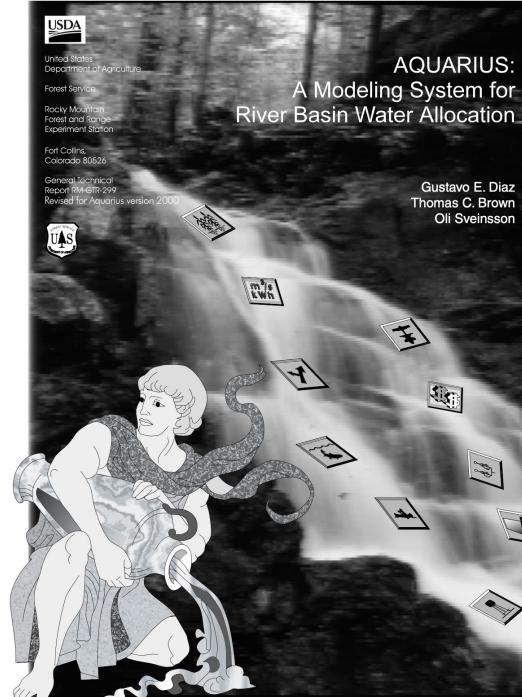


# Water Resources Engineering and Management

(CIVIL-466, A.Y. 2024-2025)

5 ETCS, Master course

**Prof. P. Perona**  
Platform of hydraulic constructions



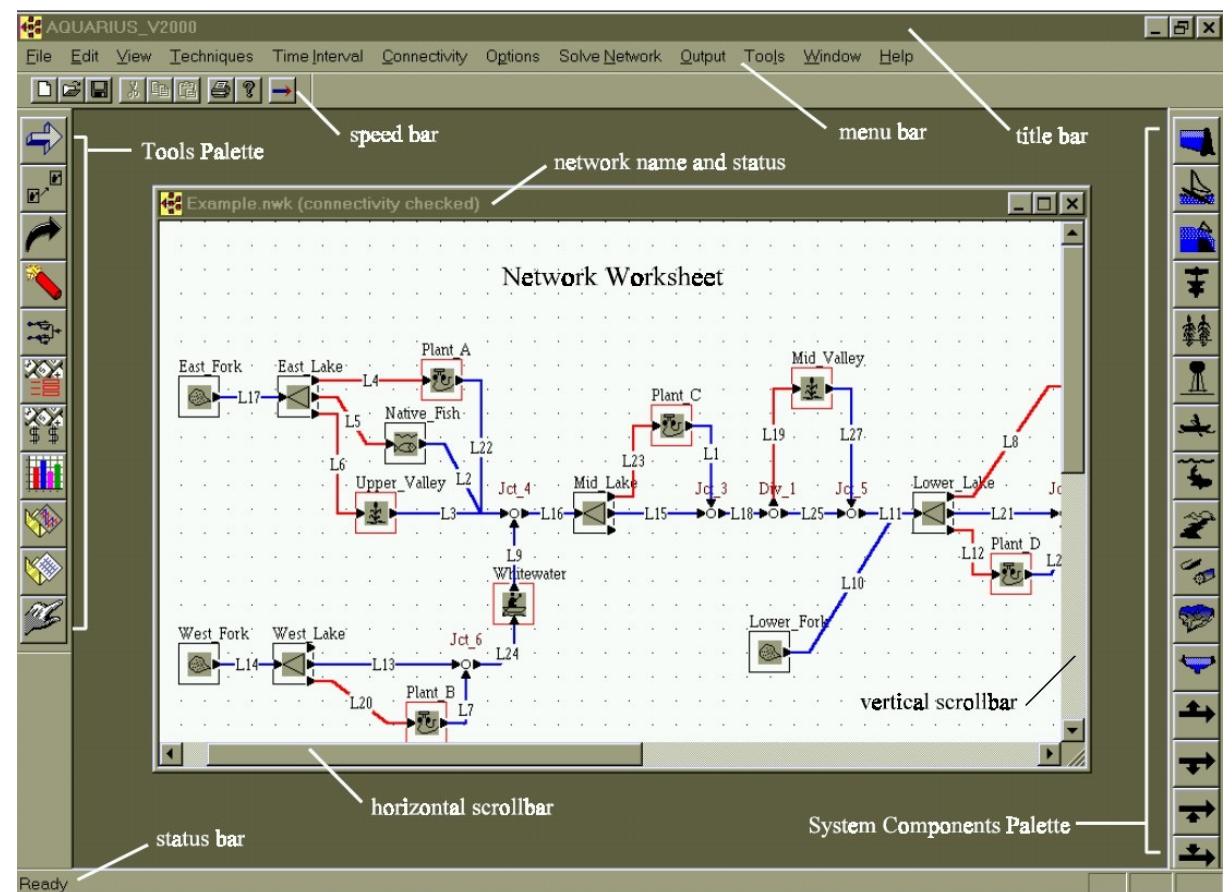
Lecture 11-1: Quadratic Programming and  
AQUARIUS software

# A modelling system for river basin water allocation (AQUARIUS)

AQUARIUS is a computer model devoted to the temporal and spatial allocation of flows among competing water uses in a river basin that can be used to evaluate either financial or economic efficiency.

AQUARIUS implements an object-oriented-programming language

## What is AQUARIUS?



# Water resources models

## THREE TYPES:

- Simulation models. Are a conceptualization of a water system and are used to predict its hydrological response under predefined operational conditions
- Optimization models. Are able to take a decision (i.e., allocate water) depending on water inflow and demand. They automatically search for an optimal solution to the water allocation problem for all the time periods of interests, e.g. allow for dynamic programming.
- Network-flow models. Basically, these models can combine characteristics of both simulation and optimization but their performance are limited and does not allow for dynamic programming.

## Which types of water management models?

Other examples:  
REsources ALlocation Model  
(REALM)  
Perera et al., J. Env. Manag. 2006

SWAM (Simplified water Allocation model)  
<https://hydrology.dnr.sc.gov/pdfs/swm/TechnicalReports/SWAMusermanv4dot0.pdf>

# Generalities on AQUARIUS

Aquarius is a river basin model that integrates traditional and non traditional water uses using programming language and graphics capabilities (Object-Oriented-Programming )

- Traditional: flood control, hydropower, irrigation, urban water supply, etc.
- Non-traditional: preserving of biological geomorphological integrity of rivers, recreational activities, etc.

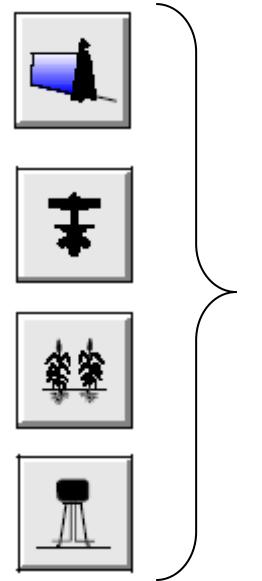
## What types of water uses does AQUARIUS consider?

Type of value	Function (examples)	Type of function (examples)	Possible methods for economic evaluation
Utilitarian value	Commercial production	Hunting; fishing; plant harvesting	Monetary market value
	Protection	Shelter for man-made development; shelter for other habitats	Cost of flooding and erosion resulting from lack of protection; cost of replacement
	Pollution control; disposal of waste products; climate regulation	Absorption of pollution/sewage	Contingent valuation methods; unknown/indirect
User value	Quality of life	Providing natural beauty and a healthy and enjoyable environment	Hedonic house prices; contingent valuation methods
	Recreation	Bird watching; sport fishing; walking; jogging	Travel cost methods
	Education	School visits; projects	User willingness to pay
Nonuser value	Existence/bequest	Ecological role; existence for own sake Option for future use; bequest for future generations	Incalculable; indirect Nonuser willingness to pay

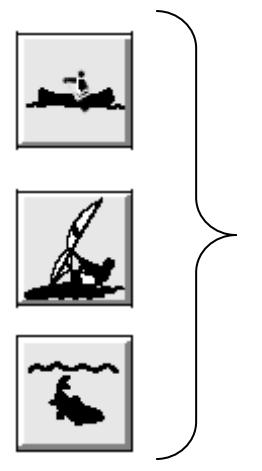
Table 1. A schematic approach to economic evaluation of environmental services (adapted from Tunstall and Coker 1992).

# Water uses implemented in AQUARIUS

- Storage reservoir
- Hydropower plants
- Agricultural water use
- Municipal and industrial water use
- Instream recreation water use
- Reservoir recreation water use
- Instream flow protection



Traditional



Non Traditional

## What types of water uses does AQUARIUS include

Aquarius considers demand functions for some water uses (including related expenses for raw water)

Irrigation, Municipal, Commercial, Industrial, Hydropower, Riparian recreation,

For each water use the benefit function at a given instant of time  $i$  depends on how the related demand function can be allocated

# Quadratic Programming: optimal water allocation

1. Income distribution is accepted as given
2. Consumers are the best judges of their welfare (values assigned to goods and services are unquestioned)
3. Impacts outside the boundary of the analysis can be ignored

What are the main assumptions behind AQUARIUS's philosophy?

