Impact of bushfire and climate variability on streamflow from forested catchments in southeast Australia

Y. Zhou¹,², Y. Zhang², J. Vaze², P. Lane³, and S. Xu¹

¹Faculty of Infrastructure Engineering, Dalian University of Technology, Dalian 116024, China
²Water for a Healthy Country Flagship, CSIRO Land and Water, G.P.O. BOX 1666, Canberra ACT 2601, Australia
³Department of Forest and Ecosystem Science, Melbourne School of Land and Environment, The University of Melbourne, 221 Bouverie St., Parkville, Victoria 3010, Australia

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Correspondence to: Y. Zhang (yongqiang.zhang@csiro.au)

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Abstract

Most of the surface water for natural environmental and human water uses in south-east Australia is sourced from forested catchments located in the higher rainfall areas. Water yield of these catchments is mainly affected by climatic conditions, but it is also greatly affected by vegetation cover change. Bushfires are a major natural disturbance in forested catchments and potentially modify the water yield of the catchments through changes to evapotranspiration (ET), interception and soil moisture storage. This paper quantifies the impacts of bushfire and climate variability on streamflow from three southeast Australian catchments where Ash Wednesday bushfires occurred in February 1983. The hydrological models used here include AWRA-L, Xinanjiang and GR4J. The three models are first calibrated against streamflow data from the pre-bushfire period and they are used to simulate runoff for the post-bushfire period with the calibrated parameters. The difference between the observed and model simulated runoff for the post-bushfire period provides an estimate of the impact of bushfire on streamflow. The hydrological modelling results for the three catchments indicate that there is a substantial increase in streamflow in the first 15 yr after the 1983 bushfires. The increase in streamflow is attributed to initial decreases in ET and interception resulting from the fires, followed by logging activity. After 15 yr, streamflow dynamics are more heavily influenced by climate effects, although some impact from fire and logging regeneration may still occur. It is shown that hydrological models provide reasonable consistent estimates of forest disturbance and climate impacts on streamflow for the three catchments. The results might be used by forest managers to understand the relationship between forest disturbance and climate variability impacts on water yield in the context of climate change.
1 Introduction

Forested catchments are normally located in higher rainfall areas and they produce most of the surface water for natural environmental and human water use in major parts of the world. This is particularly important in southeast (SE) Australia. For instance, most of the water supply for Melbourne, the capital of Victorian State, comes from native eucalypt forest catchments (Lane et al., 2010).

Water supply in SE Australian native forest catchments has been significantly influenced by natural and/or anthropogenic disturbances (Langford, 1976; Kuczera, 1987; Cornish 1993; Cornish and Vertessy, 2001; Vertessy et al., 1996, 2001; Watson et al., 1999; Lane et al., 2010). Bushfires, a major natural disturbance in SE Australia, have the potential to modify the hydrological response of forests by significantly altering interception and transpiration. To give some scale of this issue, over 3 million ha of forests in SE Australia have been subject to bushfire in the past 9 yr. The major anthropogenic forest disturbance is logging, which is a major source of pulp and timber in SE Australia. Like severe fire, clearfell logging substantially changes land cover and the associated hydrological response. In some catchments, salvage logging has combined with bushfire, changing hydrological processes and thus influencing runoff generation (Smith et al., 2011).

As for most studies in which there is a dramatic change in vegetation, fire presents potential for a distinct temporal change in evapotranspiration (ET) as the early loss of leaf area transitions into regrowth or recovering forest. There are numerous examples in the literature of flow increases following forest disturbance or growth (see reviews by Bosch and Hewlett, 1982; Andréassian 2004; Brown et al., 2005; Vaze, et al., 2004). Many of the fire-related studies reported in the literature focus only on immediate and short term flow increases (Brown, 1972; Helvey, 1980; Scott, 1993, 1997; Lane et al., 2006, 2012). But Tan et al. (2011) also reported no flow increases in Melbourne’s water supply catchments following the 2009 Black Saturday fires in Victoria, and a recent
study measuring the evapotranspiration of *E. delegatensis* stands after fire found significant increases in stand ET in years 6–7 post fire (Buckley et al., 2012).

Two landmark studies in Australia (Langford, 1976 and Kuczera, 1987) were the first to identify a significant flow decline as the forest recovers. These studies found that the regrowth stands of *Eucalyptus regnans* (Mountain Ash) killed in the 1939 bushfire were yielding significantly less water than the old growth stands they replaced. Kuczera (1987) proposed a model that, expressed as an age-yield curve, shows a 50% decline in flow by age 25–30 relative to an old growth baseline, with a gradual recovery over greater than 100 yr. Watson et al. (1999a) essentially endorsed the general trend of the curve, with the major departure being a flow increase in the first few years. Kuczera’s analysis (Kuczera, 1987) did not identify this early increase. Both models predict streamflow to begin decreasing below pre-fire level in less than 10 yr.

The reasons for this age-yield relationship were untangled by a series of process studies (e.g. Vertessy et al., 1995, 1996, 2001; Haydon et al., 1996; Watson et al., 1999b). Fire is the ecological trigger for *E. regnans* and other Ash-type eucalypt forests (mainly *E. delegatensis*). Moderate-hot fires kill the trees which results in very dense regeneration from seed, leading to a rapid development of sapwood area and leaf area. These single aged stands thin out naturally with competition, leading to development of an understorey and gradual loss of overstorey density. As the stands thin, water use decreases.

In contrast to ash forests, the effect of fire on most other eucalypt species is far less dramatic as they are fire resistant, with relatively low incidence of mortality. Complete regrowth stands in these mixed species forests are rare. Loss of leaves in the canopy is compensated by growth of epicormic shoots from trunk and branches, and seedling germination. Gradually the canopy is re-established and the dominant trees out compete seedlings. The non-ash ET–age relationship following fire is poorly understood. However any significant long-term changes are unlikely unless there is widespread mortality. It is generally conceded that this rarely occurs (e.g. Gill, 1995; Purdie and Slatyer, 1976; Christensen et al., 1981; Vivian et al., 2008), which means the logging
impact reported by Cornish (1993) and Cornish and Vertessy (2001) is unlikely. Although not well measured, it can be argued that these forests re-establish their canopy in less than 10 yr (and often much faster) and return to the pre-fire equilibrium ET.

