A simple storage based floodplain inundation modelling approach in AWRA-R for estimating floodplain fluxes

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Abstract: Floodplains are a critical part of the natural environment and they play important ecological and hydrological roles in river basins. For example, the Murray-Darling Basin (MDB) in Australia has over 30,000 floodplains and wetlands, which provide a range of ecological benefits.

The Australian Water Resources Assessment (AWRA), built as part of the Water Information Research and Development Alliance (WIRADA) between CSIRO and the Bureau of Meteorology (BoM), is designed to support BoM in the production of the National Water Accounts and AWRA reports, which provides an overview of water fluxes and storages at the national scale. AWRA-R, one of the three components of the AWRA system, focuses on river systems including fluxes and storages in floodplains. A simple storage based approach was designed within the AWRA-R modelling platform to model floodplain fluxes and storages. During any flood event, flow in a river reach within a floodplain is partitioned into two components, instream and overbank flow, based on the in-stream capacity. A flood volume-area relationship, derived from MODIS-SRTM based inundation volume-area time series, is used to estimate flooded area for the overbank flow. The losses due to evaporation and groundwater recharge from the floodplain are calculated using the estimated flooded area.

The model was implemented in all floodplain river reaches across the MDB. The inundation modelling parameters were calibrated as part of the step-wise calibration of the AWRA-R model. The model has produced the daily time series of floodplain stores and fluxes. The mass-balance analysis shows that the long term mass-balance error was negligible for all floodplain reaches.

Keywords: Flood inundation modelling, River System model, Wetlands, Murray-Darling Basin, Water Resources Planning, Water Resources Accounting

1. INTRODUCTION

The Australian Water Resources Assessment system (AWRA) is developed jointly by CSIRO and the Australian Bureau of Meteorology as part of the Water Information Research and Development Alliance (WIRADA). The system supports the Bureau in the production of the National Water Accounts (NWA) and the Australian Water Resources Assessment (AWRA) reports, which provides an overview of water fluxes and storages at the national scale. Both products implement the Water Balance Framework introduced by Barratt (2008). The AWRA system is built around three components covering different parts of the water cycle: AWRA-L is the landscape component, AWRA-R focuses on river systems and AWRA-G covers the groundwater. The core objective of the AWRA-R model is to support the production of the NWA and AWRA reports. The NWA reports the status of water resources for a given set of reporting regions over a defined water year. Reporting revolves around useable water in the surface water store (rivers and reservoirs), the groundwater store, an irrigation store where appropriate, and an urban store where appropriate. AWRA-R is developed to estimate terms particularly relating to the surface water store, with various NWA fluxes (Lerat *et al.*, 2013).

Floodplains and wetlands are a critical part of natural environment and they play important hydrological and ecological roles in river basins. Water management authorities and river managers require detailed understanding of overbank flows and floodplain fluxes to plan environmental flows to optimise the environmental benefits to the riparian ecosystem. Satellite based techniques (Shaikh *et al.*, 2001; Colloff *et al.*, 2010) and hydrodynamic models (Dutta *et al.*, 2007) are widely used for floodplain inundation mapping and modelling. However, it is cumbersome to integrate these approaches with any of the existing river system models, which are integral parts of water resources accounting, planning and management (Dutta *et al.*, 2012; Welsh *et al.*, 2013; Dutta *et al.*, 2013).

The main aim of this research was to develop a simplified methodology for flood inundation simulation within AWRA-R river system modelling framework to enhance the flood inundation modelling capability for quantifying floodplain fluxes. Towards estimating the floodplain leakage, evaporation and storage more accurately, two conceptual storage-based approaches were designed. The first approach is a simple storage-based method suitable for data limited environments. The second approach is more comprehensive and suitable for areas with high resolution data such as LiDAR topography data. The paper describes the first approach and its implementation across the floodplains in the Murray-Darling Basin.