Benefits B and Costs C over  $np$  period of time are referred to the present value PV  
( $r$  is the discount rate)

$$PV[r] = \sum_{i=0}^{np} \frac{(B_i - C_i)}{(1 + r)^i} \quad (\text{See also Lecture 6})$$

Target: maximise the total benefit function in discrete form

$$TB = \sum_{i=1}^{np} \sum_{j=1}^{nu} \int_0^{a_{ij}} f_{ij}(x_{ij}) dx_{ij}$$

$np$  = total number of time periods  
 $nu$  = total number of water uses  
 $a$  = level of consumption.

# Benefit functions and solution techniques

Example: Irrigation demand area

Let us assume that the marginal value of the demand function is

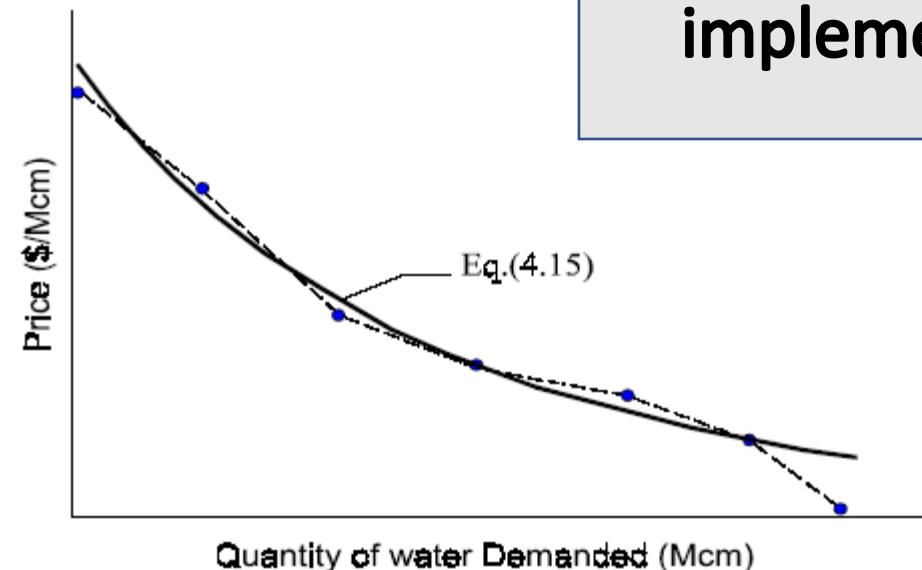
$$b^{\text{IRR}} [\$/\text{Mcm}] = a_3 \exp(-A/b_3)$$

$A$  = total volume entering the IRR area

The integral of such a relation gives the total benefit at time  $i$

$$B_i^{\text{IRR}} = \int_0^{A_i} a_{3i} \exp(-z/b_{3i}) dz = a_{3i} b_{3i} [1 - \exp(-A_i/b_{3i})]$$

How are marginal demand functions implemented?



Therefore the total benefit function for all the  $np$  period and all the  $nu$  water uses is

$$TB = \sum_{i=1}^{np} \sum_{j=1}^{nu} \int_0^{a_{ij}} f_{ij}(x_{ij}) dx_{ij}$$

where  $\int_0^{a_{ij}} f_{ij}(x_{ij}) dx_{ij}$  is the benefit of the  $j$  water use at time  $i$ .

The overall objective is to maximize the total benefit function TB, i.e. mathematically this can be written as

$$\underset{\mathbf{x}}{\text{maximize}} \quad TB(\$) = \sum_{i=1}^{np} \sum_{u=1}^{nu} B_i u$$

where the vector  $\mathbf{x}$  is the set of the control variables.

What is the objective function to be maximized?

IMPORTANT NOTICE: Optimization is made among the water uses but also over time periods, which makes the software suitable for planning

Physical, operational and institutional constrictions such:

- reservoir storage limitations
- firm water supply
- seasonality of water supply
- firm energy production
- max/min instream flows
- max/min offstream diversion

**Which physical and operational constraints are taken into account?**

define the problem constraints (three types)

► equality constraints

$$\sum_{n=1}^N a_{kn} x_n = r_k \quad \text{for } k = 1, 2, \dots.$$

► inequality constraints

$$\sum_{n=1}^N a_{kn} x_n \geq r_k \quad \text{for } k = K_{e+1}, \dots, K$$

► bounded variables

$$x_n^L \leq x_n \leq x_n^U \quad \text{for some of the } x_n$$

# Numerical solution method

The water allocation problem involves a set of exponential/linear/constant demand functions and therefore determine a complex nonlinear objective function with multiple minima that may condition the maximization of TB.

Exception made for the nonlinear objective function, the nonlinear problem above is similar to a standard programming problem.



Method of quadratic approximation

**Which solution method does AQUARIUS adopt?**

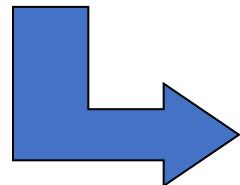
The objective function is reduced to a quadratic form with linear constraints

# Quadratic approximations

A quadratic approximation is a close representation of the nonlinear objective function  $f(\mathbf{x})$

$f(\mathbf{x})$  can be expanded in Taylor series around a point  $\mathbf{x}^*$  which represents an Initial Feasible Solution (IFS)

$$f(\mathbf{x}) \approx f(\mathbf{x}^*) + \nabla f(\mathbf{x}^*)^T \partial \mathbf{x} + \frac{1}{2} \partial \mathbf{x}^T \mathbf{H}(\mathbf{x}^*) \partial \mathbf{x}$$



$$\underset{\mathbf{x}}{\text{Max}} \left[ f(\mathbf{x}) = \mathbf{w} + \mathbf{c}^T \mathbf{x} + \frac{1}{2} \mathbf{x}^T \mathbf{Q} \mathbf{x} \right]$$

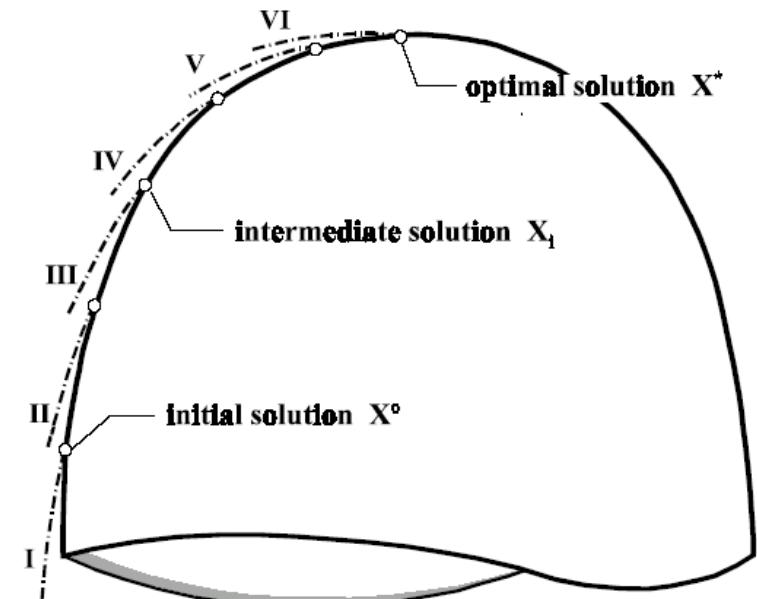
Standard Q.P.  
problem

- ▶ subject to the linear constraints
- ▶ and nonnegativity conditions

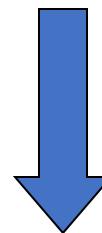
$$\mathbf{g}(\mathbf{x}) = \mathbf{A} \mathbf{x} \geq \mathbf{r}$$

$$\mathbf{x} \geq \mathbf{0}$$

## How do quadratic approximations work?



- NOTE: The gradient vector  $\nabla f(\mathbf{x}^*)$  and the Hessian  $H(\mathbf{x}^*)$  require, in principle, computation of first, second and second-cross partial derivatives which may introduce noise because of numerical calculation.



The reason why the problem is approached in deterministic way is that derivatives are calculated algebraically and the assembling is therefore easier

The latter step is called **MATHEMATICAL CONNECTIVITY**

**At which step is the numerical method implemented in AQUARIUS?**

NOTICE: Building up the mathematical connectivity matrix is a milestone step for performing numerical optimization!

Aquarius then maximises the total return over a planning horizon, subject to all required operational restrictions

This is done iteratively using the set of variable obtained at each iteration as new starting point.