When considering bushfire impact on streamflow, climate variability is also an important factor that can greatly affect streamflow (Dam, 1999; Lane et al., 2005). Precipitation and potential evapotranspiration are two dominant climate factors in hydrological cycle. The high variability of rainfall and temperature observed in eastern Australia (Stone and Auliciems, 1992; Kiem and Franks, 2001) significantly influence catchment hydrology. For example, a prolonged drought since the mid-1990s in southeast Australia has had a serious impact on bushfire regimes and water availability for industrial and consumptive use (Verdon-Kidd and Kiem, 2009). There have been numerous studies investigating the impacts of land use/land cover change and climate variability on streamflow (Li et al., 2007, 2009b; Tomer and Schilling, 2009; Nangia et al., 2010; Li et al., 2012). Most of these studies focus on vegetation change due to afforestation, deforestation and other human activities. However, bushfire and climate variability impacts on streamflow are rarely concerned.

To investigate forest disturbance and climate variability impacts on streamflow, hydrological modeling is extensively used. Modelling studies into forest disturbance in SE native Australian forests have included physically-based (e.g. Vertessy et al., 1993, 1995; Watson et al., 1999b), empirical (Watson et al., 1999a; Cornish and Vertessy, 2001) and lumped rainfall-runoff models (e.g. Post and Jakeman, 1996). The physically-based approaches are particularly attractive for the ash species because of the dynamic nature of stand responses. This is mainly because these models consider vegetation dynamics, simulate forest regrowth after disturbance, and then try to model runoff under transient conditions. The application of these models on catchments affected by bushfires or logging is subject to the availability of detailed catchment attributes which are necessary for the parameterisation of these models. These detailed catchment attributes at fine spatial resolution are seldom available for medium to large size catchments which normally constrains the successful application of these models. Lane
et al. (2010) highlight the strengths and weaknesses of physically-based approaches for fire modelling, and note that parameterisation for a wide range of vegetation types and climates is problematic. Bushfires disturb far greater areas and distribution of forest species than commercial logging, leading to parameterisation issues. Empirical models have been usefully applied for forecasting at large scales for recent Victorian fire events (Mannik et al., 2009). Although this approach avoids some parameterisation issues by neglecting rainfall dynamics and internal catchment processes, it is constrained by untested assumptions of vegetation response to fire and by application to highly variable forest and landuses with a paucity of response data.

Lumped rainfall-runoff models have simpler model structure, fewer model parameter and less input information, compared to the physical-based models. Therefore, the lumped rainfall-runoff models are easier to calibrate and apply for hydrological modeling and they provide a convenient method to estimate the relative impacts of catchment disturbances (such as bushfire and logging) and climate variability streamflow for any size catchment. The calibrated rainfall-runoff models can be used to quantify impact of climate variability on catchment water yield and then to estimate disturbance impact (Tuteja, et al., 2007; Li et al., 2012).

The main objective of this paper is to quantify the impacts of climate variability and bushfires on streamflow from three southeast Australian catchments where Ash Wednesday bushfires occurred in February 1983 (Fig. 1) using three conceptual rainfall-runoff models (AWRA-L, Xinanjiang and GR4J). The three models are first calibrated against observed streamflow obtained from the pre-bushfire period, and then the calibrated models are applied to predict streamflow for the post-bushfire period. The difference between the observed and simulated streamflow for the post-bushfire period is the impact of bushfire.
2 Catchment and data

2.1 Study catchments

The three forested catchments are situated in the Central Highlands of Victoria, east of Melbourne (Fig. 1). They are vegetated with a mix of pure *E. regnans* (mountain ash) and mixed damp eucalypt species, predominantly *E. obliqua*, *E. cypellocarpa* and *E. sieberi*. The area of ash is 56% for the Latrobe River catchment, 50% for the Yarra River catchment and 51% for Starvation Creek. The ash stands were all regrowth originating from the 1939 bushfires. Table 1 provides the catchment areas, burnt area, percentage burnt and study period of record and Table 2 summarises the rainfall and areal potential evapotranspiration (APET) data.

Apportioning the vegetation impact of the burn area is not straightforward. Based on forest inventory data we can establish a minimum impact via ash mortality. This is based on the State Forest Resource Inventory (SFRI) data set that gives species and age distributions. However, the impact on the non-ash species is far less certain. We have no fire severity data for this fire. It is unlikely there was broadscale mortality, but it is impossible to know exactly what the mixed-species disturbance was. Figure 2a shows the cumulative mortality/regrowth for the catchments. It is assumed that any regeneration area from 1984 was salvage logging if fire-killed ash. The known fire-mortality rates for the catchments were 10%, 25% and 3% for the Latrobe, Yarra and Starvation Creek catchments, respectively. Figure 2b includes the non-ash data, but it is unlikely that increased regeneration percentages are realistic. The area burnt for Starvation Creek is 84%, but as only 3% results in a fire-kill of ash it appears the severity was not high in that catchment. Figure 2 shows clearly that, subsequent to 1983/84 there was significant percentages of further disturbance. This is clearfell logging (in the 1990s and early 2000s) of mountain ash and some other eucalypt species as the post 1939 fire regrowth reached prime harvest age. Thus the analysis in this paper considers a mix of fire, logging and climate effects on streamflow.
2.2 Data