2. METHODOLOGY

AWRA-R is a conceptual hydrological model, in which a river system is schematised into a simplified river network using a node-link structure. The river network begins and ends with a node, and all nodes are interconnected by links. Runoff from gauged or ungauged tributaries or local contributing area between two nodes is fed into the connecting link as an inflow at the relevant location and all other physical processes (such as diversions, groundwater fluxes, overbank occurring between the two nodes flow) are incorporated in the model. A step-wise auto-calibration procedure is used for calibration of AWRA-R (Hughes et al., 2013). For a river reach (Figure 1), the general form of the water balance equation used in the updated auto-calibration procedure (incorporating overbank flow component) for a reach is as follows:



Figure1. Conceptual representation of a river reach within AWRA-R

$$\widehat{Q_{d/s}} = (Q_{u/s})_{rout} + Q_r + Q_s - Q_d + Q_p - Q_e - Q_a - Q_{fp} + Q_{fpr} - Q_{gw}$$
(1)

where, $Q_{d/s}$ is the estimated flow at the downstream gauge, $Q_{u/s}$ is concurrent flow at the upstream gauges (including gauged tributaries) following routing, Q_r is the runoff locally generated, Q_s is the contribution from any storages including rainfall on storage area, evaporation from storage area and change in storage volume, Q_d is the loss due to irrigation diversion, Q_p and Q_e are the fluxes to and from the river due to rainfall and evaporation, respectively, Q_a is the flow diverted to anabranches, Q_{fp} is overbank flow to floodplain, Q_{fpr} is return flow from floodplain, Q_{aw} is the flux from river to groundwater.

2.1. Storage-based inundation modelling approach

This approach is developed from first principles relating to water balance and system dynamics. A river reach in a floodplain is considered to have two storages: in-stream storage and floodplain storage (Figure 2). During a flood event, flow in a floodplain river reach is partitioned into two components, in-stream and overbank flow, based on the average in-stream storage capacity. The in-stream capacity is estimated by averaging the river channel volumes (upto the bank threshold) of the u/s and d/s gauges using the cross-section data at the two nodes. It is assumed water from a river reach spills over to the adjacent floodplain if flow volume exceeds the in-stream storage capacity. The water balance equation for a floodplain along a river reach is shown below.





Figure 2. Conceptualisation of river and floodplain storages

where, $\widehat{V_{fp(t)}}$ is the estimated floodplain storage at current timestep, $V_{fp(t-1)}$ is the floodplain storage at previous time step, Q_{fp} is overbank flow to floodplain, Q_{fpr} is return flow from floodplain, P is precipitation rate, ET is evaporation rate, GWS is saturated infiltration rate and A_{fp} is average floodplain area.

In the auto-calibration procedure, overbank flow from a river reach to the adjacent floodplain is calculated based on the average in-stream storage capacity of the reach. It is assumed that water from the river reach will spill over the floodplain when the flow rate becomes larger than the in-stream storage capacity. The rate of overbank flow is estimated using the following equation.

$$\widehat{Q_{fp}} = \begin{cases} 0, Q_0 < 0 \\ Q_0, 0 < Q_0 < 1 \\ Q_0^a, Q_0 \ge 1 \end{cases}$$
(3)

where, Q_0 is flow defined as $Q_0 = (Q_{u/s} + Q_g - Q_l)_{rout} - V_{sc} / \Delta t$, V_{sc} is the in-stream capacity, and *a* is a coefficient (ranges between 0 to 1), which is calibrated as part of the auto-calibration procedure.

To calculate net loss from or gain to floodplain due to evaporation, groundwater infiltration and rainfall, the flooded area was estimated from the floodplain storage volume using a linear volume-area relationship as shown below;

$$\widehat{A_{fp}} = \Theta V_{fp} \tag{4}$$

where, $\widehat{A_{fp}}$ is the estimated inundation area (unit: m²), V_{fp} is the floodplain storage (unit: m³) obtained from equation (2) and θ is a coefficient. This coefficient was initially derived from the time series of MODIS satellite imagery and SRTM DEM for all modelling reaches (Gouweleeuw *et al.*, 2011). However, the derived values for many reaches were found to be very low and finally, it was decided to use the minimum slope value of 0.5 (based on LiDAR analysis in few reaches). The return flow from floodplain is estimated as follows:

$$\widehat{\mathbf{Q}_{\text{fpr}}} = \begin{cases} \alpha V_{\text{fp}}^{\beta}, \ V_{\text{fp}} < \alpha^{1/(1-\beta)} \\ V_{\text{fp}}, \ V_{\text{fp}} \ge \alpha^{1/(1-\beta)} \end{cases}$$
(5)

where, $\alpha < l$ and $\beta \ge 1$ are two calibrating parameters, calibrated as part of the auto-calibration procedure. If $\beta = 1$, the equation system (5) reduces to $\widehat{Q_{\text{fpr}}} = \alpha V_{\text{fp}}$.