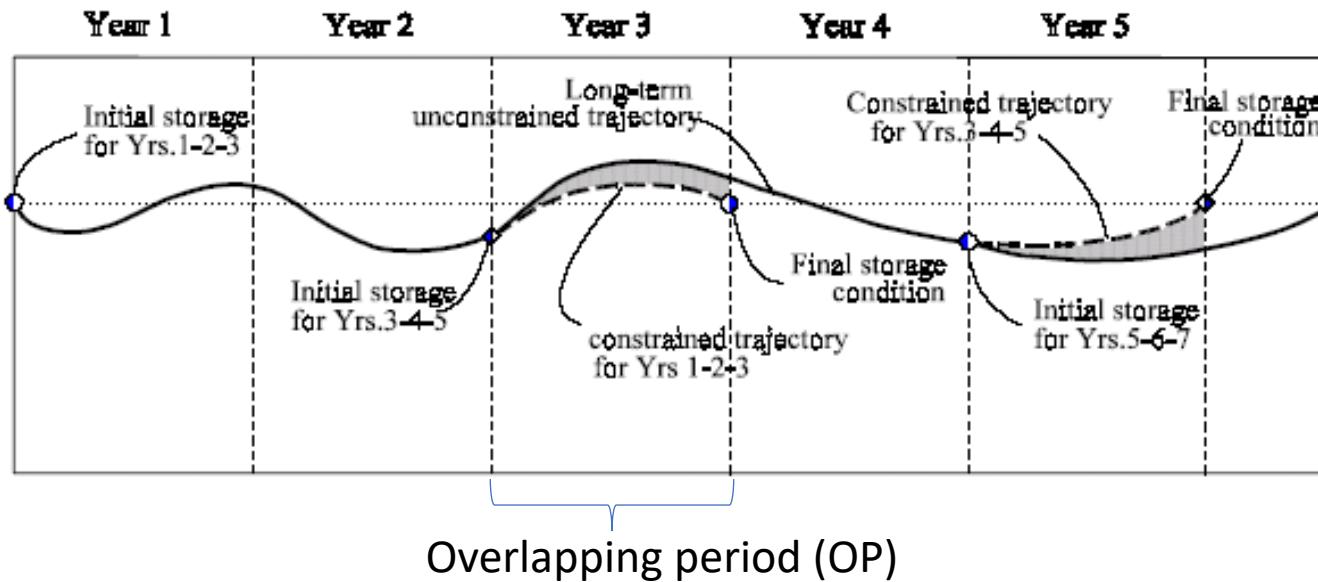
Optimal solution is reached when successive optimal values do not differ by more than the stipulated tolerance limit or when the maximum number of iteration is reached

IMPORTANT: the optimal solution that is obtained by standard QP is only true for the approximated objective function defined by the Taylor expansion of the function  $f(\mathbf{x})$ .

**How is numerical optimization achieved and when ?**

# Period of analysis and optimization horizon

Aquarius can be used in a *full optimization mode* for general planning purposes or in a *quasi-simulation mode* with restricted foresight capabilities, but efficient over very long time periods.



**What are the period of analysis and the optimization horizon concepts?**

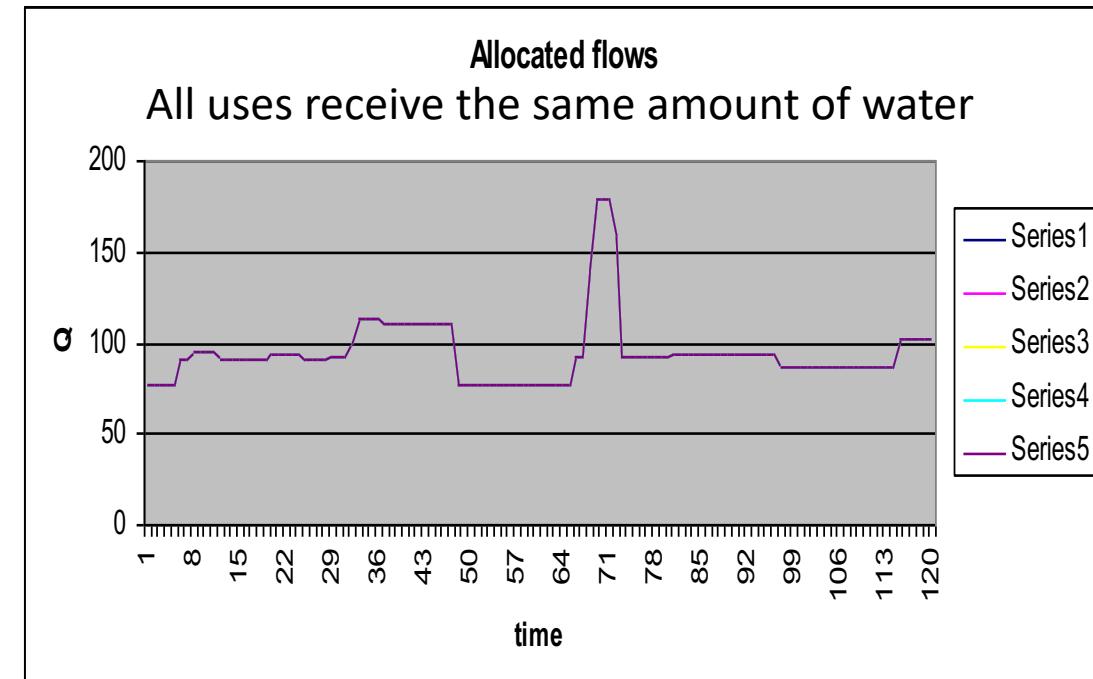
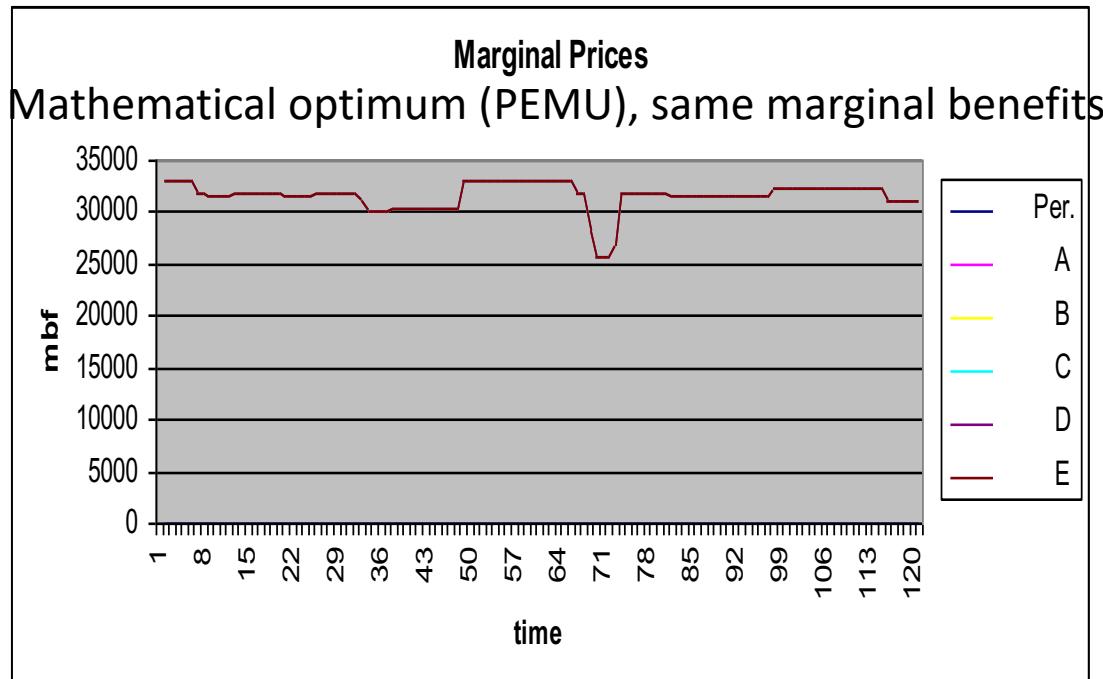
*Period of analysis (PA):* specify the length of the whole segment of time for which the model will simulate the allocation problem

*Optimization horizon (OH):* specify how far in the future the model should look to build the optimal operational policies

# Bounded vs unbounded solutions of optimal water allocation

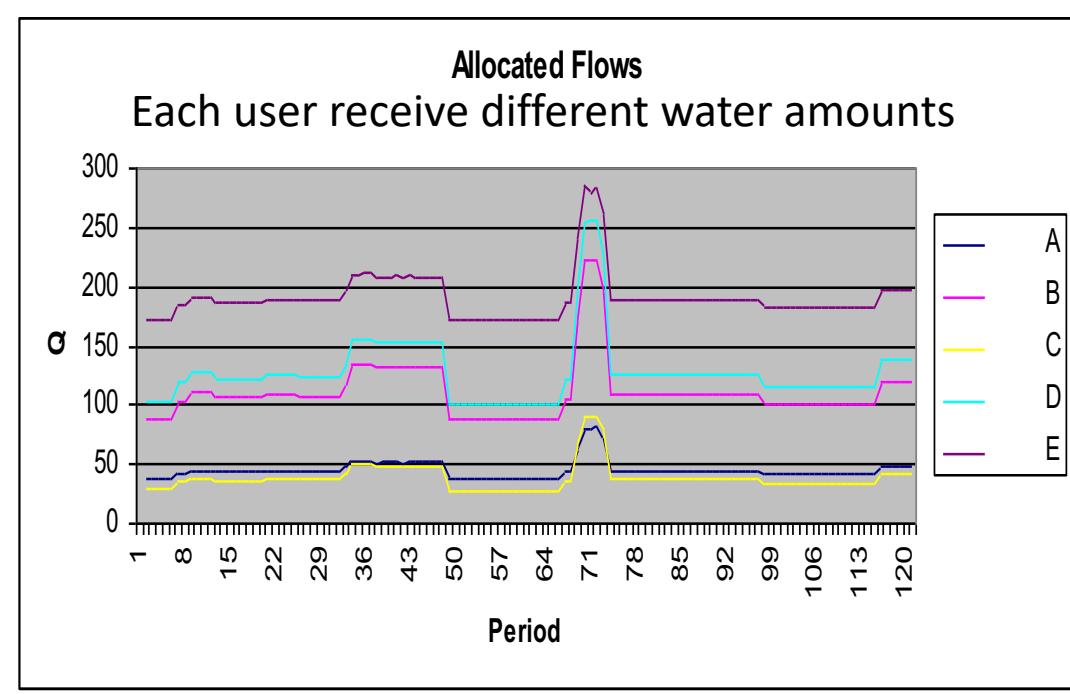
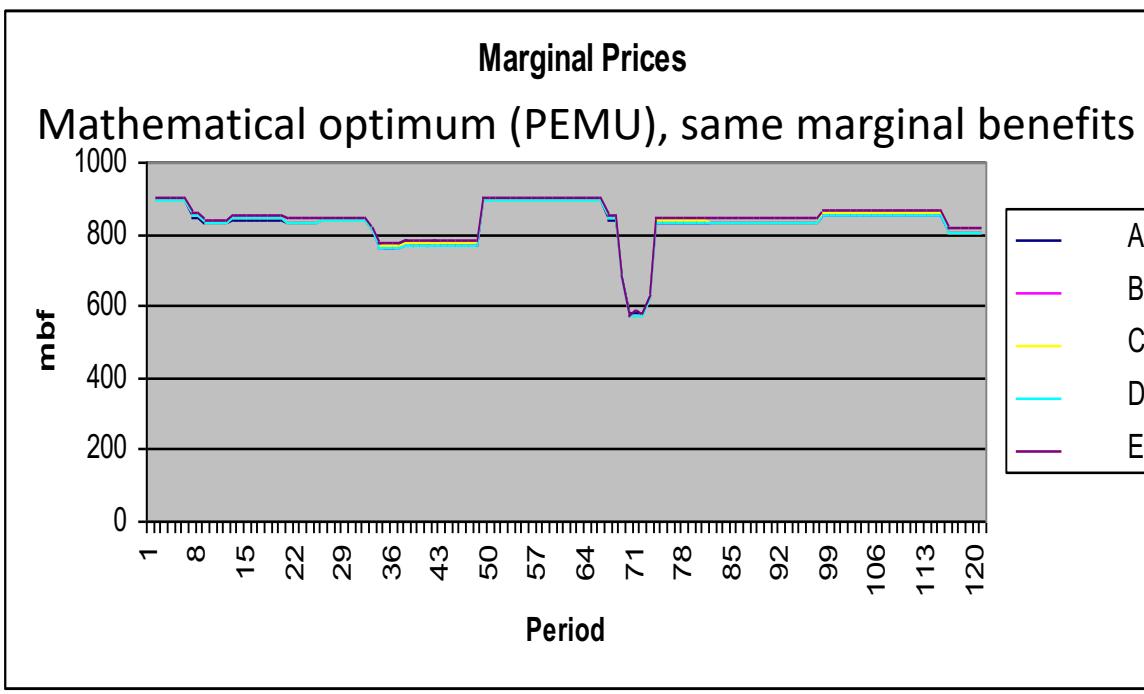
# Unbounded solutions

**Case 1.** Water users have in principle no constraints in the quantity of water that is being allocated, but equal marginal demand functions (i.e., exponential). What conclusions can you derive from the resulting solution in Figure below? Does the distribution of the marginal prices of the resource that is being allocated between water uses reflect your expectations?

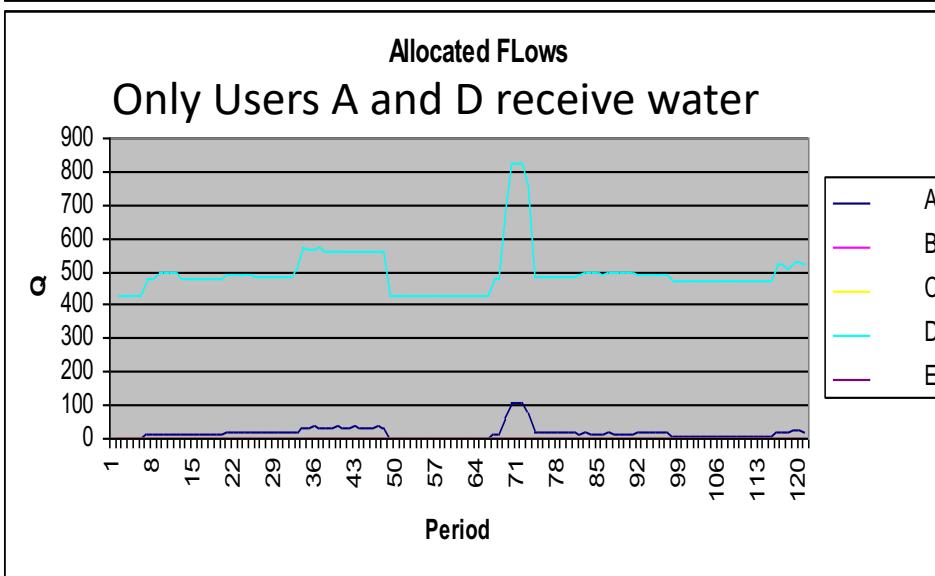
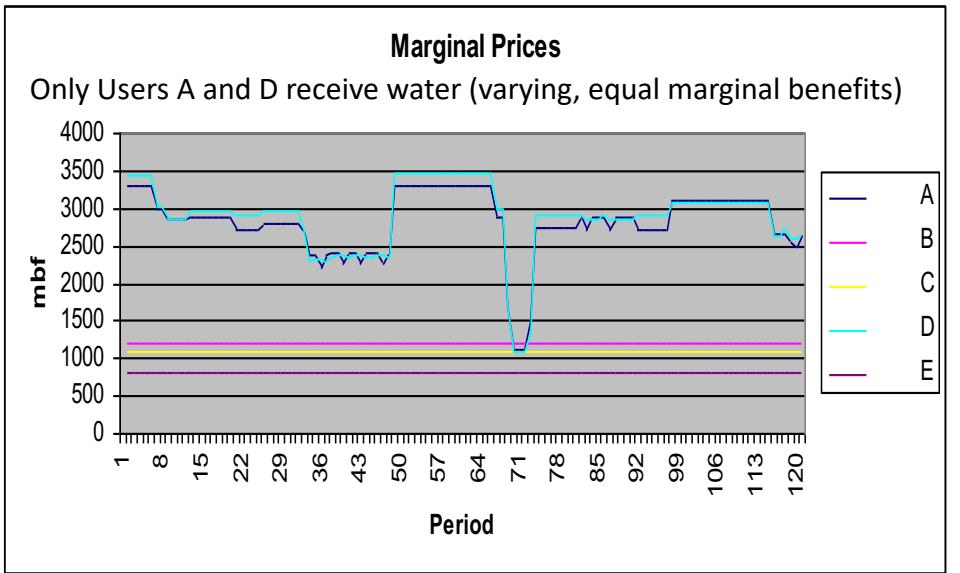


# Unbounded solutions

**Case 2.** Water users have in principle no constraints in the quantity of water that is being allocated, but they have different values for the parameters of the exponential demand function. Compared with Case 1, why does the optimisation allocate now a different amount of water among the users?