This study uses approximately more than 30 yr of historical streamflow data ($Q_{\text{obs}}$) extending from pre-bushfire to post-bushfire periods (Table 1). The data for the Latrobe, Yarra and Starvation Creek catchments are available for 1966–2007, 1973–2004 and 1971–2000, respectively. The daily streamflow data is obtained from the Victorian Water Resources Data Warehouse (http://www.vicwaterdata.net). The climatic data (daily precipitation, $P$, areal potential evapotranspiration, APET, maximum temperature, $T_{\text{max}}$, minimum temperature, $T_{\text{min}}$, actual vapour pressure, $e$, and solar radiation, $R_s$) used in this study come from the “SILO Data Drill” produced by the Queensland Department of Environment and Resource Management (http://www.longpaddock.qld.gov.au/silo/; Jeffrey et al., 2001). The daily grided SILO dataset ($0.05^\circ \times 0.05^\circ$) are interpolated from 4600 point measurements across Australia (Jeffrey et al., 2001). The ordinary kriging was used to interpolate daily and monthly precipitation and cross validation indicates precipitation with a mean absolute value of 12.2 mm month$^{-1}$, indicating good quality of interpolation. The daily climatic data are used to drive the three rainfall-runoff models (AWRA-L, Xinanjiang and GR4J model). The APET used in Xinanjiang and GR4J model is calculated from the $0.05^\circ T_{\text{max}}, T_{\text{min}}, R_s$, and $e$ using Morton’s wet environment (or equilibrium evaporation or areal potential evaporation) algorithms (Morton, 1983).

3 Methodology

3.1 General framework

Streamflow is controlled not only by climate conditions, but catchment characteristics. It can be assumed that streamflow changes are resulted from climate variability and the changes in catchment characteristics, which can be written as:

$$\Delta Q_{\text{tot}} = \Delta Q_{\text{cc}} + \Delta Q_{\text{clim}}$$

(1)
where $\Delta Q_{tot}$ is the total streamflow change in two periods, 1 and 2, estimated as $\Delta Q_{tot}=\frac{Q^2_{obs}-Q^1_{obs}}{Q^1_{obs}}$ is the mean annual streamflow observed in the period 1 when catchment disturbance is negligible (the baseline) and $Q^2_{obs}$ are the mean annual streamflow observed in the period 2 when catchment disturbance is significant; $\Delta Q_{cc}$ is the change in streamflow caused by the change in catchment characteristics, $\Delta Q_{clim}$ is the change contributed by climate variability.

The three forested catchments selected in this study are not subject to dam regulations or diversions. Therefore, changes of catchment characteristics are primarily due to vegetation changes ($\Delta Q_{veg}$). As a result, $\Delta Q_{cc}$ is replaced by $\Delta Q_{veg}$ and Eq. (1) can be rewritten as:

$$\Delta Q_{tot} = \Delta Q_{veg} + \Delta Q_{clim} \quad (2)$$

$\Delta Q_{tot}$ can be estimated from streamflow data observed from the two periods. $\Delta Q_{veg}$ can be quantified once $\Delta Q_{clim}$ is available. Here, the lumped rainfall-runoff models are used to estimate $\Delta Q_{clim}$. First, these models are driven by climate inputs and calibrated against observed streamflow data in the period 1. Second, the calibrated models are driven by climate inputs in the period 2 to simulate streamflow in that period. Since these models are only driven by climate variables, rainfall and areal potential evapotranspiration (APET), the changes in the simulated streamflow from the two periods are solely caused by climate variability. Therefore, the climatic variability impact on streamflow ($\Delta Q_{clim}$) can be estimated as:

$$\Delta Q_{clim} = Q_{sim2} - Q_{sim1} \quad (3)$$

where $Q_{sim1}$ is the mean annual streamflow simulated in the calibration period, $Q_{sim2}$ is the mean annual streamflow simulated in the test period (or the vegetation change period).

This approach assumes that there are no noticeable changes in model bias from model calibration period (pre-bushfire) to model test period (post-bushfire) and the
calibrated parameter set can be transferred from the calibration period to the test period. Once $\Delta Q_{\text{clim}}$ is quantified, $\Delta Q_{\text{veg}}$ is calculated from Eqs. (2) and (3).

### 3.2 Hydrological modelling

Three hydrological models, GR4J, XAJ and AWRA-L, are used in this study. Table 4 summarises the major characteristics and differences between the three models. All these three models have runoff generation soil stores and account for actual evapotranspiration processes. The main feature for the AWRA-L model is that it considers hydrological response units (HRUs) for each grid or catchment, and can be used for simulating vegetation processes as well. The XAJ model considers that the soil water storage is distributed in a statistical way in space across the catchment. The GR4J model adopts two unit hydrographs for routing. The three models are briefly described below.

#### 3.2.1 Model description

**GR4J**

The GR4J model is a daily lumped conceptual rainfall-runoff model. Streamflow is estimated from mean areal daily $P$ and APET time series. It has two stores, the production and routing stores, and four parameters to calibrate. It has been applied over a wide range of hydro-climatic conditions (Perrin et al., 2003; Coron et al., 2012; Lerat et al., 2012) including application across southeast Australia (Vaze et al., 2010) and used in the MOPEX experiment of rainfall-runoff models intercomparison (Andréassian et al., 2006).

**Xinanjiang**

Xinanjiang model is also a lumped conceptual daily rainfall-runoff model. Model inputs include $P$ and APET time series. It has been widely applied in humid and semi-humid
regions in China since its publication in the year of 1980 (Zhao et al., 1980; Zhao, 1992; Jayawardena and Zhou, 2000; Cheng et al., 2002). And It has been successfully applied in southeast Australia (Zhang and Chiew, 2009; Li et al., 2012). The Xinanjiang model includes 14 parameters and four submodels: a three-layer evapotranspiration submodel, a runoff generation submodel, a runoff separation submodel and a runoff routing submodel.