3. STUDY AREA AND DATA

The Murray-Darling Basin (MDB) is the second largest Australian river basin covering an area of approximately 1 million km². The transboundary river basin, shared by four states and one territory, is Australia's most important agriculture region producing one third of Australia's food supply. For the purpose of modelling, the entire MDB was divided into 18 contiguous regions based on the regional boundaries used in the Murray-Darling Basin Sustainable Yields Project (CSIRO, 2008) (Figure 3a). AWRA-R includes all regions except the Eastern Mount Lofty Ranges (EMLR) region, which represents less than 1% of the total area of the basin and does not contribute significant water to the Murray River. Not all modelling reaches of a river system are located in floodplains and for implementation of the inundation modelling, it is required to

identify the modelling reaches that are located in the floodplains. A 1:100 year return period maximum flood inundation extent map derived from MODIS satellite imagery (Figure 3b) (Chen *et al.*, 2012) was used to identify the flood reaches in MDB. The daily time series of inundation volume and area of historical floods developed by Gouweleeuw *et al.* (2011) using MODIS imagery and SRTM DEM were used to establish the volume-area relationships for different floodplain reaches. Saturated infiltration rates for the floodplains connecting different modelling reaches were derived based on the regional soil texture classification map of Australia (Henderson *et al.*, 2001). Figure 3c shows the texture classification map of MDB showing five classes maps for the topsoil model: sands, sandy loams, loams, clay loams / light clays and clays.



Figure 3. Maps of the Murray-Darling Basin showing a) modelling regions; b) maximum extent of 1:100 yr return period inundation map; and c) soil texture classes for top layer

4. RESULTS AND DISCUSSION

Flood inundation modelling in AWRA-R was implemented in 216 reaches of the MDB. The modelling parameters were calibrated as part of the step-wise calibration of AWRA-R model for all components including the parameters of flow routing and groundwater monod functions for the period of 1975-1999. The model was validated using more recent data for 2000-2012. The flood module was invoked in the joint calibration for floodplain reaches and the parameters were calibrated with the observed downstream flow data. There was no other ground based observed data available for calibration of the parameters of the inundation model. Many of the floodplain reaches are located within the environmental assets of MDB and these floodplains are highly



Figure 4. Statistics of NSE and Bias during the calibration and validation of the selected floodplain reaches

significant for the biodiversity and aquatic ecosystem of the basin. Several studies were undertaken to model and map the inundation characteristics in these areas of MDB for improving the environmental flow in the wetland ecosystem of the basin (Colloff *et al.*, 2010). Chen *et al.*, 2012 divided the basin into 95 ecohydrological zones and listed the flow gauging stations located within the environmentally sensitive areas of the basin. Table 1 shows lists of the modelled AWRA-R floodplain gauges that are included in the list. Table 2 presents the statistics of calibration and validation of the AWRA-R model for these selected floodplain reaches. Figure 4 presents the summary of the daily NSE and bias for these reaches for the periods of calibration and validation. The results show that the performance of the AWRA-R flood inundation model are highly satisfactory in most of the floodplain reaches with median NSE of 0.76 and mean bias of 14.3% in calibration. The calibrated parameters of AWRA-R including the calibrated floodplain parameters performed well in the validation period with median NSE of 0.79 and median bias of 23.2%, which are close to the results obtained in the calibration period. Out of the 27 selected gauges, the model did not perform well in one reach (end gauge 418052) in the calibration with NSE below zero and for three gauges reaches (412011, 418055, 421040) the calibrated NSE were below 0.5. For these gauges, the calibrated model did not perform well in the validation period as well. The floodplain reaches consist of 37% of the total modelling reaches of AWRA-R in MDB. To understand relative performance of AWRA-R model in floodplain reaches compared to the overall performance, the statistical summary of the performance of the model in floodplain reaches are compared with the overall model performance for different regions. Figure 5 compares the average NSE statistics of the model for the floodplain reaches and the entire region for different regions of MDB for the entire period of simulation. The results of Paroo, Moonie, Warrego and Wimmera are not included as the number of floodplain reaches in these regions is less than 3. The results show that for most of the regions (Condamine-Balonne, Namoi, Macquarie-castlereagh, Lachlan, Murrumbidgee, Goulburn-Broken and Loddon-Avoca), the agreement between of the observed and simulated flow in floodplain reaches are similar to other reaches. The agreements are better in floodplain reaches for Barwon-Darling and Murray regions. For the Border rivers and Gwydir regions, the agreement in floodplain reaches were lower than the regional average. The variability was lower in most of the regions except for the Campaspe region. The lengths of the recorded data at many of the gauging stations in Campaspe are relatively short with many missing points. Dutta *et al.*, 2012 reported similar uncertainty in river system modelling in Campaspe.

Region	End gauge of floodplain reach	Reach	Max recorded	Max Flooded
-		length	discharge	area (km ²)
		(km)	(ML/day)	(modelled)
Border Rivers	416012 (Macintyre@Holdfast; Yelarbon Crossing)	50	117,189	234
Condamine Balonne	422015 (Culgoa@Brenda)	57	77,821	110
Condamine Balonne	422016 (Narran at Wilby Wilby)	132	10,914	89
Condamine Balonne	422213 (Balonne@Weribone)	178	339,527	246
Condamine Balonne	422325 (Condamine@Cotswold)	152	353,873	260
Condamine Balonne	422401 (Maranoa@Mitchell)	98	131,195	165
Condamine Balonne	422404 (Maranoa@Cashmere)	177	126,011	156
Gwydir	418001 (Gwydir@Pallamallawa)	49	155,451	184
Gwydir	418052 (Carole Creek at Near Garah)	61	8,955	55
Gwydir	418055 (Mehi@near Collarenebri)	176	9,423	58
Lachlan	412011 (Lachlan at Lake Cargellico Weir)	44	12,487	19
Macquarie Castlereagh	421025 (Macquarie@Bruinbun)	176	168,628	88
Macquarie Castlereagh	421040 (Macquarie@D/S Burrendong Dam)	88	176,614	148
Moonie	417001 (Moonie@Gundablouie)	37	43,607	116
Murray	401202 (Mitta Mitta River at Mitta Mitta)	146	49,211	37
Murray	402205 (Kiewa@Bandiana)	154	39,594	93
Murray	409002 (Murray@Corowa)	107	190,601	148
Murrumbidgee	410001 (Murrumbidgee@Wagga Wagga)	131	443,820	289
Murrumbidgee	410004 (Murrumbidgee@Gundagai)	27	456,704	24
Murrumbidgee	410130 (Murrumbidgee@D/S Balranald Weir)	13	26,951	72
Namoi	419006 (Peel@Carrol Gap)	68	136,679	133
Namoi	419007 (Namoi@D/S Keepit Dam)	47	104,397	134
Namoi	419020 (Manilla@Brabri (Merriwee)	23	40,115	77
Namoi	419026 (Namoi@Goangra)	66	109,948	129
Namoi	419068 (Namoi@D/S Weeta Weir)	16	64,038	178
Ovens	403200 (Ovens@Wangaratta)	49	53,303	125
Paroo	424002 (Paroo@Willara Crossing)	99	225,117	147

4.1. Floodplain Fluxes and mass balance

One of the key objectives of the inundation model was to produce floodplain fluxes. Figure 6 shows the daily time series of four floodplain fluxes: 1) overbank flow to floodplain, 2) return flow from floodplain, 3) net loss from floodplain due to evaporation and groundwater recharge, and 4) floodplain storage volume, for two floodplain reaches in Paroo and Moonie for the entire period of simulation. As can be seen from the figure, for all flood events, flux terms in floodplain are produced by the model. The variation of flooded area over time during the flood events are also shown in the figure. The mass-balance analysis shows that the long term mass balance error was negligible for all floodplain reaches.

Table 2. Statistical summary of calibration and validation of the selected floodplain reaches

End	calibration				Validation					
gauge ID	start	end	bias	NSE	NSELOG	start	end	bias	NSE	NSELOG
401202	24/07/1974	8/05/1997	-0.10	0.91	0.94	9/04/1992	3/11/2011	-0.13	0.90	0.91
402205	1/01/1970	7/07/1993	0.00	0.82	0.94	7/07/1988	3/01/2012	0.06	0.85	0.98