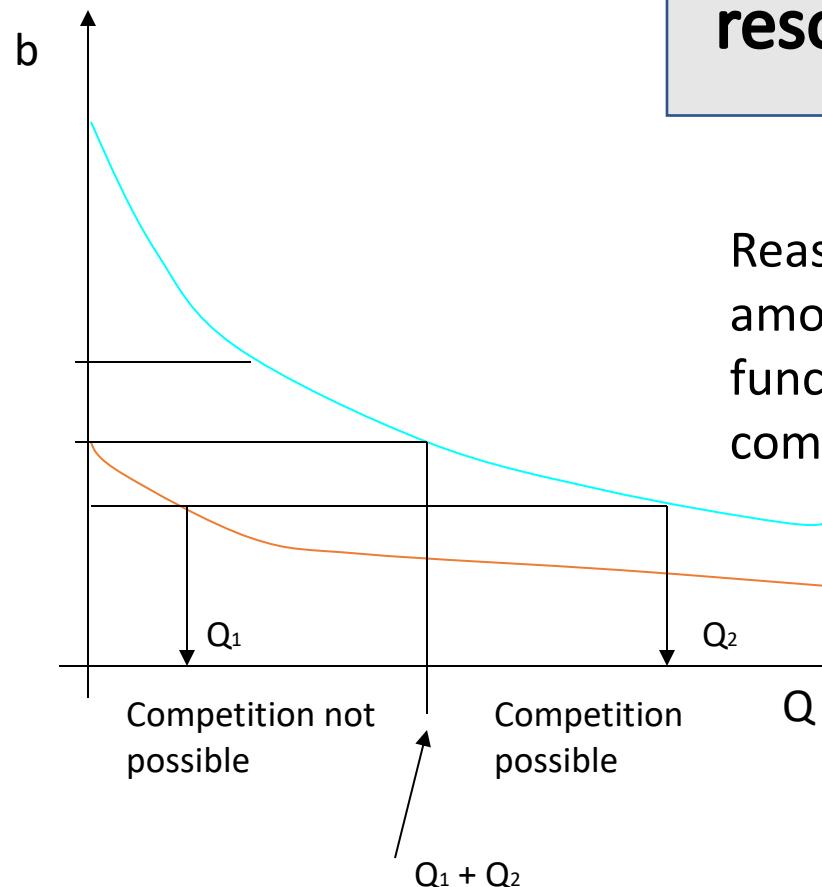


# Resource-limited optimization (unbounded case)



Competition is not possible for Users B,C,E (too low demand function)

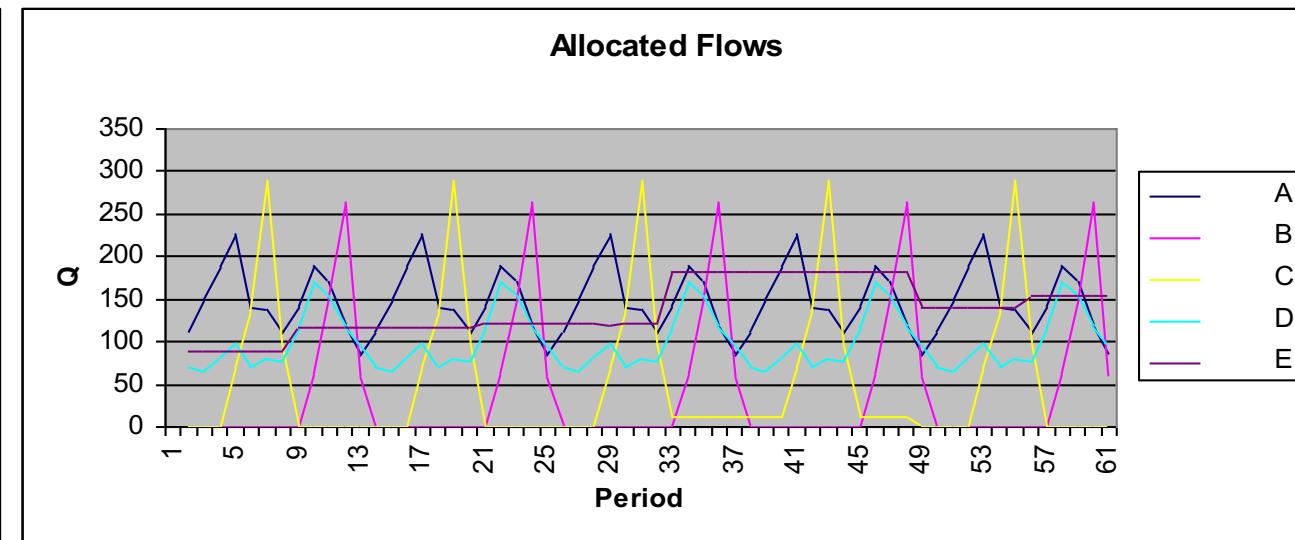
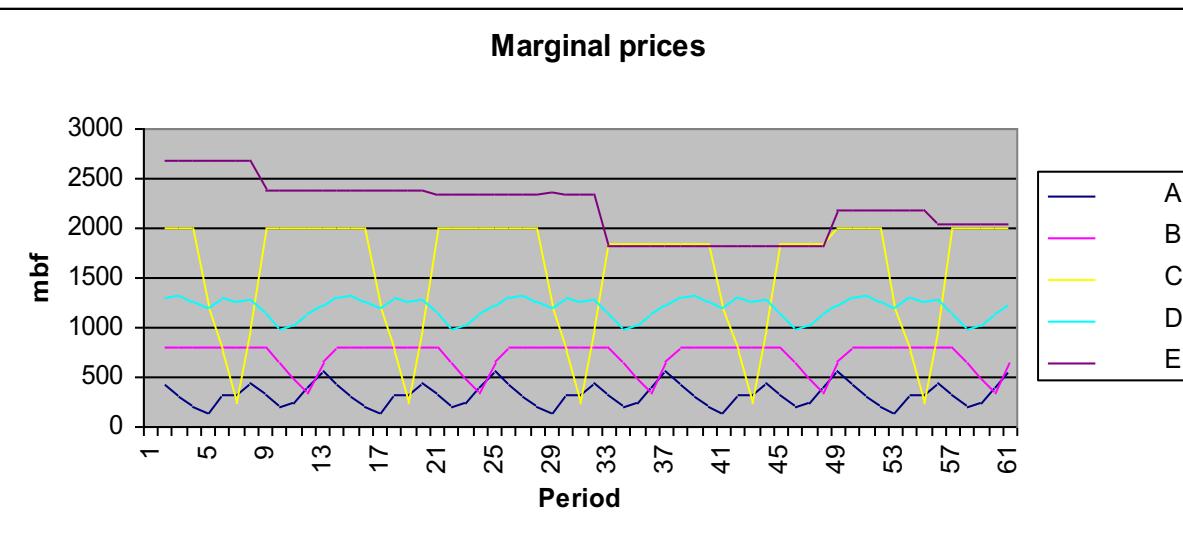
**Which solution is found when the resource is limited?**



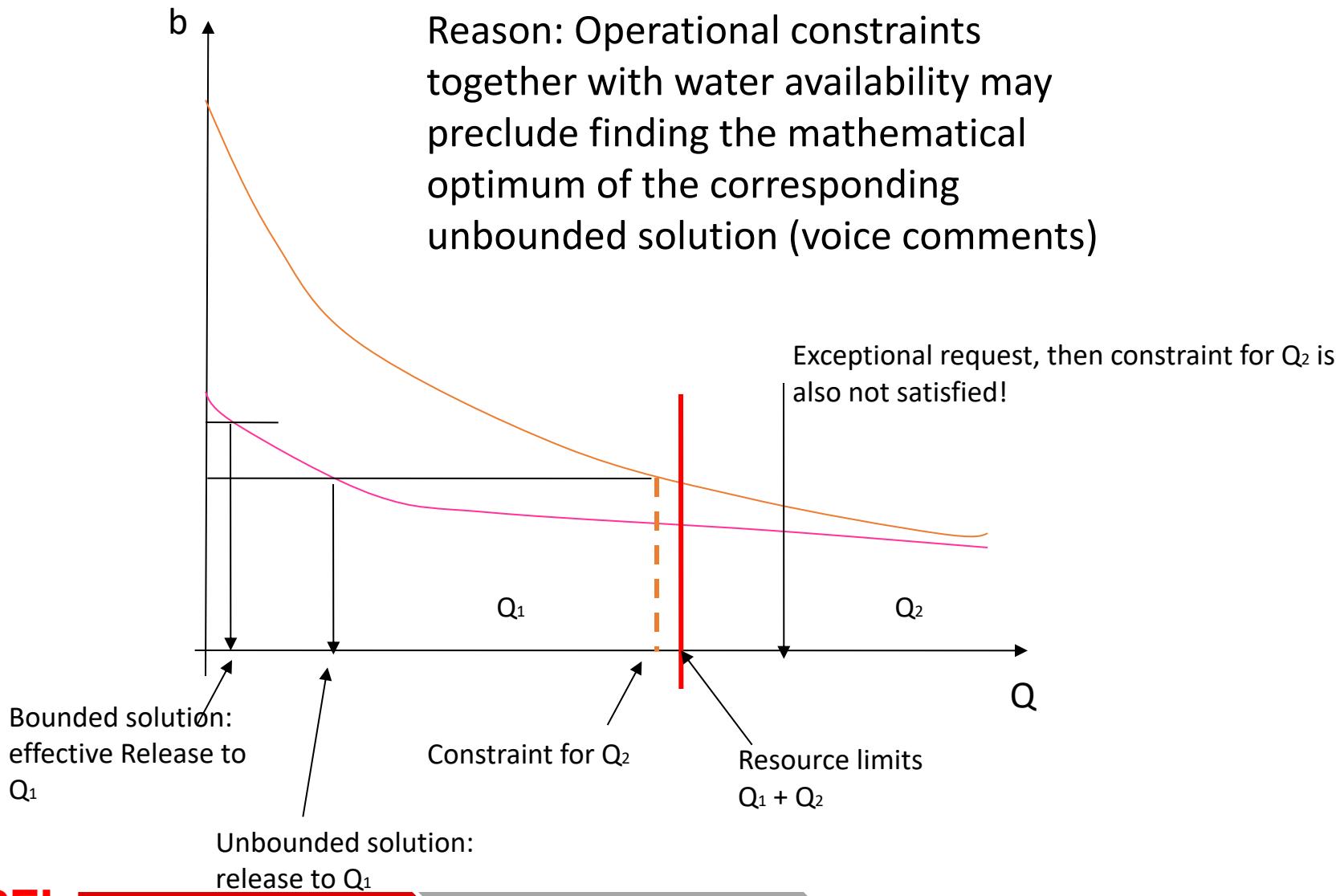
Reason: Disproportion among marginal benefit functions (voice comments)