AWRA-L

Australian Water Resources Assessment system Landscape Model (AWRA-L) (Van Dijk, 2010) is a one-dimensional, grid-based water balance model that simulates water stores and flows in the soil, groundwater and surface water systems. Each grid cell consists of two hydrological response units (HRUs): deep-rooted and shallow-rooted vegetations. Soil and vegetation water and energy fluxes are simulated separately for each HRU and individual HRUs are linked together by groundwater and surface water. The AWRAL model contains 17 calibration parameters and four submodels for simulating runoff generation, radiation and energy, vapor fluxes and vegetation phenology, respectively. The forcing data include daily precipitation, maximum temperature, minimum temperature and solar radiation and the outputs include daily water fluxes and vegetation dynamics.

3.2.2 Calibration

The particle swarm optimization (Eberhart and Kennedy, 1995) is used for model calibration. This method can find the so-called global or near-global optimum and has been successfully used for calibrating hydrological models (Chau, 2006; Gill et al., 2006; Zhang and Chiew, 2009).

All conceptual hydrological models need to be calibrated before they can be applied for catchment water balance assessments. The Nash-Sutcliffe Efficiency (NSE, defined by Nash and Sutcliffe, 1970) is the most widely used for calibration and evaluation of
hydrological models. The hydrological models (AWRA-L, Xinanjiang and GR4J models) are calibrated by maximising the objective function which is a weighted combination of NSE of monthly runoff and a logarithmic function of bias (total model error divided by total observed streamflow, $B$) (Viney et al., 2009; Vaze et al., 2003) given by:

$$F = \text{NSE} - 5\ln(1 + B)^{2.5}$$  \hfill (4)

NSE is expressed as

$$\text{NSE} = 1 - \frac{\sum_{i=1}^{n} (Q_{\text{obs},i} - Q_{\text{sim},i})^2}{\sum_{i=1}^{n} (Q_{\text{obs},i} - \bar{Q}_{\text{obs}})^2}$$  \hfill (5)

$B$ is defined as:

$$B = \frac{\sum_{i=1}^{n} Q_{\text{sim},i} - \sum_{i=1}^{n} Q_{\text{obs},i}}{\sum_{i=1}^{n} Q_{\text{obs},i}}$$  \hfill (6)

Where $Q_{\text{obs}}$ is recorded monthly runoff, $Q_{\text{sim}}$ is simulated monthly runoff, $\bar{Q}_{\text{obs}}$ is the arithmetic mean of the observed runoff, $i$ is $i$th month, and $n$ is the number of months. This objective function provides a smooth but less severe bias constraint, compared to the bucket constraint and an advantage of the log-bias constraint is that it does not suffer from the numerical issues which can influence predictions/simulations using the non-continuous bucket constraint (Viney et al., 2009).

The pre-bushfire period (start of flow record to 1982) is used for model calibration and the post-bushfire period (1983 to end of flow record) is used as the test period. Table 1 summarises the calibration and test periods for each catchment, with the first year of calibration period used for model warm up.
4 Results and discussion

4.1 Hydrological model calibration

The hydrological models calibration and test periods and the calibration results for the study catchments are shown in Table 1 and Table 3, respectively. The NSE results of calibration period for the three models range from 0.78 to 0.85, 0.78 to 0.85 and 0.67 to 0.83 for AWRA-L, Xinanjiang and GR4J models, respectively. The calibration $B$ values range from $-0.76\%$ to $0.39\%$ for AWRA-L, from $0.66\%$ to $2.65\%$ for Xinanjiang and from $-0.57\%$ to $2.29\%$ for GR4J model. The predicted and observed annual streamflow for the entire modelling periods are shown in Figs. 3–5. There is a good agreement between the simulated and observed streamflow in the calibration period (start of flow record to 1982). The calibration results for the three models are satisfactory and are comparable with other hydrological model calibration results reported in literature (Vaze and Teng, 2011; Vaze et al., 2011). The calibration results also indicate that the model bias in simulating monthly runoff is small and non-systematic and the models used in this study are robust to simulate streamflow over an independent test period.

4.2 Hydrological model simulation

The calibrated rainfall-runoff model(s) parameters combined with climatic data ($P$, APET, $T_{\text{max}}$, $T_{\text{min}}$, $R_s$, and $e$) are applied to simulate streamflow for the entire post-bushfire test periods (Table 1) to investigate 1983 bushfire impact on streamflow from the three catchments. As the hydrological models are driven using observed climatic dataset for the post-bushfire period, it can be assumed that climatic difference impact between pre- and post-bushfire periods has been taken out. Therefore, the difference in observed and predicted streamflow during post-bushfire period is solely due to reduction in interception and actual evapotranspiration from the forest due to bushfire.

The observed and simulated streamflow for the three catchments are shown in Figs. 3–5. For all the three catchments, simulated annual streamflow from the three...
models are noticeably lower than the observed streamflow in the initial period post-bushfire (1983–1998). In the period after 1999, the three models simulated runoff is in reasonable agreement with the observed runoff.

To quantify the relative impacts of 1983 bushfire and climate variability on streamflow during the post-bushfire test period, the simulated streamflow for the AWRA-L, Xinanjiang and GR4J models are compared with the observed streamflow (Sect. 3.1 detailing the methodology). The difference in observed and simulated streamflow is due to vegetation cover change during the pre-bushfire and post-bushfire periods. The climate variability impact on streamflow is the difference of simulated streamflow between pre- and post-bushfire periods. Table 5 shows the simulation results for the AWRA-L model (columns 5 to 8), Xinanjiant model (columns 9 to 12) and GR4J (columns 13 to 16) when using post-bushfire climate dataset and calibrated parameters from calibration periods.

As shown in Table 5, the total streamflow change for the first 15 yr post-bushfire show an increase (when compared to the pre-bushfire period) $\Delta Q_{\text{tot}}$ caused by the 1983 bushfires and climate variability for the Latrobe at Noojee, Starvation creek and Yarra River at Little Yarra catchments are 52 mm, 107 mm and 36 mm which represent about 17%, 26% and 12% increase in streamflow respectively. Table 5 summarises the relative effects of climate variability and vegetation change on streamflow from the three hydrological models. During the first 15 yr post-bushfire, all the three models show that ($\Delta Q_{\text{veg}}$) reduction in forest cover causes an increase in streamflow and the simulation results are similar in magnitude for the three catchments. When averaged over the three models, the increases in streamflow caused by reduction in forest cover post-bushfire are 80 mm, 136 mm and 30 mm (26.4%, 32.6% and 9.9%) for Latrobe at Noojee, Starvation Creek and Yarra River at Little Yarra catchments, respectively. Compared to the impact of bushfire, the impact of climate variability ($\Delta Q_{\text{clim}}$) is small for all the three catchments. When averaged over the three models, the changes in streamflow caused by climate variability are $-35$ mm, $-6$ mm and $2$ mm ($-10.4\%$, $-1.4\%$ and 0.7% of pre-bushfire streamflow) for Latrobe at Noojee, Starvation Creek and Yarra
River at Little Yarra catchments, respectively. The streamflow changes caused by climate variability are similar to what we will get based on the concept of streamflow elasticity to rainfall (Chiew, 2006; see Table 2, rainfall changes of $-19\text{ mm}$, $-17\text{ mm}$ and $20\text{ mm}$ ($-1.3\%$, $-1.0\%$ and $1.4\%$) in first 15 yr post-bushfire period compared with pre-bushfire period). As shown in Figs. 6 and 7, the median of the increases in streamflow due to vegetation cover change are $79\text{ mm}$, $143\text{ mm}$ and $33\text{ mm}$ ($26\%$, $34\%$ and $11\%$ of pre-bushfire streamflow), and the corresponding changes in streamflow due to climatic differences between the pre-bushfire and the first 15 yr post-bushfire periods for the three catchments are $28\text{ mm}$, $-36\text{ mm}$ and $3\text{ mm}$ ($-9\%$, $-9\%$ and $1\%$ of pre-bushfire streamflow). The consistency in modelling results from the three models indicates that the increase in streamflow in the first 15 yr of post-bushfire period is mainly caused by reduction in forest cover due to bushfire.

The results for the period post 1998 (after 15 yr post-bushfire) show that the impact of the 1983 bushfires on streamflow for the three catchments is smaller compared to that in the first 15 yr after bushfire. For Latrobe at Noojee, Starvation creek and Yarra River at Little Yarra catchments, the total change in observed streamflow compared to the pre-bushfire period ($\Delta Q_{\text{tot}}$) are $-87\text{ mm}$, $-101\text{ mm}$ and $-86\text{ mm}$ which represent about $29\%$, $24\%$ and $28\%$ reduction in streamflow of pre-bushfire period respectively. For the post 1998 period, the reduction in streamflow due to climate variability is larger than that caused by forest cover change due to 1983 bushfire as the observed climate is significantly drier than that in the pre-bushfire period (and slightly drier than the climate for the first 15 yr post-bushfire period) (Table 5). When averaged over the three models, the reductions in streamflow caused by climate variability for the three catchments are $-91\text{ mm}$, $-122\text{ mm}$ and $-57\text{ mm}$ ($-30\%$, $-29\%$ and $-19\%$ of pre-bushfire streamflow). The three models show increases in streamflow due vegetation cover change for Latrobe at Noojee and Starvation Creek catchments. But the three models show a mixed response to vegetation cover change in Yarra River at Little Yarra catchment. AWRA-L and GR4J show reductions of $-25\text{ mm}$ and $-29\text{ mm}$ ($-8.4\%$ and $-9.5\%$ of pre-bushfire period) in streamflow, while Xinanjiang model shows an increase of $8\text{ mm}$
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4.3 Comparisons between different models

The box and whisker plots in Figs. 6 and 7 show the change in streamflow in the two periods (the first 15 yr after the 1983 bushfires and after 15 yr post-bushfire) estimated by the three hydrological models (AWRA-L, Xinanjiang and GR4J model) for the three catchments (Latrobe at Noojee, Starvation Creek and Yarra River at Little Yarra) in mm and percentage change respectively. The horizontal line in each box shows the median of the modelling results over the three models, the upper and lower envelops show the 75th and 25th percentile values and the upper and lower whiskers show the 95th and 5th percentile values.

There are some differences in the vegetation cover and climate variability impacts estimated by the three models for the three study catchments (Figs. 6 and 7). The maximum difference between the modelling results during the first 15 yr due to vegetation change for the three models are 29 mm (95 mm to 66 mm), 44 mm (155 mm to 4412...
110 mm) and 18 mm (38 mm to 20 mm) for Latrobe at Noojee, Starvation Creek and Yarra River at Little Yarra catchments respectively. This maximum difference is equivalent to 9.5%, 10.7% and 5.9% relative to pre-bushfire period streamflow for the three catchments, respectively. After 15 yr post-bushfire, the maximum difference between the modelling results for the three models is 43 mm (48 mm to 4 mm), 27 mm (48 mm to 21 mm) and 37 mm (8 mm to –29 mm). This maximum difference is equivalent to 14.3%, 6.6% and 12.2% relative to pre-bushfire period streamflow for the three catchments, respectively. The differences between the results from the three hydrological models can be attributed to differences in the conceptual complexity, structure, parameter numbers and transposability of model parameters. This is further discussed in Sect. 4.4.

All results from the three models show reasonable agreement with each other. In first 15 yr after bushfires, vegetation dynamics show much larger impacts on streamflow than climate variability, and result in the substantial increase in streamflow. Streamflow in Starvation Creek catchment show much larger increase than that in Latrobe at Noojee catchment which in turn shows larger increase than in Yarra River at Little Yarra catchment. It seems to be inversely related to percentage of ash disturbance. Yarra River at Little Yarra catchment with the highest percentage of ash disturbance (shown in Fig. 2a) has the lowest increase in streamflow.

After 15 yr post-bushfire, vegetation impacts on streamflow are negligible for the post 1999 period (after 15 yr post-bushfire), when compared to the impacts in the first 15 yr post-bushfire. During this period, there is a large reduction in streamflow due to substantial reduction in mean annual rainfall of 217 mm, 221 mm and 150 mm (15.4%, 13.6% and 1.2%) compared to the pre-bushfire period for Latrobe at Noojee, Starvation Creek and Yarra River at Little Yarra catchments, respectively. The differences in the results from the three models are partially due to the uncertainties in hydrological model structure and parameterisation.
4.4 Discussion

The applicability of hydrological modelling to quantify vegetation change and climate variability impacts on streamflow mainly depends on how the model parameters are calibrated and how they are transferred from calibration period to simulation period. It is important to investigate the transposability of model parameters in time (i.e. to make sure that their estimation is not dependent on climate characteristics of the calibration periods). This can provide us with a better understanding of uncertainty associated with using hydrological models for quantifying bushfire and climatic variability impacts on streamflow. The results will also provide confidence in the climate variability and vegetation change impact assessments based on hydrological modelling. To investigate the model transposability, four median-size catchments close to the three study catchments varying from 109 km² to 1080 km² were selected. All these four catchments have long period of observed streamflow data, are unregulated and are not subject to vegetation changes (Table 6). The GR4J model is used for the parameter transposability modelling experiments. The pre-bushfire period (1975–1982) is used for model calibration and three post-bushfire periods, 1983–2009, 1983–1998 and 1999–2009, are used for model validation.

The modelling results show that the GR4J model generally performs reasonably well both in the calibration and validation periods. For all the four catchments, the NSE values obtained for the validation periods are similar to those obtained for the calibration period. The differences between the $B$ values for the calibration and validation periods for all the four catchments are also small. First, the $B$ values obtained in the whole validation period (1983–2009) are compared to those obtained in the calibration period (1975–1982). For the 405205 catchment, the $B$ value obtained in the validation period is actually smaller (about 0.06) than that obtained in the calibration period and for the other three catchments, the $B$ values obtained in the validation period are slightly larger ($B$ increase of about 0.03–0.07) than those obtained in the calibration period. Second, the validation period is split into two: 1983–1998 and 1999–2009, to match the two
post-bushfire periods used for bushfire impact analysis. The bias obtained in the first validation period (1983–1998) is similar to that obtained in the second validation period (1999–2004) for catchment 405205, but is about 0.03–0.12 smaller for other three catchments. The differences in $B$ between the calibration period and the first validation period range between 0.01–0.06 and the differences in $B$ between the calibration period and the second validation period range between 0.07–0.11. The slightly higher $B$ values in the second validation period can be partly caused due to the larger climatic differences between the two periods (the 1999–2009 period is about 15% drier than the 1975–1982 period for these four catchments). This is in agreement with the finding of some recent papers which indicate that there can be a reduction in model predictive capability when transferring calibrated model parameters from wet to dry periods (Vaze et al., 2010; Merz et al., 2011; Coron et al., 2012). The modelling experiments carried out in this study suggest that the uncertainty of transferring model parameters from the calibration period to the first test period (the first 15 yr post-bushfire) is very small (difference in $B$ values between calibration and validation periods of 0.1–0.6) and it increases slightly when transferring the calibrated parameters from the calibration period to the second test period (after the first 15 yr post-bushfire). The 0.01–0.06 changes in $B$ from the calibration period to the first test period are much smaller than the impacts of the 1983 bushfire and the 0.07–0.11 changes in $B$ from the calibration period to the second test period are also smaller than the climate change impact on streamflow in the second period (Table 5). The results for these four neighbouring catchments provide confidence in the hydrological modelling results quantifying the impacts of climate variability and vegetation change for the three study catchments.

The hydrological modelling results for all the three catchments indicate that there is a substantial increase in streamflow in the first 15 yr after the 1983 bushfires that is not attributable to climate alone. An increase in streamflow in the early years is consistent with conceptual models of leaf area loss/ET decrease, as nearly 19% to 84% of the forest cover in the three catchments was burnt in the 1983 bushfires. A caveat though is that uncertainties in the fire intensities mean that we cannot be sure how
much canopy area was affected. The Bosch and Hewlett (1982) review of forest cover change and streamflow found that streamflow response to cover changes of <20% of catchment area could not be verified statistically.

The only hypothesis that supports the persistence of such increases after the first 3–5 yr is disturbance by subsequent logging activities (Fig. 1), which almost doubles the fire kill area for the Latrobe and Yarra catchments, and results in the largest area of ash disturbance at Starvation Creek. However, the large streamflow increases for Starvation Creek that can be attributed to the fire appear to be highly disproportionate to the fire-related mortality area of only 3%, and even once logging begins at this catchment the response apportioned to vegetation change appears to be quite high for the area affected.

There are two issues that require consideration if we are to accept the modelling results as representing real effects. Firstly, what processes could drive such large flow increase at Starvation Creek with a 3% mortality area, and secondly, how would the balance of disturbance/regrowth over two decades play out in streamflow changes for all catchments?

For Starvation Creek, the only plausible explanation for the early post-fire years is that there was a significant impact in the non-ash species that resulted in high canopy loss and low ET immediately after the fire. Rainfall in 1983 and 1984 was 1453 and 1541 mm, respectively (long term SILO mean is 1565 mm), which means there was a significant supply of potential water for streamflow. The catchment received 979 mm of rainfall between the fire (16 February) and 30 September 1983. Little ET could be expected from burnt areas during this period. An increase of this magnitude is less than that measured by Lane et al. (2006) for stands with almost complete canopy loss (but extensive alpine ash mortality). It is also consistent with early increases predicted and observed by Lane et al. (2010) using physically-based modelling for the 1533 km² Mitta Mitta catchment after the 2003 fires. Further, the dry period that preceded the Ash Wednesday fire was relatively short (rainfall in 1981 was 1515 mm and in 1982 it was 1243 mm), suggesting that soil moisture deficits were not extreme.
There is current unpublished research into the ecohydrology of recovering mixed species eucalypt stands that suggest water use may be high in early post fire years once seedling recruitment and leaf recovery begins (R. Nolan, personal communication, 2012). This would act to mitigate against the flow increases at Starvation Creek after 1984, but it may be that the post-fire rainfall (almost 1000 mm) recharged deep stores that fed the streamflow for some years. The low ash mortality also means there would be little effect in subsequent years of high water-using regrowth with an origin in 1983 or 1984. This may in part explain the scale of flow increases in the late 1990s.

The water gain/loss over time is the balance between lower and higher rates of ET relative to the pre-disturbance values as the ash stands recover. The conceptual model for ash ET is a decrease for 1–5 yr followed by an increase until age 25–30, then a return toward equilibrium rates over many decades. The fire disturbance followed by logging would result in different areas of the catchments in varying states of ET. It is notable that the three models show either flow decreases or (for Latrobe) a very small increase for the post 1998 period. This accords (at least relatively) with a trend toward high water use in the latter part of the record. However, the modelling suggests in some instances that the streamflow changes are due to climate rather than vegetation dynamics.

Finally, there is a background vegetation-hydrologic dynamic that may or may not have been dealt with by the calibration. The ash that was not subjected to fire or logging is ageing, and according to the Kuczera and Watson curves, is on a trajectory of increasing streamflow. Over the period of interest (1983–2000, 2004, 2007) we could expect flow increases in the order of 4% for 1983–1998 for Latrobe and Yarra catchments and 8% for Starvation Creek from the remaining ash stands, plus further increases for the post 1998 period. It could be argued that the good calibration results reflect the models’ ability to deal with this issue. If this is not the case then some of the flow increases may have been inflated in the first post-fire period, and perhaps decreases masked subsequently.
5 Conclusions

The hydrological modelling results for all the three catchments suggest that there was a substantial increase in streamflow in the first 15 yr after the 1983 bushfires that could not be accounted for by climate effects. There is a reasonable agreement between the bushfire and climate variability impacts on streamflow results for this first post-fire period from the three hydrological models for the Latrobe at Noojee, Starvation Creek and Yarra River at Little Yarra catchments. We hypothesise the flow increases were mainly caused by the loss of leaf area and tree morality because of the bushfires and associated reduction in interception and actual evapotranspiration. These increases are in agreement with the general pattern of significant annual water yield increase following forest disturbance reported in the literature, but the persistence of the inflow increases appears to be related to logging in the 1990s and early 2000s. The modelled flow responses for the post-1998 period are attributed to a combination of vegetation recovery after disturbance and climate factors as the lengthy drought developed. Flow decreases driven by vegetation are plausible for areas of regenerating mountain ash.

Uncertainties in this study arise from transferring of model parameters from calibration to test periods, imprecise knowledge on fire severity and associated impact
on non-ash species, the interplay of fire recovery, logging effects and a background vegetation-flow dynamic in these forests, and from distinct climate regimes over the period of the study. However the modelling has produced some interesting insights into fire and logging effects in SE Australian forests.

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Tomer, M. D. and Schilling, K. E.: A simple approach to distinguish land-use and climate-change effects on watershed hydrology, J. Hydrol., 376, 24–33, 2009.


**Table 1.** Catchments attributes and calibration and test periods.

<table>
<thead>
<tr>
<th>Catchment Code</th>
<th>Catchment Names</th>
<th>Burnt Area Percentage (%)</th>
<th>Catchment Area (km²)</th>
<th>Area Burnt (km²)</th>
<th>Period of record</th>
<th>Calibration Period</th>
<th>Test period</th>
</tr>
</thead>
</table>
Table 2. Mean annual streamflow, rainfall and areal potential evapotranspiration (APET) for different periods for the three catchments.

<table>
<thead>
<tr>
<th>Catchments</th>
<th>Streamflow (mmyr⁻¹)</th>
<th>Rainfall (mmyr⁻¹)</th>
<th>APET (mmyr⁻¹)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Latrobe at Noojee</td>
<td>304</td>
<td>356</td>
<td>217</td>
</tr>
<tr>
<td>Starvation Creek</td>
<td>417</td>
<td>523</td>
<td>315</td>
</tr>
<tr>
<td>Yarra River at Little Yarra</td>
<td>305</td>
<td>341</td>
<td>219</td>
</tr>
</tbody>
</table>

"start year" is the calibration start year of streamflow record.
"end year" is the end year of streamflow record.
Table 3. Hydrological model calibration results for the three catchments.

<table>
<thead>
<tr>
<th>Catchment Code</th>
<th>Catchment Names</th>
<th>AWRA-L NSE</th>
<th>AWRA-L B (%)</th>
<th>XAJ NSE</th>
<th>XAJ B (%)</th>
<th>GR4J NSE</th>
<th>GR4J B (%)</th>
</tr>
</thead>
<tbody>
<tr>
<td>226205</td>
<td>Latrobe at Noojee</td>
<td>0.78</td>
<td>−0.76</td>
<td>0.78</td>
<td>0.66</td>
<td>0.71</td>
<td>−0.57</td>
</tr>
<tr>
<td>229109</td>
<td>Starvation Creek</td>
<td>0.84</td>
<td>−0.20</td>
<td>0.80</td>
<td>2.65</td>
<td>0.67</td>
<td>2.29</td>
</tr>
<tr>
<td>229214</td>
<td>Yarra River at Little Yarra</td>
<td>0.85</td>
<td>0.39</td>
<td>0.85</td>
<td>1.80</td>
<td>0.83</td>
<td>−0.31</td>
</tr>
</tbody>
</table>

Impact of bushfire and climate variability on streamflow

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Table 4. Overview of the characteristics for the three hydrological models.