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403200	2/11/1985	20/10/1993	0.22	0.59	0.73	20/10/1988	6/10/1996	0.23	0.56	0.73
409002	1/01/1970	14/05/1993	-0.01	0.98	1.00	14/05/1988	15/06/2011	-0.01	0.98	1.00
410001	1/01/1970	4/11/1992	0.00	0.93	0.99	5/11/1987	7/09/2010	0.04	0.93	0.99
410004	1/01/1970	27/10/1992	0.00	0.89	0.97	28/10/1987	23/08/2010	0.00	0.91	0.97
410130	29/06/1979	9/11/1997	-0.13	0.76	0.80	9/11/1992	17/05/2011	0.06	0.74	0.89
412011	25/09/1970	12/10/1993	0.00	0.43	0.58	12/10/1988	7/12/2011	-0.34	-0.41	0.13
416012	26/10/1972	17/01/1995	-0.02	0.78	0.96	17/01/1990	25/02/2011	0.09	0.77	0.97
417001	18/12/1970	6/09/1993	-0.01	0.93	0.98	6/09/1988	19/05/2011	-0.03	0.97	0.99
418001	2/09/1972	26/06/1994	0.00	0.87	0.98	26/06/1989	9/03/2011	0.03	0.83	0.98
418052	9/10/1980	22/07/1998	-0.01	-0.36	-1.68	22/07/1993	28/06/2011	0.22	-0.31	-1.70
418055	19/06/1980	21/12/1998	-0.01	0.23	0.36	30/08/1993	18/05/2011	-0.17	0.36	0.50
419006	6/03/1973	22/10/1994	0.00	0.67	0.88	22/10/1989	31/05/2011	0.26	0.80	0.96
419007	27/06/1973	25/12/1994	0.00	0.53	0.46	25/12/1989	31/05/2011	0.13	0.21	0.14
419020	2/02/1977	5/12/1996	-0.01	0.82	0.93	6/12/1991	2/06/2011	0.21	0.92	0.98
419026	10/02/1971	12/03/1994	-0.01	0.85	0.95	12/03/1989	3/05/2011	0.10	0.89	0.97
419068	3/11/1978	19/07/1997	0.01	0.62	0.85	3/11/1978	19/07/1997	-0.11	0.57	0.87
421025	1/01/1970	6/04/1993	0.00	0.61	0.81	29/02/1988	17/05/2011	0.38	0.66	0.86
421040	18/12/1970	13/05/1994	-0.06	0.32	0.62	28/04/1989	26/05/2011	0.14	0.26	0.59
422015	1/01/1970	28/01/1993	-0.01	0.89	0.96	5/12/1987	28/02/2011	0.16	0.89	0.94
422016	1/01/1970	4/11/1994	0.00	0.69	0.85	7/05/1989	12/08/2011	0.34	-0.53	-0.30
422213	1/01/1970	27/12/1993	0.00	0.74	0.90	20/07/1988	1/07/2011	0.04	0.80	0.96
422325	1/01/1970	18/05/1994	-0.04	0.86	0.95	16/01/1989	15/02/2011	0.01	0.89	0.96
422401	20/11/1972	14/09/1996	-0.35	0.69	0.87	23/03/1989	29/06/2011	-0.19	0.61	0.76
422404	27/02/1970	29/03/1992	-0.07	0.82	0.93	6/03/1986	29/06/2011	-0.11	0.79	0.93
424002	30/11/1975	9/01/1996	0.00	0.67	0.85	9/01/1991	18/02/2011	0.22	0.87	0.92



Figure 5. Statistics of average NSE for the region (left) and for the reaches located within the floodplains for the simulated and observed flows for different regions of MDB

5. CONCLUSIONS

This paper describes the development and implementation of the floodplain inundation component of AWRA-R modelling system. A simplified storage-based floodplain inundation modelling approach was successfully developed for AWRA-R model and tested in the Murray-Darling Basin. The approach is a single storage approach, where river flow is partitioned into in-stream and overbank flow based on the in-stream flow capacity in floodplain reaches. The approach was implemented in all floodplain reaches of MDB.

AWRA-R model with the floodplain inundation module performed reasonably well in most of the floodplain reaches in both calibration and validation periods. The NSE values of the simulated results in floodplain reaches in most of the regions (Condamine-Balonne, Namoi, Macquarie-Castlereagh, Lachlan, Murrumbidgee, Goulburn-Broken and Loddon-Avoca) were similar to the overall regions. The agreements are better in floodplain reaches for Barwon-Darling and Murray regions. For the Border Rivers and Gwydir regions, the agreements in floodplain reaches were less than the regional average. The variability was lower in most of the regions except for the Campaspe region. Average bias in the floodplain reaches in most of the regions is similar. The model has produced the daily time series of floodplain stores and fluxes. The mass-balance analysis shows that the long term mass balance error was negligible for all floodplain reaches. The approach significantly improves the flood inundation modelling capability of the AWRA-R river system model and improves the water balance analysis by quantifying the flux terms for water accounting.



End gauge: 417001 (Moonie) **Figure 6.** Daily time series of floodplain fluxes

along a floodplain reach in Moonie

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