# Bounded solutions (due to operational constraints)

**Case 3.** All water uses have a constraint of minimum flow to be satisfied and either equal or different marginal benefit functions. The optimization over a period of N (free choice) years may return the results below.

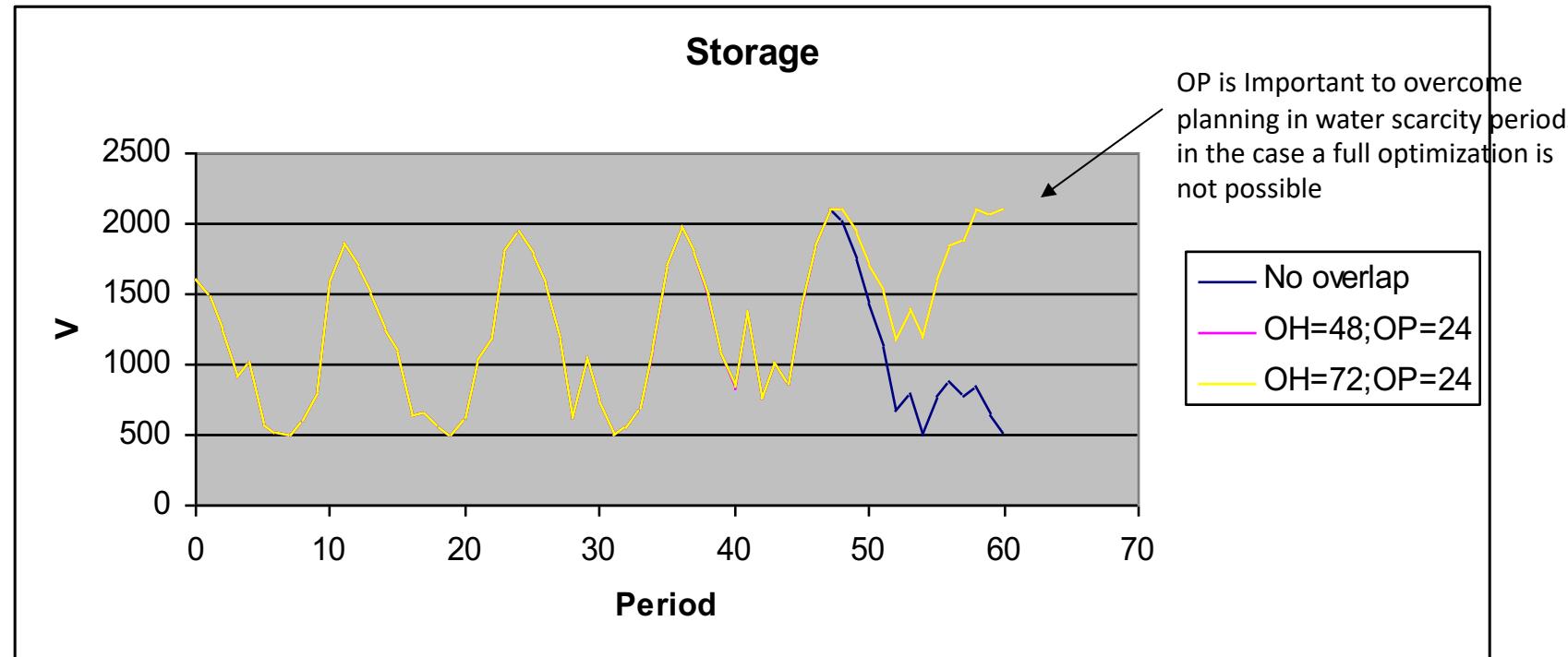


**Which solution is found when the request is constrained?**



# Using Optimization horizon and overlapping periods

**Case 4.** If there is a long and unexpected drought at the beginning of a given year (e.g., here the 6<sup>th</sup> year) then best optimization can be found by playing with OH and OP parameters. The example below shows the case of a network whose best optimisation strategy must be performed over a total period of analysis of 120 Months. A substantial difference with OH=60 ; OP=0, and then with OH=72 ; OP=24. can be observed which is due to the full optimization capability of AQUARIUS

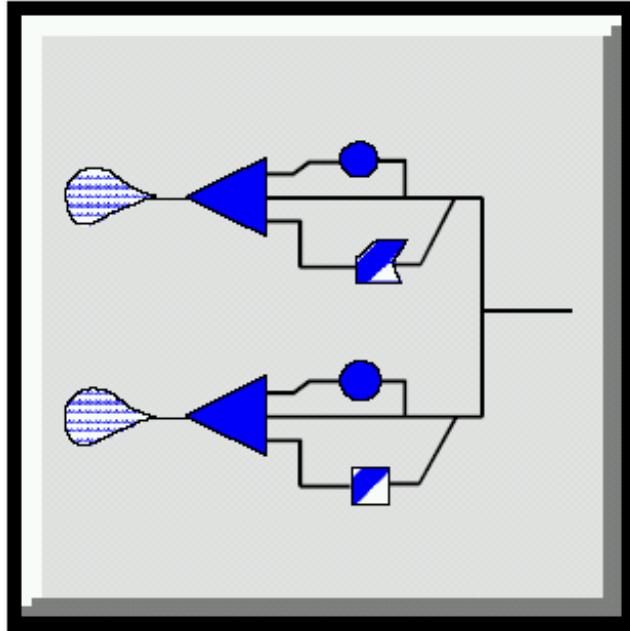


# Software description and use

# The river basin system

*". . . a set of elements which interact in a regular manner. Every system must have a well defined boundary or rule which specifies and distinguishes that which is in the system from the environment in which it exists. There will be inputs and outputs across the boundary which must also be defined."*

Hall & Dracup, 1970



## System Components

(Interacting within the system)

- Natural basins
- Reservoirs
- Hydropower systems
- Urban water use
- Irrigation demand areas
- Instream recreation activities
- Etc.

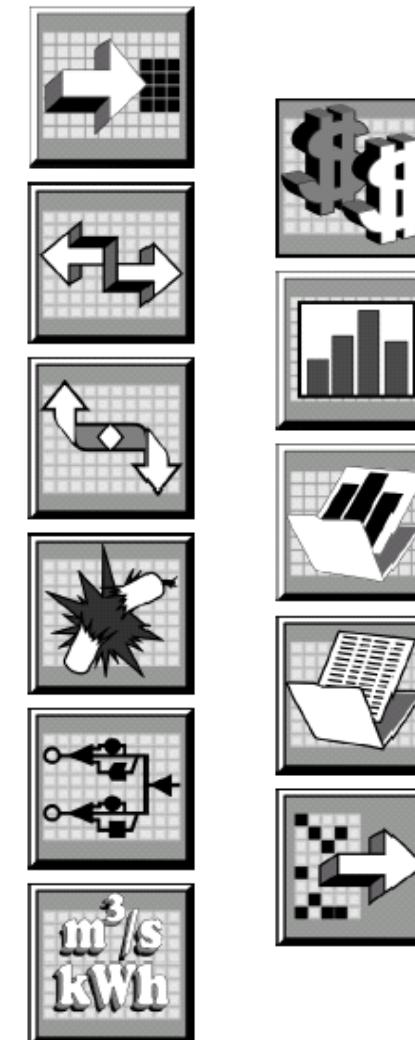
## System Boundaries (defined by the flow network)

- INPUTS (information)  
natural flows, water demand for irrigation, instream flow requirements, price for energy, etc.
- OUTPUTS(performance)  
monetary values, energy produced, biological indexes, etc.

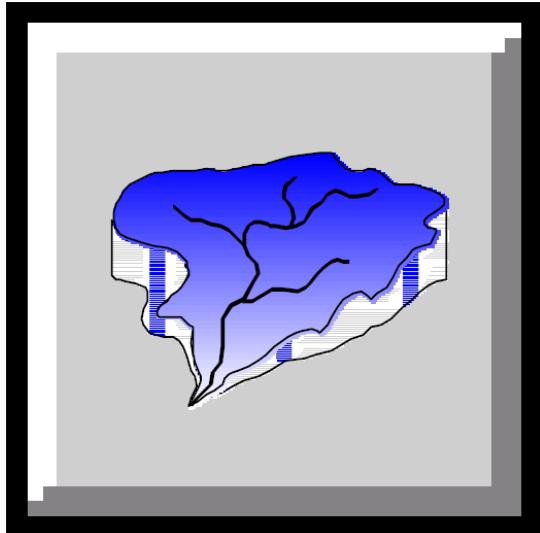
- Component Palette



## Tools Palette



# Flow Basin



*Flow Basin*.. creates a water source area (basin) contributing uncontrolled flows.

## Physical Characteristics

Name of river/basin [alphanumeric]  
Input file name [Path....]

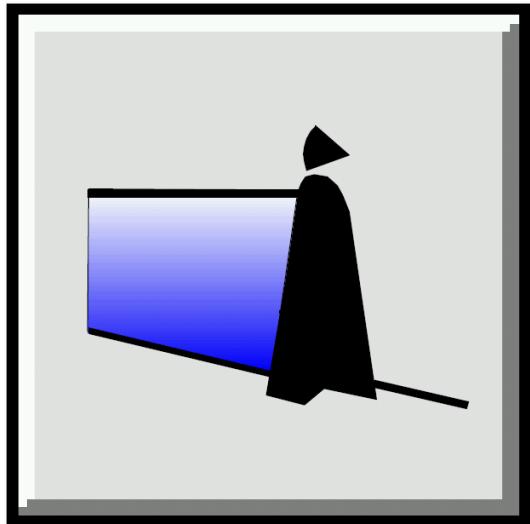
Requires specific inputs of inflows from a data file

# Water uses

- They require that both physical and operational characteristics are specified for the particular application.
- Moreover they are subjected to operational constraints which define the domain within the allocation problem must be optimized.
- Economic inputs need also to be declared in order to specify the demand functions (i.e., the marginal price that users are willing to pay)

# Storage reservoir

Transforms the random and periodic nature of flows into a series of releases that more closely corresponds with the seasonal water demand in a river basin



$XI$	= controlled inflows
$d^u$	= upstream decision variable
$UI$	= uncontrolled inflows
$NF^u$	= upstream natural flows
$L^u$	= upstream reservoir spillage
$XR$	= controlled releases
$d$	= decision variable
$UR$	= uncontrolled releases
$L$	= reservoir spillage
$E$	= reservoir evaporation

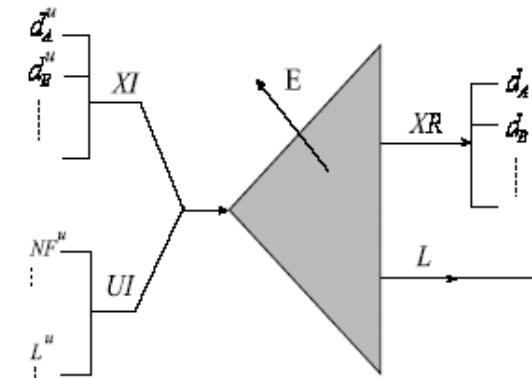


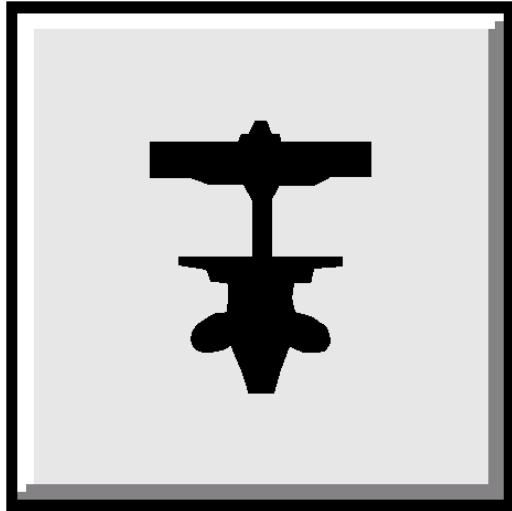
Figure 3.1 Variables used to describe storage dynamics in a reservoir.

Requirements: elevation-storage curve  $H = c_1 S^{d_1}$

Minimum and maximum operating storage

# Hydropower system

*Hydropower..* creates a powerplant for hydroelectric generation.



## Energy Generation Benefits

Average energy price:  $P$  [\$/MWh]

Seasonal energy prices:  $P_s$  [\$/MWh]

Energy demand function; Parameters:  $a_2, b_2$

## Physical Characteristics

Name of hydropower plant [alphanumeric]

Installed capacity [MW]

Design discharge [ $\text{m}^3/\text{s}$ ]

Turbine-generator efficiency [ - ]

Energy rate vs. storage function, Parameters:  $a_1, b_1$

Tailwater Elevation vs. Storage function:

## Firm Energy:

Seasonal Pattern [GWh]

## Maintenance Schedule

Index of availability of the hydropower units [ - ]

## Maximum Release

Seasonal values [Mcm]

## Minimum Release

Seasonal values [Mcm]

## Operational Constraints (check-box)

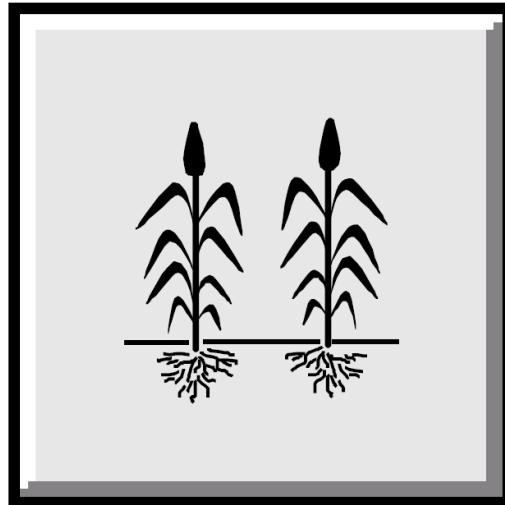
Minimum release

Maximum release

Firm energy

# Agricultural water use

*Irrigation..* creates an offstream demand area of agricultural water.



## Agricultural Benefits

Seasonal demand function; Parameters:  $a_3, b_3$

### Physical Characteristics

Name of irrigation area [alphanumeric]

Coefficient of return flow [ - ]

### Maximum Flow

Seasonal values [Mcm]

### Minimum Flow

Seasonal values [Mcm]

### Operational Constraints (check-box)

Minimum flow

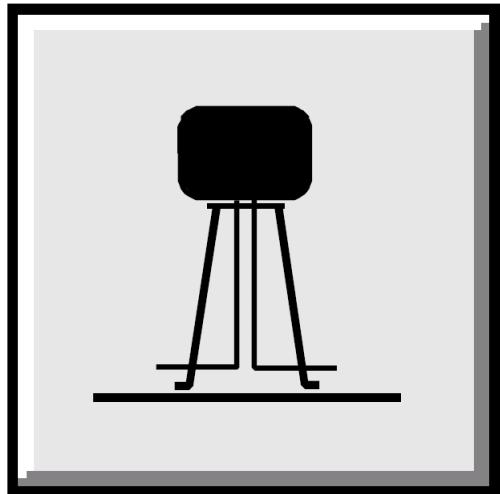
Maximum flow

Seasonal Pattern

Annual firm water

# Municipal and industrial water use

*Municipal and Industrial..* creates an offstream demand area for urban and industrial water.



## Physical Characteristics

Name of municipal and industrial area

Coefficient of return flow

## Maximum Flow

Seasonal values [Mcm]

## Minimum Flow

Seasonal values [Mcm]

## Operational Constraints (check-box)

- Minimum flow
- Maximum flow
- Seasonal Pattern
- Annual firm water

## Urban and Industrial Water Supply Benefits

Seasonal demand function; Parameters:  $a_4, b_4$

# Instream recreation water use

*Instream Recreation..* creates a river reach with water based recreation activities.



