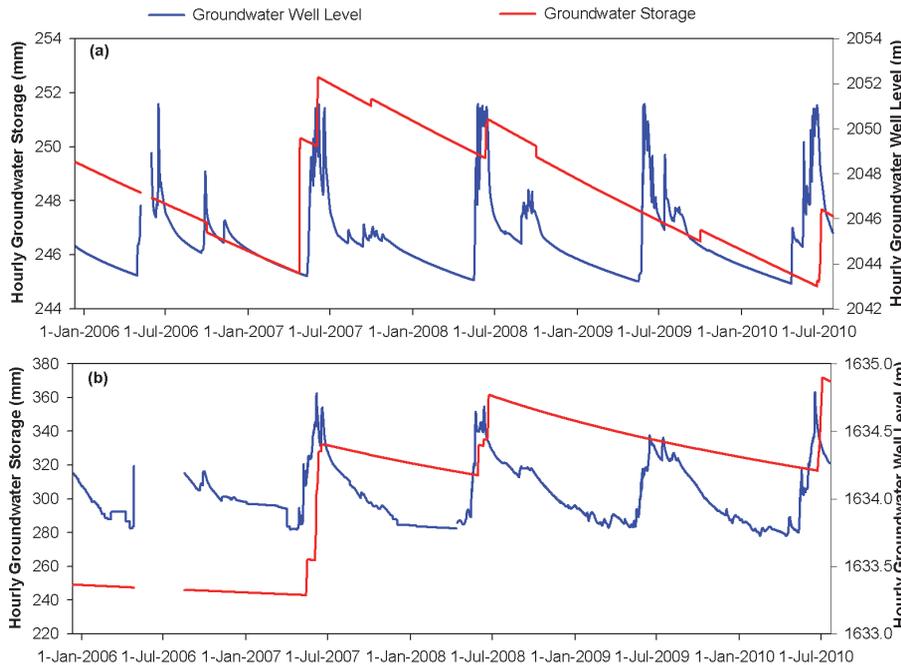


Fig. 9. Comparisons of the observed hourly groundwater level fluctuation and simulated hourly groundwater storage during 13 December 2005–21 July 2010. **(a)** well GW305 and **(b)** well GW386.

Title Page

Abstract Introduction

Conclusions References

Tables Figures

◀ ▶

◀ ▶

Back Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**Multi-variable
evaluation of
hydrological model
predictions**

X. Fang et al.

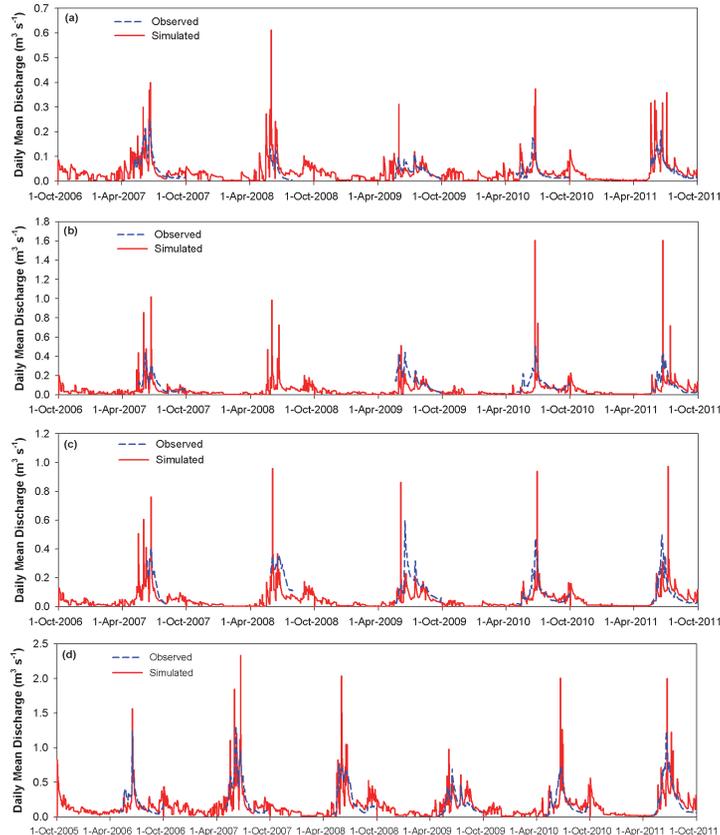


Fig. 10. Comparisons of observed and simulated daily streamflow during 2005–2011 at the outlets of **(a)** Cabin Creek, **(b)** Middle Creek, **(c)** Twin Creek, and **(d)** Marmot Creek. Note that streamflow observations for Cabin, Middle, and Twin Creeks started in spring 2007 and no measurements were available for Middle Creek in 2008 due to disturbance from wildlife.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion