

ENVIRONMENT REPORT

AN ECOLOGICAL RISK ASSESSMENT OF THE LOWER WIMMERA RIVER

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Small, disconnected, saline pool at the site: Wimmera River u/s Ellis Crossing, Spring 2007

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EXECUTIVE SUMMARY

Ecological risk assessment (ERA) is a formal process for determining the risk posed by one or more threats (stressors, hazards) to the health of ecosystems. It addresses the difficulties in assessing multiple threats for a range of species within naturally variable ecosystems. Such assessments provide an explicit and transparent process to inform management decisions in ecosystems where processes may not always be fully understood.

The ERA conducted in this study focused on the ecological health of the lower Wimmera River, a highly stressed system in the north west of Victoria. The river experiences saline groundwater intrusion and long periods where there is little or no flow. As a consequence, the salinity of the river can reach levels that are harmful to many plants and animals, and, in some sections, the salinity is up to twice that of seawater. Increased salinity and low flows also result in low dissolved oxygen problems.

The Wimmera Catchment Management Authority (WCMA) identified the lower Wimmera River as a priority reach for environmental flow release management. The aims of this risk assessment were to provide a better understanding of risks to river health and evaluate the effectiveness of different environmental flow management options in reducing these risks.

A Bayesian decision network was developed to assess key water quality parameters, macrophytes, habitat quality and macroinvertebrate community diversity. Sensitivity analysis showed that salinity had the greatest influence and that flow, in particular the delivery of freshes, was the key driver of salinity levels in the river.

The WCMA receive an annual environmental flow allocation under the Bulk Entitlement Conversion Process. The network can be used to determine the optimal flow delivery regime of any given allocation volume for river health improvement. The network can predict water quality levels, macrophyte health and macroinvertebrate community diversity under a range of climatic conditions.

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ACRONYMS

1. INTRODUCTION

The Wimmera Catchment Management Authority (WCMA) recognises the value of the Wimmera River. They have identified the lower Wimmera River as a priority reach for management, as it is of high ecological value, yet is highly stressed and regarded as degraded (WCMA, 2005; WCMA, 2007). Of particular concern are the pools which act as refuges for fish populations and other aquatic animals, macrophytes and water birds. These values are currently threatened by low flows, deteriorating water quality (mainly increasing salinity), and loss of habitat (WCMA, 2007). Environmental flow management is believed to be central to restoring water quality and ecological health in the river (SKM, 2002; WCMA, 2006).

Environmental flow recommendations for the Wimmera catchment were determined through the Stressed Rivers project and Bulk Entitlement Conversion Process (SKM, 2002; Victorian Government, 2004). Environmental flow objectives were established to facilitate the restoration of biological, chemical and physical functions in the lower Wimmera River. The WCMA is now responsible for managing these deliveries under the Wimmera-Mallee Bulk Entitlement arrangements (Victorian Government, 2004).

Environmental flows have the potential to: increase connectivity between pools, improve water quality within pools (reducing salinity and improving dissolved oxygen), cover low lying bars and woody debris, which provides instream habitat, and provide for the growth of aquatic plants (WCMA, 2005). The volume of water the WCMA receives for environmental flows depends on the total volume available in the Grampians Wimmera Mallee Water storages. When storages are not at full capacity, they receive a reduced allocation, relative to the amount available. To date, they have not received a full annual allocation for environmental flows. This trend is expected to continue with climate change and drought conditions continuing to decrease water availability. Therefore, the challenge for the WCMA is selecting the optimum flow scenario, for the volume of water available, that will result in the greatest environmental gain.

EPA Victoria in collaboration with the WCMA conducted an ecological risk assessment (ERA) of the lower Wimmera River. The aim of this ERA was to identify risks to the river and to provide information and tools to assist in managing these risks with environmental releases. The large pool of existing information and targeted monitoring data collected as part of this project was used to build a quantitative tool: a Bayesian Network (see Section 3). This predictive tool will aid in decision-making for management of environmental flow allocations to protect the lower Wimmera River ecosystems.

1.1 The study area

The Wimmera River is situated in the semi-arid, northwestern part of Victoria and has a total catchment area of 2,401,130 ha. It is Victoria's largest endoreic river and one of its most variable rivers with regard to annual discharge (Anderson and Morison, 1989).

The Wimmera River has been regulated since the 1840's, resulting in considerably reduced stream flow and an altered flow regime (Anderson and Morison, 1989). Even so, in the past the system has been a reliable source of surface water. However, with the introduction of the Wimmera-Mallee Stock and Domestic Supply (WMSDS) for the purpose of water distribution in the area, natural flow regimes have been substantially altered (Anderson and Morison, 1989; Lind, 2004). Some of the open channels of this supply network have recently been replaced with more efficient underground pipelines in an effort to save water. However, since 1997 the catchment has experienced below average rainfall and periods of severe drought (Bureau of Meteorology, 2008), which have further exacerbated alterations to natural flow regimes (see Figure 1).

The combination of these factors has had a dramatic effect on the volume of water within streams in this catchment, resulting in greatly reduced flows (Butcher, 2007; EPA 2008) and increase water quality impacts. Twenty years of ecological monitoring has shown that flow and water quality issues are critical factors affecting the health of the lower Wimmera River ecosystems (Anderson and Morrison, 1989; EPA Victoria, 1993; WCMA, 2006).

The lower Wimmera River is defined as the section of river downstream from Horsham to Lake Hindmarsh (see Figure 2). It is of high environmental value and contains many sections of relatively intact riparian and instream vegetation, a Heritage River section (proclaimed under the *Heritage Rivers Act 1992*) and many threatened fauna species (WCMA, 2006).

According to the *Index of Stream Condition* (ISC) report (DSE, 2005), the lower Wimmera River between Horsham and Dimboola is in moderate condition. This reach is characterised by sections of relatively intact riparian vegetation. Downstream of Dimboola the river is generally in poor condition, with both poor water quality and clearing of native riparian vegetation identified as the greatest causes of degradation (DSE, 2005).

Figure 1: Average daily discharge (ML/day) at Horsham gauge from 01/01/1988 to 03/01/2007(VWQMN Site 415200)

Figure 2: Map of the lower Wimmera River downstream of Horsham and the location of ERA flow sites, with an inset of the Wimmera catchment and the Wimmera River in the context of Victoria.

1.2 The ecological risk assessment (ERA) process

ERA is a formal process for determining the risk posed by one or more threats (stressors, hazards) to the health of ecosystems (USEPA, 2001). It provides an explicit and transparent way to deal with the complexity of assessing and making management decisions for aquatic systems.

The three phases of an ERA are:

- **problem formulation** (Section 2), which involves identifying values and threats, the relationships between these and developing a risk analysis plan
- risk analysis (Section 3), which assesses the likelihood that a threat(s) will impact an ecosystem and the effects of such an impact
- **risk characterisation** (Section 4), which is the evaluation and reporting of the problem formulation and risk analysis results, providing the information needed for decision-making and risk management.

The ERA approach systematically organises and evaluates data, information, assumptions and uncertainties to assess risks. It identifies key knowledge gaps and can be used to assess the effectiveness of various management actions in reducing risks.

Figure 3 shows the framework and activities conducted for the lower Wimmera River ERA. The activities directly link with the decision-making processes associated with catchment management. This framework is based on current nationally, and internationally, accepted risk assessment frameworks (Suter, 1993; USEPA, 1998; ANZECC and ARMCANZ, 2000; USEPA, 2001; Hart et al., 2005; Burgman, 2005, USEPA, 2008).

Figure 3: Summary of the lower Wimmera ecological risk assessment project, and linkage to Wimmera catchment management processes

2. PROBLEM FORMULATION

Problem formulation determines the focus and scope of the risk assessment and the type of management information required. In the ERA this involved:

- identification and engagement of relevant stakeholders and experts
- collation and integration of available information and data from previous studies and catchment reports
- development of the scope of the ERA
- identification of the priority ecological values to protect, maintain and/or rehabilitate with environmental flow allocations
- selection of the key values on which to conduct the risk assessment
- identification of the main threats (hazards, stressors) to these key values
- development of a conceptual model of the relationships between values and threats
- selection of assessment and measurement end points for the key values;
- identification of catchment management information needs
- development of a risk analysis plan.

During this phase, stakeholder and ecological expert workshops were held, along with ongoing discussions with WCMA staff and ecological experts, and an extensive review of catchment and scientific reports and studies. This process was interactive and iterative as more information became available. The participants in the stakeholder workshops are given in Appendix A.

2.1 Scope

Stakeholders defined the spatial scope of the ERA as the Wimmera River downstream of Horsham (see Figure 2). This is the area of the river that is influenced by environmental flows released from Taylors Lake and the MacKenzie River. The temporal scope of the ERA was identified as drought and non-drought conditions.

2.2 Identification of ecological values

During the stakeholder workshops, a range of ecological values were identified for protection, maintenance or rehabilitation with environmental flow allocations. A full list of these values is presented in Appendix B. They were largely based around values previously identified in the *Wimmera Regional Catchment Strategy* and the *Stressed Rivers Report* (WCMA, 2003; SKM, 2002).

Following initial discussions, stakeholders determined the key values that formed the basis of the risk assessment. These were biodiversity and good water quality for biota.

These values were chosen by stakeholders to encompass the range of values listed in Appendix B.

2.3 Identification of threats to ecological values

Stakeholders discussed the main threats to biodiversity and good water quality. A list of these threats is presented in Appendix C. The factors that influence the likelihood of the risks occurring were also considered. For example, high salinity is a threat to biodiversity. The factors that may influence an increase in salinity include a reduction in flow volume and the presence of saline groundwater intrusion.

Stakeholders identified the priority threats to biodiversity as:

- low flows
- reduced habitat availability
- deteriorating water quality, in particular increasing salinity levels and decreased dissolved oxygen.

Stakeholder discussions regarding the threats to ecological values, the relationships between them, and potential management scenarios, facilitated the construction of a conceptual model.

2.4 Conceptual model

A conceptual model is a visual representation of the predicted relationships between values, threats and the factors influencing the likelihood of risk(s) occurring.

Conceptual models are useful in representing the current knowledge of the ecosystem or parts of the system (Hart et al., 2005). They are particularly useful when there are multiple threats that need to be considered and they can be used to help develop hypotheses for potential cause-effect relationships (Ferenc and Foran, 2000).

The conceptual model built by the stakeholders is given in Figure 4. It represents the workshop participants' understanding of the key threats to biodiversity and good water quality for biota in the lower Wimmera River, and the relationships between these parameters. It also incorporates factors that can influence the likelihood of risk to the ecosystem, e.g. reduced flow volume and the allocation of environmental flows.

It should be noted that good water quality for biota is not represented in the conceptual model by a single parameter. Instead, it is separated into the key water quality parameters that are deemed important for maintaining biodiversity in the Wimmera River. For example, water quality with suitable salinity and dissolved oxygen levels is a requisite for a healthy ecosystem. Importantly, water quality can be considered primarily as a value to be protected (i.e. good water quality for biota) as well as a threat (e.g. toxic salinity levels).

2.5 Assessment and measurement end points

End points are selected to measure/monitor the key values being assessed. Assessment end points are explicit expressions of the values to be protected. Measurement end points are a definable measure of assessment end points. End points differ from management goals by their neutrality and specificity. That is, they do not represent a desired state or goal: they are defined by specific measurable components, and provide a means of measuring stress-response relationships (Suter, 1993; USEPA, 1998).

The end point for this risk assessment needed to be sensitive to the effects of environmental flow delivery. In addition, it had to be predictable and measurable, unambiguously defined, responsive to the priority threats and biologically relevant to the values identified.

The assessment end point selected by the stakeholders to assess biodiversity and good water quality for biota was **macroinvertebrate community diversity** (macroinvertebrates include aquatic animals such as insects, snails, worms and shrimps). The assessment end point was selected because:

- macroinvertebrates are an important component of river fauna
- there is in-depth knowledge of how macroinvertebrate community diversity relates to key aspects of river health (e.g. water quality)
- there are standard methods for measuring community diversity such as the biological indices Australian River Assessment System (AUSRIVAS), Stream Invertebrate Grade Number Average Level (SIGNAL) and Number of Families
- macroinvertebrates are relatively easy to sample and they are part of current and future river health monitoring in the Wimmera catchment.

The measurement end point for assessing macroinvertebrate community diversity was determined by macroinvertebrate experts at EPA Victoria. They chose the macroinvertebrate biotic index (MBI) as the measurement end point, as it is a measure that aggregates all the standard macroinvertebrate indices into one score (EPA Victoria, unpublished). The MBI is calculated in the same manner as the Aquatic Life score in the ISC (Ladson and White, 1999); however it incorporates all available macroinvertebrate indices (AUSRIVAS /Key families, SIGNAL, Number of Families and Ephemeroptera Plecoptera and Trichoptera [EPT]). The EPT index was not used in the MBI score since these fauna are not common to the Murray and Western Plains areas of Victoria.

The aggregated MBI score is a single value between 0 and 10. MBI scores are translated using categories for ease of interpretation. The categories are: 0-2 very

poor; 3-4 poor; 5-6 moderate; 7-8 good; and 9-10 very good.

In addition to the macroinvertebrate community diversity end point, the stakeholders identified sustainable populations of freshwater catfish (listed in the *Flora and Fauna Guarantee Act 1988*) as another end point. This was measured using the abundance of breeding populations and recruitment of juvenile catfish. The University of Melbourne completed the risk analysis for this end point and the analysis is not addressed in this report. For more information please refer to the published report by Chee et al., (2005).

2.6 Risk analysis plan

The risk analysis plan summarises the problem formulation phase and details the design for the risk analysis phase. The plan was developed from the conceptual model and information and data collected during problem formulation. The aims of the risk analysis were to:

- quantitatively assess the level of risk posed to the two key ecological values (as measured by the end point)
- provide a better understanding of the factors influencing the consequences and likelihood of risks occurring

• assess the effectiveness of environmental flow management scenarios for mitigating these risks. The risk analysis plan involved three stages. These were:

- construction of a targeted sampling program to aid the development of a Bayesian network (section 2.6.1)
- data analysis: interpretation of data, use of a range of multivariate statistics, calculation of biotic indices and incorporation of other information and expert opinion (section 2.6.2)
- donstruction of a Bayesian network (section 2.6.3).

2.6.1 Construction of a targeted sampling program to aid the development of a Bayesian network

The sampling program is given in Table 1. Monitoring of water quality during the 2004-05 environmental flow releases was conducted at 20 sites along the lower Wimmera River by the WCMA. Some of the 20 sites corresponded with Victorian Water Quality Monitoring Network (VWQMN) gauging sites, which are a source of historical flow and water quality data. A sub-set of 11 sites were selected for biological monitoring (macroinvertebrates, water quality and habitat data) by the EPA. These sites were chosen to cover the variety of habitats, depths, saline stratification, salinities and area of the lower Wimmera River. Three of the 11 sites also corresponded with VWQMN gauging sites.

Figure 4: Stakeholders' understanding of the key hazard/threats to 'biodiversity' and 'good water quality for biota' in the lower Wimmera River and the relationships between these

These sites were monitored in spring and autumn from November 2004 to November 2007. This provided data pre and post the 2004-05 environmental flow release, and through an extended period of no flows (2006-07) in the study area. A small environmental flow was released in spring 2007. However, as the volume of the release was inadequate to wet and fill the largely dry river channel, the flow only reached two of the 11 sites, having little impact on most of the lower Wimmera River.

As part of an Australian Research Council linkage project with the University of Sydney, University of Tasmania and Griffith University, a three-dimensional flow model for saline pools in the river was to be developed. Continuous water quality and depth profile sampling was planned for the scheduled spring 2006 environmental flows. However, this delivery was postponed due to water shortages and data could not be collected. Sampling will occur when the next environmental flow is delivered and this will provide information that will complement the Bayesian network.

2.6.2 Data analysis

All existing flow, water quality and macroinvertebrate data, and the data collected for this ERA, were analysed using a variety of methods.

These were:

- multivariate analyses, including MDS, SIMPER analysis and BEST analysis, which was used to investigate flow, water quality, habitat and macroinvertebrate community diversity relationships
- graphing and expert interpretation of flow and water quality relationships
- expert interpretation of macrophyte data:
- AUSRIVAS, SIGNAL, number of families and MBI calculations
- incorporation of relevant scientific literature and expert opinion gained from discussions and workshops.

2.6.3 Construction of a Bayesian network

A Bayesian network was developed based on the data analyses, information from previous studies in the Wimmera catchment, scientific literature and expert knowledge. This is discussed in Section 3.1.

Table 1: EPA Victoria and Wimmera CMA sampling program for the macroinvertebrate Bayesian Network and Wimmera environmental flow releases.

3. RISK ANALYSIS

Risk analysis is the determination of the probability and magnitude of an adverse effect with specific consequences occurring to the values within a certain time frame (Suter, 1993, Hart et al., 2005). The risk analysis phase for this ERA involved the development of a Bayesian network.

Bayesian networks are a useful tool for assessing cause and effect relationships in complex systems. They are built using measured data where available, and expert understanding of the likely relationships between factors where data is not available.

These networks form a graphical model that represents the variables in a system, which are linked by a set of arrows that represent the direct dependencies between variables (Korb and Nicholson, 2004). A set of probabilities exists for each variable, specifying the belief that a variable will be in a particular state given the states of those variables that affect it directly (Cain, 2001). Appendix D provides further discussion on Bayesian networks and Bayes Theorem.

Bayesian networks can:

- improve understanding of how complex natural systems work
- use and combine all types of data and expert knowledge
- provide predictions of the risk posed to an ecosystem from a number of different threats all operating at the same time and in different ways
- assess which factors have the main influence on the health of an ecosystem
- address uncertainty explicitly
- make predictions about the likely outcomes in improving the health of an ecosystem under different management scenarios
- be easily updated as new data and information becomes available, to provide more certainty and understanding.

3.1 Development of the Bayesian network

The five main tasks in developing a Bayesian network model^{[1](#page-13-1)} are:

- development of the structure;
- definition of the variables and their states
- population of the conditional probability tables (CPTs)
- sensitivity analysis
- evaluation of model predictions.

These steps are outlined below.

3.1.1 Development of the structure

Development of the graphical structure involved the formal and systematic identification of the key variables influencing the end point and the interactions (linkages) between them. The conceptual model developed during problem formulation provided a starting point for the network structure.

The structure of the Lower Wimmera Bayesian network was finalised through:

- focus on the key values and threats identified in the problem formulation workshops
- results from data analyses
- consultation with ecological experts and the WCMA.

Multivariate analysis showed salinity, dissolved oxygen, macrophytes and flow as the key variables affecting macroinvertebrate community diversity. These findings were supported by previous studies (Anderson and Morison, 1989; EPA, 1993 and 1995; WCMA, 2006) and expert opinion.

Other factors originally identified as potential key influences were shown to have no significant impact on the end point. For example, nutrient levels in the lower Wimmera River, particularly total phosphorus, were historically a major issue given the discharge from the Horsham Sewerage Authority Treatment Plant (EPA, 1993). However, discharges ceased in 1988 significantly reducing nutrient inputs. Multivariate analyses showed that current nutrient levels have a non-significant impact on the end point and, as such, nutrients were omitted as a variable from the final structure.

The final structure of the network is given in Figure 5. The key cause-effect relationships are discussed in Appendix E. The different categories within the network are colour coded and are as follows:

- **Flow regime** The blue nodes represent the flow variables. 'Freshes per year' (small peak flow events), 'high flow' (bank-full flows) and 'baseflow' are the variables that can be manipulated to test different flow management options. 'Previous river level' provides an indication of the amount of water within the channel, reflecting drought and nondrought conditions.
- **Habitat availability** The green nodes represent the habitat variables. The important habitats for macroinvertebrates in the lower Wimmera River are 'macrophytes' and 'leaf packs and woody debris'. 'Water for habitat' is also essential, as there needs to be enough water within the channel to cover a range of habitats and provide for the growth of macrophytes.
- Water quality The yellow nodes represent the water quality variables most important in the river. The multivariate data analysis and previous studies showed salinity to be the key water quality variable

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¹ The Bayesian network software used was Netica (Norsys Software Corp. 1997; 1997-2008).

influencing the end point and 'dissolved oxygen' to be the second largest water quality influence. 'Salinity surface' is the variable representing the salinity levels predicted in the river in response to flow management scenarios set in the model. The salinity levels are also influenced by the presence of saline groundwater intrusions and the surface salinity levels prior to delivery of flow. These influences are represented in the network by the variables 'presence of groundwater intrusion' and 'previous salinity surface'.

End point - The red node denotes the 'macroinvertebrate community diversity' end point (Section 2.5).

The flow components of this model can be manipulated to investigate the effects of different environmental flow release options on water quality, available habitat and macroinvertebrate community diversity. This identifies the ideal delivery option for different allocation volumes under drought and nondrought conditions.

3.1.2 Definition of the variables and their states

The definitions and measures of variables and their states were determined using the relevant literature, data analysis, and consultation with ecological experts and the WCMA (see Table 2). The finalised network and variable states is given in Figure 6. The network also contains the integrative variables: 'flow regime for water quality improvement', 'water for habitat' and 'quality instream habitat'. These variables are not directly observable or measurable. Their purpose is to reduce the number of linkages to a particular variable, which simplifies the structure and complexity of CPTs for expert elicitation.

The states of the integrative variables were more difficult to define, as they are qualitative expressions of condition, such as a good or poor flow regime for water quality improvement. Discussion around the ecological meaning of the states of these variables was crucial, to align expert's understanding before assigning probabilities to the CPTs.

Table 2: Definitions of variables, their states and the data used for this process

Figure 6: Finalised Bayesian network for the lower Wimmera River, showing variable states

3.1.3 Population of the conditional probability tables (CPTs)

The relationships between variables are quantified in CPTs. Parent variables lead into child variables (see Figure 7), and the outcomes of child variables are conditional on the states of the parent variables. These relationships are defined by assigning probabilities for each possible scenario in the corresponding CPT. This can be achieved by using data, outputs from other models, results from other analyses and/or expert opinion. Table 3 provides an example of the CPT for the 'quality instream habitat' variable relationships in Figure 7. This defines the probability of habitat condition being 'poor' 'moderate' or 'good' given the different potential scenarios for 'macrophyte habitat', 'leaf packs and woody debris' and 'water for habitat'.

The network CPTs were initially populated using expert opinion. The experts determined probabilities for all scenarios based on information from the ERA, data analysis and previous studies conducted by these experts and others. Expert elicitation was conducted in three workshops held in September 2004 and October and November 2008. A list of the experts in attendance is given in Appendix F.

Each expert individually completed the probabilities for each CPT. These responses were averaged and the average was used to populate the CPTs in the network [\(see Appendix G\)](#page-45-0).

The probabilities in the CPTs were then updated using available data. The majority of update data (75%) was collected post 2004 as part of the ERA under drier climate conditions. The remaining 25% was historical data collected during 1993 to 2004 as part of the statewide biological monitoring program, providing information under wetter conditions.

Figure 7: An example of parent variables (orange) linked to a child variable (blue)

Table 3: The CPT for the variable 'quality instream habitat'

3.2 Sensitivity analysis

Sensitivity analysis was performed to determine the variables that have the most influence on the condition of macroinvertebrate community diversity and surface salinity, i.e., the variables of greatest management interest. In this case, the sensitivity measure for macroinvertebrate community diversity (discrete variable) is mutual information or entropy reduction, and for surface salinity (continuous variable) the measure is variance reduction (variance of beliefs). For more information on sensitivity measures, refer to Pearl (1988).

The results from this analysis assist in prioritising the:

- threats to macroinvertebrate community diversity
- best actions to reduce salinity
- important knowledge gaps to be filled by further research and monitoring.

The results from the sensitivity analyses conducted for macroinvertebrate community diversity and surface salinity are presented in Tables 4 and 5, respectively. In these tables, only the network variables that are directly measurable are included. The sensitivity values presented indicate the relative level of influence each variable has over the variables of management interest. The higher the sensitivity value, the greater the relative influence is. Interpretations need to consider that the closer a variable is in the network structure to the subject of the sensitivity analysis, the more likely the analysis will show it as having a greater influence (Cain 2001).

Table 4 indicates that salinity has the greatest influence on macroinvertebrate community diversity. The next most influential variable is macrophyte habitat, followed by the presence of saline groundwater intrusion and low levels of dissolved oxygen. The component of environmental flow deliveries showing the greatest influence on macroinvertebrate community diversity is the delivery of freshes. The flow variables are structurally furthest from the end point, and therefore have relatively lower mutual information values. However, it is the delivery of freshes as part of environmental flows that has the most influence on the salinity levels, as shown in Table 5.

These findings are consistent with the literature. EPA (1993) indicated that macroinvertebrate communities were driven by flow and salinity levels. More specifically, freshes were found to be the key component to restoring water quality (Anderson and Morison, 1989, EPA, 1993, and SKM, 2002). High structural diversity of macrophytes is also essential for providing a variety of habitats for a wide range of macroinvertebrates.

The results indicate that freshes are key to management of salinity and improving macroinvertebrate community diversity. A range of flow management scenarios are analysed in Section 4.2

The sensitivity analysis results also highlight knowledge gaps. While information exists about the positive effects of environmental flow delivery on water quality (e.g. freshes to decrease salinity levels and increase dissolved oxygen levels), more information and data on the negative effects (e.g. mixing in stratified pools or salt slugs downstream of stratified pools at flow delivery) would also be beneficial. This knowledge gap will be addressed by the University of Sydney in the saline pool flow model which will be completed when more data is collected during the next environmental flow release.

Table 4: Sensitivity analysis of macroinvertebrate community diversity in order of most to least influential variables

Table 5: Sensitivity analysis of surface salinity in order of most to least influential variables

3.3 Evaluation of the Bayesian network

Evaluation of the Bayesian network assesses the predictive accuracy of the network. It compares the predicted states of network variables with actual sampling data, calculating the frequency with which the network provides correct predictions.

Evaluation requires complete datasets (cases) containing data that was not used to update the CPTs. Complete cases in this instance require a measurement for each variable in the network except the integrative variables. Twenty per cent (14 cases) of the complete cases were used for model evaluation (See Appendix I), with most of this data being from drier periods. The other 80 per cent of complete cases were used in the prior CPT update. Fourteen cases is a small sample size and more data from a range of flow scenarios and prior conditions is required for model validation.

The Netica^{[1](#page-22-1)} function, test with cases, was used to evaluate the accuracy of network predictions for:

- macroinvertebrate community diversity
- salinity surface
- DO per cent surface
- macrophyte habitat.

The predictive error rate from this analysis is scored out of 100 per cent. The lower the percentage, the better the network is predicting for a particular variable.

The predictive error rates for the above variables are as follows:

- macroinvertebrate community diversity = 14.29%
- salinity surface = 21.43%
- DO per cent surface = 7.14%
- macrophyte habitat = 21.43%

Based on results from other Bayesian network studies (e.g., Pollino et al., 2006), these findings indicate that the predicted and actual values were generally consistent with each other. This is especially the case for DO per cent surface and macroinvertebrate community diversity, as the error rates for these variables are comparably low. However, these results should be used as a guide only, as more data is required to formally validate the model's predictions.

Further investigation compared the observed and predicted results for the above variables, case by case (see Appendix J). This showed the predictive accuracy of the network to be very high. For 96.5 per cent of the time, the observed state was either the highest or second highest predicted state by the network, with a difference between these of no greater than 10 per cent. When the model is predicting two states closely like this, these predictions provide a good indication of the most likely outcomes of the variable of interest under certain flow scenarios and prior conditions. For example, if the observed state for macroinvertebrate community diversity was good, and the model predicted a 48 per cent chance of moderate and a 42 per cent chance of good, then this still provides a good indication of the potential diversity for that management scenario.

Updating the model with more data, particularly from non-drought times, would increase the robustness and predictive accuracy of the network.

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¹ The Bayesian network software used was Netica (Norsys Software Corp. 1997; 1997-2008).

4. RISK CHARACTERISATION

Risk characterisation is the evaluation and reporting of the problem formulation and risk analysis results to provide information for decision-making and risk management.

4.1 Key risks

The ERA showed **high salinity** to be the key direct threat to macroinvertebrate community diversity in the Lower Wimmera River. **Low dissolved oxygen** can also potentially have a significant influence on macroinvertebrates under extended low flow conditions.

The key influences on the risk of high salinity concentrations are:

- saline groundwater intrusion
- low flows.

There are several sections of the river downstream of Quantong that have **saline groundwater intrusions**. The Parilla Sands is the main aquifer underlying much of the study area. It is highly saline with salinities exceeding 33,333 μS/cm. The aquifer intersects with the streambed in places, particularly downstream of Polkemmet (see Figure 2), resulting in very high salinities and the formation of stratified saline pools in some places (Anderson and Morison 1989). Where saline groundwater intrusion is present at a site, the salinity can increase substantially depending on the size and depth of the pool. Increased evaporation rates during summer and ongoing **low flows** can reduce pool size and depth, concentrating salts, which increases salinity levels further. In some of these pools, especially those furthest downstream, salinities can equal seawater (58,700 μS/cm) and in some instances have been twice that of seawater (>110,000 μS/cm). The State Environment Protection Policy (Waters of Victoria) (SEPP [WoV]) objective for salinity in the Wimmera is ≤1500 μS/cm.

The data collected as part of this study clearly shows the effect of **saline groundwater intrusion** and **low flows** on salinity concentrations at the 11 study sites. Table 6 illustrates this effect by comparing salinity data after the 2004—05 environmental flows and salinity data after an extended period of low to no flows. The salinities of Lower Norton and Quantong, sites with no groundwater intrusion, only slightly increased in response to the low flow period. All other sites, which have groundwater intrusions, show a significant increase in salinities over this time, with very high salinities being recorded.

Low flows are considered to be the main threat in the lower Wimmera River. It is the reduced flow that is driving poor water quality, in particular high salinity concentrations. Elevated salinity levels have a direct toxic effect on aquatic biota, cause changes in chemical processes, and result in a loss of instream

habitat, riparian zones and adjacent floodplains (James, et al., 2003). Low flows also affect the amount of habitat available for macroinvertebrates. Figures 8 to 13 show selected sites after the 2004—05 environmental flows and after an extended period of low to no flows. These figures illustrate the impact of reduced flow on available habitat, quality of macrophyte communities and water quality.

Low dissolved oxygen events may also occur as a result of organic matter build up in dry sections of riverbed, during cease to flow periods. If only small flows return to these dry sections, there is potential for decay of this material that can cause dissolved oxygen levels to drop to very low levels. This is known as a 'black water' event. These events can best be avoided by the initial delivery of larger 'flush' (fresh) flows.

Flow can be used to manage deteriorating water quality. The effects of different flow release options on salinity levels and ultimately the macroinvertebrate community diversity are discussed in Section 4.2 below.

Figure 8: Lower Norton after the 2004/05 environmental flows (Autumn 2005)

Figure 10: Upstream of Ellis Crossing after the 2004/05 environmental flows (Autumn 2005)

Figure 12: Jeparit after the 2004/05 environmental flows (Autumn 2005)

Figure 9: Lower Norton (Autumn 2007) after an extended period of low to no flows

Figure 11: Upstream of Ellis Crossing (Autumn 2007) after an extended period of low to no flows

Figure 13: Jeparit (Autumn 2007) after an extended period of low to no flows

Site	Reach Position	Saline Groundwater Intrusion	Salinity (μ S/cm) after the 2004- 05 environmental flows	Salinity (µS/cm) after an extended period of low flows (Spring 2007)	
Lower Norton	Upstream	N _o	1500	1577	
Quantong	Upstream	N ₀	1548	2996	
Polkemmet South	Middle	Yes	1967	18252	
Polkemmet North	Middle	Yes	1923	18250	
Upstream Ellis Crossing	Middle	Yes	2206	64,417	
Big Bend	Middle	Yes	2671	18,016	
Lochiel	Middle to downstream	Yes	3492	21,740	
Wundersitz	Middle to downstream	Yes	3671	10,843	
Antwerp	Middle to downstream	Yes	5670	35,370	
Tarranyurk	Furthest Downstream	Yes	29,930	51,697	
Jeparit	Furthest Downstream	Yes	34,400	110,374	

Table 6: Salinities recorded at ERA sites in the lower Wimmera River, post 2004–05 flows and after a period of extended low flows.

4.2 Management scenario testing

An important application of Bayesian networks is their ability to provide information on the outcomes from various management scenarios. Variables in the network can be changed to reflect certain management actions, and the network run to ascertain the probabilities of improvement in the selected end points. In this way, various management actions can be tested and compared for their relative effectiveness.

This section provides the results of model predictions for a range of flow management scenarios under drought and non-drought conditions. Four of the 11 sites were chosen for presentation here. These sites are in order of upstream to downstream:

- Lower Norton
- Polkemmet South
- Upstream of Ellis Crossing
- Tarranyurk.

The sites were selected to represent the range of salinities and habitats that occur in the lower Wimmera River. In addition, these sites have the most existing data, which was used to develop and update the model.

4.2.1 Drought conditions

Drought conditions represent periods of extended low or no flows. The Wimmera River is currently experiencing drought conditions.

For each flow management scenario, states for 'previous river level' and 'previous surface salinity' were entered to reflect drought conditions. As the region is in drought, selection of previous salinity states for each site was based on the site's current salinity range. The 'previous river level' variable was set to 'low' for all scenarios, as this is the current river level. 'High flow' was set to 'no' for each flow management scenario.

The flow management scenarios investigated were:

- none, one to two and three or more freshes with none to 100 days of baseflow
- none, one to two and three or more freshes with 100 to 200 days of baseflow
- none, one to two and three or more freshes with more than 200 days of baseflow.

Overall the results (Appendix K) suggest that delivering 100 to 200 days of baseflow and three or more freshes under drought conditions, has the highest likelihood of producing moderate to very good macroinvertebrate community diversity, throughout the entire lower Wimmera River. (See Table 7).

Releasing none to 100 days of baseflow with one to two freshes will still achieve very good macroinvertebrate community diversity for the upstream reaches of the river (e.g., Lower Norton), but not in the lower reaches which are predicted as being moderate to poor (e.g., Tarranyurk). However, if the amount of water available for environmental flows was small, this management scenario could be employed to

protect important refuges in the upstream sections of the river.

The possible outcomes if no environmental flows occur under drought conditions were also investigated. Overall the condition of the river would deteriorate, with a greater likelihood of high salinity levels and moderate to very poor macroinvertebrate community diversity throughout the entire lower Wimmera River. (See Table 8).

4.2.2 Moderate conditions

The early 1990's can be considered a period of relatively moderate weather conditions for the Wimmera: not too dry or too wet. Analysis of flow data for 1994 supports this, and salinity data for the four sites were generally as follows:

- Lower Norton low.
- Polkemmet South low to moderate.
- Upstream of Ellis Crossing low to moderate.
- Tarranyurk moderate to high.

Under moderate conditions, the previous river level variable was set to moderate and the previous surface salinity variable was adjusted accordingly. The same, flow management scenarios were then run under moderate conditions.

Considering the entire study area, the best flow management option would be delivery of 100 to 200 days of baseflow and one to two freshes, resulting in moderate to very good macroinvertebrate diversity. (See Table 9).

The results, presented in Appendix L, indicate Lower Norton to have a high likelihood of maintaining very good macroinvertebrate community diversity under all flow scenarios.

If no environmental flows occurred, the overall end point would have a greater likelihood of being moderate to poor condition. (See Table 10).

Results from this ERA indicate different sections of the river may require different flow delivery regimes to achieve an improvement in macroinvertebrate community diversity, water quality and available habitat. Therefore it is imperative to work out the most effective environmental flow delivery regime, based on the volume of water allocated and what the WCMA are able to protect with this.

4.3 Limitations

As with any model there are limitations. The limitations of the lower Wimmera River Bayesian network are:

- an uneven spread of data from the 11 sites used to update the model, potentially skewing predicted probabilities in the model
- a lack of data from wet times to update the model and provide better predictions under these times

• the exclusion of the saline pool modelling subnetwork to assess the effects of salt slugs and mixing of saline pools, due to postponement of the 2006 environmental flows.

Although there are limitations, the network's predictions were shown to be reasonably accurate. Continued monitoring and collection of data, especially from wetter times and from a range of sites, would be the priority for updating the network, to increase its predictive accuracy.

4.4 Future use

This network was produced to assist the WCMA in decision-making for management of environmental flow allocations. The EPA provided training in model use for the WCMA in May 2008, enabling incorporation of the model into their environmental flow strategies. The WCMA are planning a continued monitoring program, collecting data to update the model and test its predictive accuracy over time.

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6. FURTHER INFORMATION

EPA Information Centre

40 City Road, Southbank, Victoria 3006 GPO Box 4395QQ, Melbourne, Victoria 3001 Telephone: 03 9695 2700 Facsimile: 03 9695 2710 <http://www.epa.vic.gov.au/>

Table 7: Predicted outcome for salinity and macroinvertebrate community diversity in the case of 100–200 days of baseflow and three or more freshes under drought conditions (low previous river level)

Table 8: Predicted outcome for salinity and macroinvertebrate community diversity in the case of no environmental flow delivery (<100 days of baseflow and no freshes) under drought conditions (low previous river level)

Table 9: Predicted outcome for salinity and macroinvertebrate community diversity in the case of 100–200 days of baseflow and three or more freshes under moderate conditions (moderate previous river level)

Table 10: Predicted outcome for salinity and macroinvertebrate community diversity in the case of no environmental flow delivery (<100 days of baseflow and no freshes) under moderate conditions (moderate river level)

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APPENDIX A: PROBLEM FORMULATION STAKEHOLDER WORKSHOP PARTICIPANTS

Table A1: Lower Wimmera ERA problem formulation stakeholder workshop participants

APPENDIX B: ECOLOGICAL VALUES IDENTIFIED BY WIMMERA STAKEHOLDERS

Table 1: Ecological Values identified by Wimmera stakeholders to be protected by environmental flow allocations.

The values are grouped into general themes identified by stakeholders. It is recognised that there is overlap between the themes and some values could be considered under more than one theme.

² Key priority values stakeholders chose to focus the ERA on.
³ Values come from Table 7-3 'Environmental flow recommendations for the Wimmera River Reach 4/5 between McKenzie River and Lake Hindmarsh', in SKM (2002) Stressed Rivers Project – Environmental Flow Study, Wimmera River System. Sinclair Knight Merz.

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APPENDIX C: THREATS TO ECOLOGICAL VALUES IDENTIFIED BY WIMMERA STAKEHOLDERS

Table 1: Potential threats to the lower Wimmera River identified by stakeholders

APPENDIX D: DISCUSSION OF BAYESIAN NETWORKS AND BAYES THEOREM

What are Bayesian networks?

Bayesian networks are a tool for representing the interactions that control real-world systems (such as aquatic ecosystems, irrigation systems and forests). They are built using measured data, where available, and also expert understanding of the likely relationships between factors where data is not available.

A Bayesian network is essentially a diagram that shows the cause and effect relationships about particular systems and includes information on how much, and in what way, one part of the system affects another. These networks attempt to give a useful estimate of a predicted outcome (for example, the occurrence of an algal bloom given certain nutrient conditions) even if apparently key pieces of information are poorly known.

Bayesian networks get their name from Reverend Thomas Bayes who developed a mathematical formula for calculating probabilities (published posthumously in 1763) amongst related variables for which the relationships are not known (see the 'Info box: Bayes Theorem' for more details). Bayesian networks have only recently become practical with the development of computer hardware and software that can handle these Bayesian relationships among a useful number of variables. As an example, Microsoft Office now uses Bayesian networks to decide how to offer users help, based on past experience with the user. Bayesian networks are now increasingly being applied to situations in medicine, engineering and the environment.

Why use Bayesian networks?

Bayesian networks are useful tools for understanding how natural systems work, and how particular management decisions can affect the system. They are particularly useful where there are many possible management actions, and many criteria on which to base decisions about which are the best management actions. They can also be used to increase our understanding of the relationships between components that make up an ecosystem.

The basis of the network is a diagram representing various aspects of the system being considered (see the Example). Because they are graphical, they can improve communication about our current understanding of the system, and allow input from people less familiar with computer modelling, but with a good understanding of the system.

Bayesian networks are particularly useful where a relationship between variables is thought to be important but where our understanding of that relationship is incomplete. In such situations, we need to describe the probability that particular relationships will occur, based on our observations of the variables.

One of the most important features of Bayesian networks is the fact that they can account for uncertainty. This is particularly important given the complexity of the natural world and the difficulty in making exact predictions of the effects of management actions. Managers need to balance the desirability of an outcome against the chance that particular management actions may not lead to the expected outcome.

Bayesian networks are easy to adapt and change as our understanding of the system develops, if new factors come into play, or when new data is collected. The network can 'learn' from additional data and become better at predicting outcomes.

How does a Bayesian network work?

A Bayesian network is a set of system variables, also known as 'nodes', which may be factors such as nutrient levels, salinity, or algal concentrations if a network is looking at water quality. Links between the nodes represent the relationships between the nodes (for example, a link between nutrient levels and algal concentrations). The relationship between nodes is quantified with a set of probabilities ('conditional probability tables') specifying the belief that a node will be in a particular state given the states of the nodes that affect it.

Thus the value (or 'state') of a node is a result of the states of the nodes linked to it. The network can then be 'trained' with data. The more evidence there is on how the system has behaved in the past, the more certain we can be that it will behave in a similar way in the future.

Inputs to a Bayesian network can include and combine data from regular monitoring (e.g. for water quality, weather stations), from specific studies or surveys (e.g., once-off fauna surveys). Sometimes no data is available for a certain node/relationship because it is complicated or expensive to collect, or because the region under consideration is remote. If no data is available, consultation with experts to obtain their opinion on nodes/relationships can be used until data can be collected, with predictions based on opinion having a higher uncertainty than those predictions based on measured data.

The output from a Bayesian network can be a prediction on the state of the measurement end point, for example 'good', 'moderate' or 'poor' abundance of a certain focal species. This can be defined within the final node as, for example, an abundance of more than ten individuals of the focal species per hectare being 'good', between three and ten individuals being

'moderate', and less than five individuals being 'poor'. This output can be compared for different management actions to assist in deciding whether an

action is worth taking, or which action is most likely to give the best result.

Info box: Bayes Theorem

The networks essentially rely on a relationship developed by Bayes. In probability notation, for two events A and B:

 $p(A|B) = p(B|A) \times p(A) / p(B)$

Essentially, this says that if we had a high degree of belief in the likelihood of event A occurring based on past experience (i.e., the probability of A ($p(A)$) is high), and we now observe data (Event B, and the probability of B, p(B)) that would be likely to occur if event A occurs (the probability of B given that we have observed event A, $p(B|A)$), then our 'after the evidence confidence' (i.e., probability of A given the probability of B, $p(A|B)$) in Event A should be strengthened. This is 'inference', which allows us to determine which 'cause' can 'explain' observed data better.

Further information

For more information on Bayesian networks:

General/popular articles:

- 'Adding art to the rigor of statistical science', by David Leonhardt, *New York Times*, April 28, 2001: [http://www.nytimes.com/2001/04/28/arts/28BAY](http://www.nytimes.com/2001/04/28/arts/28BAYE.html) [E.html](http://www.nytimes.com/2001/04/28/arts/28BAYE.html)
- 'The ghost in the machine', by Jane Black, *Business Week*, July 31, 2001: [http://www.businessweek.com/bwdaily/dnflash/jul](http://www.businessweek.com/bwdaily/dnflash/jul2001/nf20010731_509.html) [2001/nf20010731_509.htm](http://www.businessweek.com/bwdaily/dnflash/jul2001/nf20010731_509.html)

More detailed articles:

- 'A brief introduction to graphical models and Bayesian networks', by Kevin Murphy 1998: www.cs.ubc.ca/~murphyk/Bayes/bayes.htm
- 'An Introduction to Bayesian Networks and their Contemporary Applications', by Daryle Niedermayer:
	- www.niedermayer.ca/papers/bayesian/index.html
- 'Netica, Bayesian Network Software and Tutorial': www.norsys.com/tutorials/netica/nt_toc_A.htm

APPENDIX E: CONDITIONAL PROBABILITY TABLES OF THE BAYESIAN NETWORK

E1: macroinvertebrate community diversity

Macroinvertebrate community diversity was chosen as the assessment end point for the Lower Wimmera River Bayesian Network. Macroinvertebrates include aquatic animals such as insects, snails, worms and shrimps. They provide a direct biological measure of a critical part of the river fauna, are relatively easy to monitor and are a part of current and future monitoring programs in the Wimmera catchment. The value in assessing the biological community is that it responds to all types of disturbances, and reflects the net effect of all environmental factors, including impacts of stresses over a period of weeks, months or years.

The 'macroinvertebrate community diversity' variable characterises the health of the macroinvertebrate community in the lower Wimmera River. Put quite simply, the more diverse the community, the healthier it is. The five states for 'macroinvertebrate community diversity' determined by the expert panel are very poor, poor, moderate, good and very good. These states were selected as they are well established thresholds, defined using the MBI score which is based on the standard indices AUSRIVAS, SIGNAL and Number of Families, according to the method detailed in EPA (unpublished).

Figure E1: Graphical submodel for 'macroinvertebrate community diversity'

The panel of ecological experts identified 'quality instream habitat', 'DO per cent surface' and 'surface salinity' as the key variables directly influencing 'macroinvertebrate community diversity' in the lower Wimmera River (see Figure E1). They each determined the conditional probabilities for the end point and these responses are given in Appendix E. The average of these responses was entered into the CPT for 'macroinvertebrate community diversity' (see Table E1).

The ecological expert panel identified salinity surface as having the greatest influence on the end point. This was based on a substantial amount of information from previous studies, personal observations in the field and extensive knowledge of the area. Quality instream habitat was considered the second most influential factor, with DO per cent saturation having the least influence on the end point.

The panel had high certainty in estimating the overall relative influence of the three variables determining macroinvertebrate diversity, based on the wealth of information and personal experience in the area. This translated to a moderate confidence in the detail of the individual probability estimates for these relationships, given the detail required.

Table E1: Conditional probabilities for 'macroinvertebrate community diversity'

E2: Surface salinity

The 'surface salinity' variable is defined as the electrical conductivity (EC) level in the water column, measured in µS/cm. The four states for 'salinity surface' are low, moderate, high and very high. These states were determined through analysis of data using multivariate statistics and represent levels at which macroinvertebrate community diversity significantly decreases. The ecological expert panel confirmed these states. 'Flow regime for water quality improvement', 'groundwater intrusion present at site or upstream of site' and 'previous surface salinity' were identified by the ecological experts as the key contributors to salinity levels in the lower Wimmera River (see Figure E2). This was based on previous studies and catchment reports (Anderson and Morison, 1989; EPA, 1993 and 1995; SKM, 2002, WCMA 2005 and 2006) and discussions with WCMA staff.

Figure E2: Graphical submodel for 'salinity surface'

The panel of ecological experts determined the conditional probabilities for 'salinity surface' individually and these responses are given in Appendix F. The average of these responses was entered into the CPT (see Table E2).

			Salinity surface condition			
Flow regime for water quality improvement	Groundwater intrusion present at site or upstream of site	Previous surface salinity	Low <3000	Moderate 3000-10,000	High 10,000- 40,000	Very high >40,000
Good	Yes	Low	51	41.25	7.5	0.25
Good	Yes	Moderate	28.75	53.75	15.75	1.75
Good	Yes	High	$\overline{7}$	53	37	3
Good	Yes	Very High	3	32.25	47.5	17.25
Good	N ₀	Low	93.25	6.5	0.249	0.001
Good	N _o	Moderate	78.75	21	0.249	0.001
Good	No	High	34	47.5	17.5	
Good	No	Very High	15.25	27	47.75	10 ¹⁰
Poor	Yes	Low	21.25	50	25	3.75
Poor	Yes	Moderate	0.25	37.25	50	12.5
Poor	Yes	High	0.001	4	63.749	32.25
Poor	Yes	Very High	0.001	0.249	8.5	91.25
Poor	No	Low	46.25	40	11.25	2.5
Poor	No	Moderate	4	50	43.25	2.75
Poor	No	High	0.001	6.499	67.25	26.25
Poor	N _o	Very High	0.001	0.249	22.75	77

Table E2: Final prior probabilities for the Salinity Surface CPT. The prior probabilities are an average of the four ecological experts' responses.

The ecological expert panel had high certainty in estimating the overall relative influence of the three variables determining 'salinity surface'. They were able to base this judgement on a substantial amount of information from previous studies, personal observations in the field and extensive knowledge of the area. This translated to a moderate confidence in the detail of the individual probability estimates for these relationships, given the detail required.

E3: Flow regime for water quality improvement

The 'flow regime for water quality improvement' variable is an integrative variable characterising the flow regime that will improve water quality in the lower Wimmera River. The two states defined for this variable were good and poor and are dependent on the given states of ' freshes/year', 'baseflow' and 'high flow' (see figure E3).

Figure E3: Graphical submodel for 'flow regime for water quality improvement'

The panel of ecological experts determined the conditional probabilities for 'flow regime for water quality improvement' individually and these responses are given in Appendix F. The average of these responses was entered into the CPT (see Table E3).

The panel identified freshes as having the greatest influence on the 'flow regime for water quality improvement' in the lower Wimmera River. Baseflow was deemed the second most influential factor. The experts' rationale was based on historical flow and salinity data from relevant VWQMN gauging sites and previous studies that investigated the effects of different flow delivery methods on water quality. High flow played the least important role in improving water quality in the river.

Table E3: Final prior probabilities for the flow regime for water quality improvement CPT. The prior probabilities are an average of the four ecological experts' responses.

The ecological expert panel had moderate certainty in the probability estimates for this relationship, as they were able to base their estimates on an adequate amount of information from previous studies, knowledge of the area and field observations.

E4: Quality instream habitat

The 'quality instream habitat' variable is an integrative variable characterising the overall availability of habitat for macroinvertebrates. The three states defined for 'quality instream habitat', poor moderate and good, are dependent on the given states of 'macrophyte habitat', 'water for habitat' and 'leaf packs and woody debris' (see Figure E2).

Figure E4: Graphical submodel for 'quality instream habitat'

The panel of ecological experts determined the conditional probabilities for 'quality instream habitat' individually and these responses are given in Appendix F. The average of these responses was entered into the CPT (see Table E4).

Table E4: Conditional probabilities for 'quality instream habitat'

The panel identified 'water for habitat' as having the greatest influence on the amount of instream vegetation present in the lower Wimmera River. 'Macrophyte habitat' was deemed the second most influential factor. The experts rationale was that water is required to provide instream habitat, such as submerged logs and macrophytes, and that macrophytes play an important role in providing a diversity of habitats for a range of macroinvertebrates. Leaf packs and woody debris were deemed the least influential habitat in the river.

The ecological expert panel had moderate certainty in the probability estimates for this relationship, as they were able to base their estimates on an adequate amount of information from previous studies, knowledge of the area and field observations.

E5: Water for habitat

The 'water for habitat' variable is an integrative variable characterising the amount of water available for habitat. The two states defined for 'water for habitat', poor and good, are dependant on the given states of 'freshes/year', 'baseflow' and 'previous river level' (see Figure E5).

Figure E5: Graphical submodel for 'water for habitat'

The panel of ecological experts determined the conditional probabilities for 'water for habitat' individually and these responses are given in Appendix F. The average of these responses was entered into the CPT (see Table E5).

Table E5: Final prior probabilities for the Water for Habitat CPT. The prior probabilities are an average of the four ecological experts' responses.

The panel identified 'previous river level' as having the greatest influence on the amount of water available for habitat in the lower Wimmera River. 'Freshes' was the second most influential factor determining quality instream habitat, followed by 'baseflow'. The experts rationale for this was that the higher the river the greater the likelihood that there will be more instream habitat. Freshes were deemed as having a greater influence than baseflow, as freshes have been shown to improve water quality, which is important for macrophytes.

The ecological expert panel had moderate certainty in the probability estimates for this relationship, as they were able to base their estimates on an adequate amount of information from previous studies, knowledge of the area and field observations.

E6: Macrophyte habitat

The 'macrophyte habitat' variable is defined as the number of substructures present instream (e.g. emergent rush-like, submerged feather-like, etc). The measure for this variable was determined through multivariate analysis that showed substructure (e.g., not number of taxa present) to have the most influence over macroinvertebrate community diversity. The two states for 'macrophyte habitat' are good and poor. These states were determined through analysis of data collected as part of this ERA and represent levels at which the end point significantly decreases. The ecological expert panel then confirmed the states. The experts identified 'salinity surface' as the key influence over macrophyte establishment and growth in the lower Wimmera River (see Figure E6). This was based on previous studies and catchment reports (Anderson and Morison, 1989; EPA, 1993 and 1995; SKM, 2002, WCMA 2005 and 2006) and discussions with WCMA staff and ecological experts.

Figure E6: Graphical submodel for 'macrophyte habitat'

The conditional probabilities for 'macrophyte habitat' were determined by analysing data collected as part of this ERA. These probabilities are given in Table E6.

Table E6: Final prior probabilities for the Macrophyte Habitat CPT. The prior probabilities were based on existing data.

E7: DO% surface

The 'dissolved oxygen' variable is defined as the per cent saturation of the surface water. The two states for 'dissolved oxygen' are sufficient and poor. The term 'sufficient' is used as the range of values within this state are definitive of good to sufficient dissolved oxygen levels. These states were defined by ecological experts through analysis of data collected as part of this ERA and WCMA sampling. These states represent levels at which macroinvertebrate community diversity significantly decreases. The experts identified 'flow regime for water quality improvement' as the key influence over dissolved oxygen levels in the lower Wimmera River (see Figure E6). This was based on previous studies and catchment reports (Anderson and Morison, 1989; EPA, 1993 and 1995; SKM, 2002, WCMA 2005 and 2006).

Figure E7: Graphical submodel for 'DO% surface'

The conditional probabilities for 'dissolved oxygen' were determined by analysing data collected as part of this ERA. These probabilities are given in Table E6.

> **Table E7: Final prior probabilities for the DO per cent surface CPT. The prior probabilities were based on existing data.**

APPENDIX F: EXPERT ELICITATION WORKSHOP PARTICIPANTS

Table F1: Ecological experts in attendance for the lower Wimmera River expert elicitation workshops in September 2004 and October and November 2008.

APPENDIX G: INDIVIDUAL ECOLOGICAL EXPERTS' PRIOR PROBABILITIES AND THE AVERAGE RESPONSE FOR FIVE CPTS IN THE LOWER WIMMERA BAYESIAN NETWORK

NB: The CPTs for 'DO% surface' and 'Macrophyte Habitat' were completed using the analysis of historical and ERA data. These CPTs do not appear in this appendix, please refer to Appendix D. The Key for ecological experts for all following tables is: SA = Stephen Adamthwaite, DT = David Tiller, LM = Leon Metzeling, AW = Anne-Maree Westbury and AV = Average

Table G1: Final prior probabilities for the macroinvertebrate community diversity CPT for each individual ecological expert

Table G2: Final prior probabilities for the quality instream habitat CPT for each individual ecological expert

Table G3: Final prior probabilities for the flow regime for water quality improvement CPT for each individual ecological expert

Table G4: Final prior probabilities for the surface salinity CPT for each individual ecological expert.

Table G5: Final prior probabilities for the water for habitat CPT for each individual ecological expert.

APPENDIX H: COMPLETE AND INCOMPLETE DATA SETS USED FOR UPDATING THE CPTS

Table H1: Raw data used to update the Bayesian CPTs. Bold indicates the sampling season after the 20–2005 environmental flows. * represents missing data (data that was unavailable)

APPENDIX I: DATA USED FOR EVALUATING THE NETWORK

Table I1: Raw complete data sets used to evaluate the Bayesian network.

APPENDIX J: MODEL PREDICTIONS OF THE EVALUATION DATA

Table 1: Network predictions for surface salinity, DO% surface, macrophyte habitat and macroinvertebrate community diversity for 14 cases in the lower Wimmera River. Bold font represents a correct prediction.

APPENDIX K: MANAGEMENT SCENARIO TESTING UNDER DROUGHT CONDITIONS

Table K1: Management scenario testing results under drought conditions for four sites: Lower Norton, Polkemmet South, Upstream Ellis Crossing, and Tarranyurk

APPENDIX L: MANAGEMENT SCENARIO TESTING UNDER NON-DROUGHT CONDITIONS

Site Previous Salinity Baseflow Freshes/year Predicted EC Predicted Macroinvertebrate Community Diversity in the Site of Predicted Macroinvertebrate Community Diversity Lower Norton Low Low Low Low 76.9% Very Good 41.4% Low Low Low Low Noderate Low 92.2% Very Good 60.1% Lower Norton Low Low High Low 90.2% Very Good 64.3% Lower Norton Low Moderate Low Low 81.2% Very Good 50.8% Lower Norton Low Low Hoderate Moderate Low 96.9% Very Good 71.9% Lower Norton Low **Moderate High Low 95.5% Very Good 75.4%** Lower Norton Low High Low Low 84.8% Very Good 58.2% Lower Norton Low **High Moderate Low 96.6% Very Good 81.6%** Lower Norton Low High High Low 98.9% Very Good 41.7% and Good 32.1% Polkemmet South Low Low Low Low Low Low Low Moderate 53.4% Moderate 28.9% and Very Good 26.7% and Good 21.1% Polkemmet South Low Low Low Low Moderate Low 60.8% Very Good 48.1% Polkemmet South Low Low High Moderate 57% Very Good 50.4% Polkemmet South Low Moderate Moderate Low Moderate 17.8% and Low 39.4% Very Good 35.2% and Moderate 25.5% Polkemmet South Low Low Moderate Moderate Moderate Low 69.9% Very Good 60.2% Polkemmet South Low **Moderate High Low 67.1% Very Good 62.3%** Polkemmet South Low Low High High Low Low Low Low 46.5% and Moderate 42.8% Very Good 42.6% Polkemmet South Low **High Moderate Low 69.2% Very Good 68.1%** Polkemmet South Low Low High High High Low High Low 73.7% Very Good 35.8% and Good 30.9% Polkemmet South Moderate Moderate Low Low Low Moderate 31% And High 44.1% Poor 32% and Moderate 31%

Table L1: Management Scenario Testing results under moderate conditions under moderate previous river level, for four sites: Lower Norton, Polkemmet South, Upstream Ellis Crossing, and Tarranyurk