## Physical Characteristics

Name of instream recreational area

## Maximum Flow

Seasonal values [Mcm]

## Minimum Flow

Seasonal values [Mcm]

## Operational Constraints (check-box)

Minimum flow

Maximum flow

## Instream Recreation Benefits

Seasonal demand function; Parameters:  $a_5, b_5$

# Reservoir recreation water use

*Reservoir Recreation..* creates a reservoir with water recreation activities.



## Physical Characteristics

Name of reservoir [alphanumeric]

Elevation vs. storage function, Parameters:  $c_1, d_1$

Area vs. storage function:  $c_2, d_2$

## Evaporation

Seasonal evaporation rates [mm]

## Operational Characteristics

Initial storage [Mcm]

Minimum storage [Mcm]

Maximum storage [Mcm]

Final storage [Mcm]

## Operational Constraints (check-box)

Minimum storage

Maximum storage

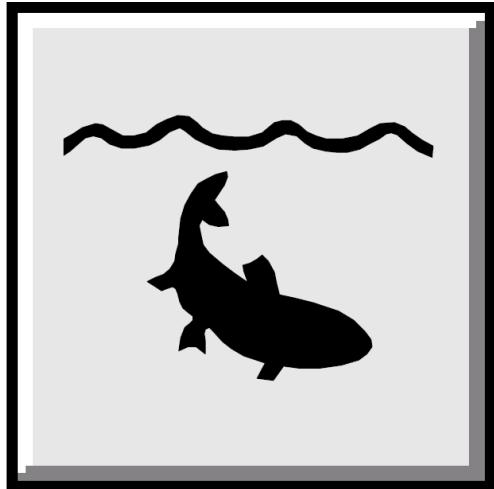
Final storage

## Lake Recreation Benefits

Seasonal demand function, Parameters:  $a_6, b_6, c_6$

# Instream flow protection

*Instream Flow Protection..* creates a river reach designated for fish habitat protection.



## Physical Characteristics

Name of conservation area [alphanumeric]

## Maximum Flow

Seasonal values [Mcm]

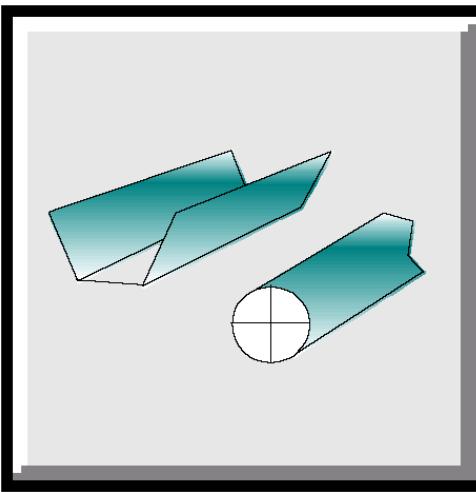
## Minimum Flow

Seasonal values [Mcm]

## Operational Constraints (check-box)

- Minimum flow
- Maximum flow

# Flow conveyance structures



*Canal/Pipeline..* creates a flow conveyance structure such as a canal or pipeline.

## Physical Characteristics

Name of river reach [alphanumeric]

Description [alphanumeric]

Length [m]

Connectivity, From: \_\_\_\_\_ To: \_\_\_\_\_

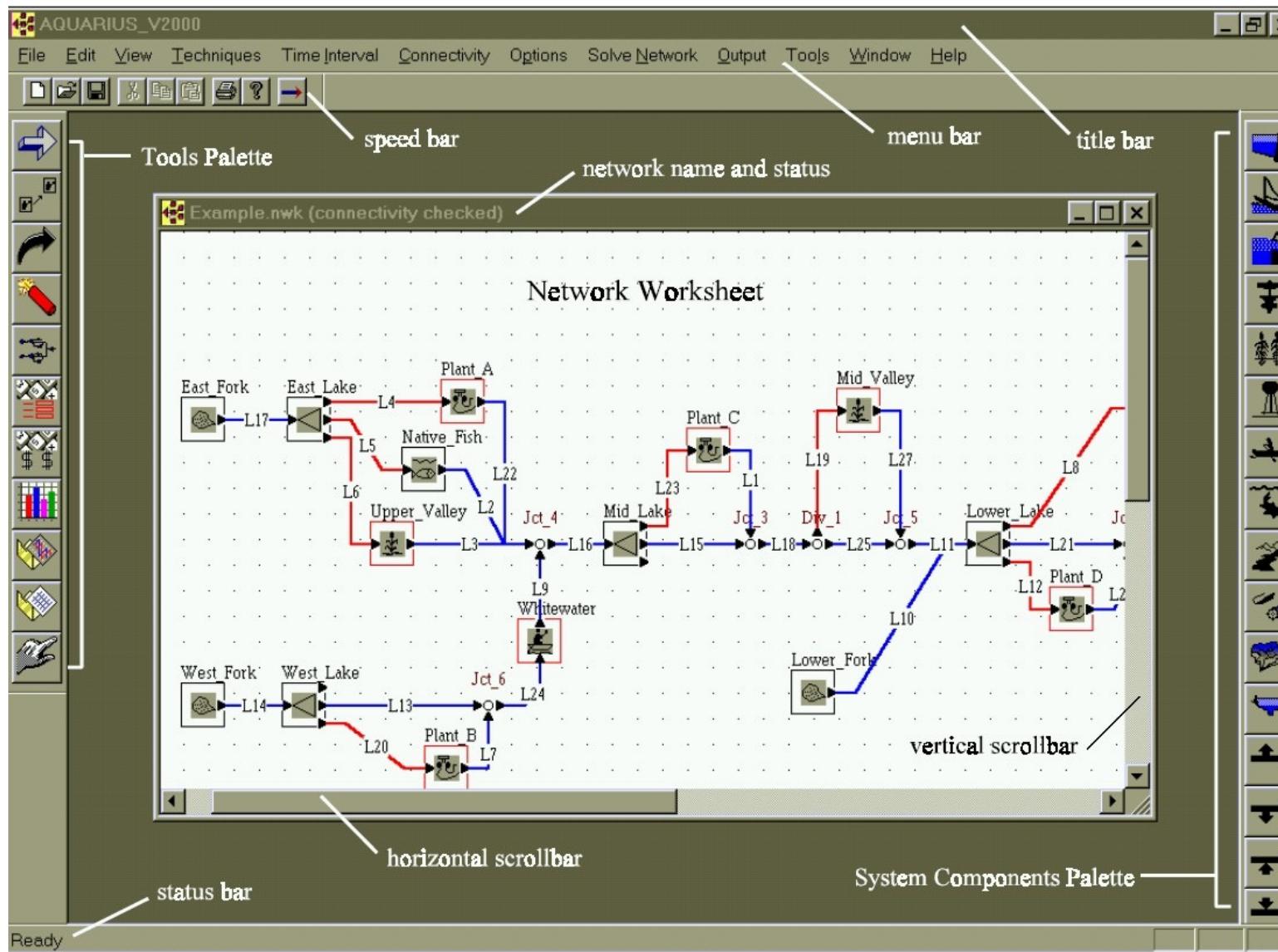
## Hydraulic Characteristics

Maximum flow capacity [ $m^3/s$ ]

Flow velocity [m/s]

Canal/pipe losses [l/km]

# The model chart



# Updating network connectivity

Once the flow network is assembled, the model conducts a series of validation steps before proceeding to solve the water allocation problem.

- all WSCs are named
- all WSCs that compete for water have marginal prices different from zero
- Water uses such as IRA, IFP, FCA are instream users
- reservoirs have a waterway available for releasing uncontrolled spills
- Component connections are hydraulically sound

Table of Nodes for: Example.nwk

No.	Name	Type	Price	Connections	
			Function	Upstream	DownStream
1	Big_City	MUNICIPAL	Yes	Lower_Lake	-
2	East_Fork	NATURALFLOW	No	-	East_Lake
3	Plant_D	POWERPLANT_VH	Yes	Lower_Lake	Jct_3

Table of Links for: Example.nwk

File

No.	Name	From	To	Description
1	L1	Plant_A	Jct_5	routing
2	L2	East_Fork	East_Lake	natflow
3	L3	Plant_C	Jct_4	routing
4	L4	Div_2	Mid_Valley	decision
5	L5	Upper_Valley	Jct_5	return
6	L6	Lower_Lake	Plant_D	decision
7	L7	Native_Fish	Jct_5	routing
8	L8	Lower_Lake	Big_City	decision
9	L9	East_Lake	Plant_A	decision

# Optimization technique and time periods