<table>
<thead>
<tr>
<th>Characteristics</th>
<th>AWRA-L</th>
<th>XAJ</th>
<th>GR4J</th>
</tr>
</thead>
<tbody>
<tr>
<td>Number of free parameters</td>
<td>17</td>
<td>14</td>
<td>4</td>
</tr>
<tr>
<td>Interception</td>
<td>An interception store</td>
<td>No interception store</td>
<td>A zero capacity interception store</td>
</tr>
<tr>
<td>Evapotranspiration</td>
<td>Rainfall interception evaporation; Soil evaporation; Open water evaporation; Groundwater evaporation; Transpiration</td>
<td>Three-layer evapotranspiration</td>
<td>One layer soil evaporation</td>
</tr>
<tr>
<td>Runoff production</td>
<td>Three layers soil moisture accounting store; Infiltration excess surface runoff and saturation excess runoff; Two hydrological response units</td>
<td>A soil moisture accounting store; Saturation excess runoff; Infiltration excess surface runoff and saturation excess runoff</td>
<td>Two unit hydrographs; A nonlinear routing store</td>
</tr>
<tr>
<td>Routing</td>
<td>No routing store</td>
<td>lag-and-route routing; A nonlinear routing store</td>
<td>Two unit hydrographs; A nonlinear routing store</td>
</tr>
</tbody>
</table>
### Table 5. Effects of bushfire and climate variability on the mean annual streamflow for the three catchments.

<table>
<thead>
<tr>
<th>Catchment</th>
<th>Periods (post-bushfire)</th>
<th>(\Delta Q_{\text{tot}})</th>
<th>(\Delta Q_{\text{veg}})</th>
<th>(\Delta Q_{\text{clim}})</th>
<th>(\Delta Q_{\text{veg}})</th>
<th>(\Delta Q_{\text{clim}})</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td>(relative to pre-bushfire)</td>
<td>mm\text{yr}^{-1}%</td>
<td>mm\text{yr}^{-1}%</td>
<td>mm\text{yr}^{-1}%</td>
<td>mm\text{yr}^{-1}%</td>
<td>mm\text{yr}^{-1}%</td>
</tr>
<tr>
<td>Yarra River at Little Yarra</td>
<td>36 12</td>
<td>38 12</td>
<td>–2 –1</td>
<td>20 7 16 5</td>
<td>33 11 3 1</td>
<td></td>
</tr>
</tbody>
</table>

\(\Delta Q_{\text{tot}}\) is the difference in observed streamflow between post- and pre-bushfire periods (Eq. 2).
\(\Delta Q_{\text{clim}}\) is the impact of climate variability on streamflow, calculated from the difference in simulated streamflow between the post- and pre-bushfire periods (Eq. 3).
\(\Delta Q_{\text{veg}}\) is the impact of vegetation change (bushfire) on streamflow, calculated from the difference between \(\Delta Q_{\text{tot}}\) and \(\Delta Q_{\text{clim}}\).
Table 6. Calibration and validation results for the GR4J model in four undisturbed catchments.

<table>
<thead>
<tr>
<th>Catchment code</th>
<th>Area (km²)</th>
<th>Calibration NSE (1975–1982)</th>
<th>Validation NSE</th>
<th>Calibration B</th>
<th>Validation B</th>
<th>B Difference (validation – calibration)</th>
</tr>
</thead>
<tbody>
<tr>
<td>405205</td>
<td>109</td>
<td>0.58</td>
<td>0.73</td>
<td>0.72</td>
<td>0.58</td>
<td>0.13</td>
</tr>
<tr>
<td>405227</td>
<td>632</td>
<td>0.83</td>
<td>0.84</td>
<td>0.85</td>
<td>0.77</td>
<td>0.07</td>
</tr>
<tr>
<td>405209</td>
<td>633</td>
<td>0.82</td>
<td>0.85</td>
<td>0.85</td>
<td>0.82</td>
<td>0.09</td>
</tr>
<tr>
<td>227202</td>
<td>1080</td>
<td>0.85</td>
<td>0.78</td>
<td>0.76</td>
<td>0.83</td>
<td>−0.01</td>
</tr>
</tbody>
</table>
Fig. 1. Location, bushfire extent and logging extent for the three catchments
Fig. 2. Cumulative percent of mortality/regrowth for three catchments: (a) mortality/regrowth for ash; (b) mortality/regrowth for all species.
Fig. 3. Variation of observed and simulated annual streamflow at the three catchments for AWRA-L model: Latrobe at Noojee (a), Starvation Creek (b), Yarra River at Little Yarra (c). Two dash lines are for years of 1982 and 1998, respectively.
Fig. 4. Variation of observed and simulated annual streamflow at the three catchments for XAJ model: Latrobe at Noojee (a), Starvation Creek (b), Yarra River at Little Yarra (c). Two dash lines are for year of 1982 and 1998, respectively.
Fig. 5. Variation of observed and simulated annual streamflow at the three catchments for GR4J model Latrobe at Noojee (a), Starvation Creek (b), Yarra River at Little Yarra (c). Two dash lines are for years of 1982 and 1998, respectively.
Fig. 6. Summary of bushfire impact on annual streamflow in mm from the year 1983 to the end year of streamflow record for the three catchments. White boxplots are bushfire impact from the year 1983 to 1998, and gray ones are from the year 1999 to the end year of record. For each catchment, the three white/gray boxplots represent total streamflow change in mm relative to pre-bushfire period (horizontal line), vegetation change impact on streamflow in mm (without notch), climate change impact on streamflow in mm (with notch), respectively.
Fig. 7. Summary of bushfire impact on annual streamflow from the year 1983 to the end year of record in percentage for the three catchments. White boxplots are bushfire impact from the year 1983 to 1998, and gray ones are from the year 1999 to the end year of record. For each catchment, the three white/gray boxplots represent total streamflow change relative to pre-bushfire period in percentage (horizontal line), vegetation change impact on streamflow in percentage (without notch), and climate change impact on streamflow in percentage (with notch), respectively.