Optimal Coordination of Reservoirs for Flood Control using a Stochastic Approach

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Abstract
This paper presents a stochastic approach model for the optimal coordination of reservoirs. The proposed approach simulates the behavior of two reservoirs in parallel as primary infrastructure for flood control. The deterministic version consists on a set of equations that represent the inflows and outflows of the reservoirs, as well as the constraints associated with flood control. The stochastic version of the model resorts to a stochastic series generator, which produces different values of water flows which are processed through a deterministic model. With this information a set of possible operating scenarios is generated, and a reliability study is carried out, applied to the flood control zone. The validation of the proposed model is performed using the technical parameters of two reservoirs of the Colombian electrical system. With this type of models, new decision-oriented tools are offered related to flood prevention and control.

Keywords: Flood control, multipurpose reservoir, stochastic optimization, power systems.

I. INTRODUCTION
There are several international studies related to flood control and the optimal functioning of reservoirs. In China, for example, Hongwei and Zezhong presented the benefits of flood control along the Yellow River [1]. In [2], a reservoir operation scheme for flood control based on real-time information and forecasts is proposed for the Three Gorges project. In [3], a flood control model for the rainy seasons is proposed, applying a reliability and risk analysis based on hydrological forecasts also for the Three Gorges project. In Mozambique, a flood control model was proposed using a hydroelectric reservoir to mitigate the social impact of electricity generation [4]. Design elements for flood protection dikes in France are presented in [5]. In Vietnam, the operation of a reservoir based on several guide curves depending on the level of criticality was proposed for the Red River [6]. In Malaysia, the operation of reservoirs in cascade coordinated by means of guide curves was proposed, in which the volumes of the reservoirs are related by the curves [7]. In Canada, the flood control problem was addressed considering the impact of the basin downstream the plant due to discharges [8]. In [9], a state of the art of the models and optimization techniques used for the operation of hydroelectric reservoirs is presented. In [10], a stochastic model is proposed for flood control in Colombia during the La Niña phenomenon, using the infrastructure of a hydroelectric reservoir. In [11], a study of dynamic flood simulation applied to a Colombian case is presented. Other studies related to Colombian hydrology and reservoir control are presented in [12] and [13], respectively.

Colombia is a country highly affected by climatic phenomena such as El Niño and La Niña. The effects of these phenomena tend to have a high impact on the population, the economy and the infrastructure. The rainy season experienced, between 2010 and 2012, is considered by experts as the most devastating in the last 40 years and has been an important point to reflect on the country's response capacity to natural disasters to which it is exposed. In 2017, alerts were activated again for possible floods, taking into account that 30.4% of the generation reservoirs in the country had reached their maximum capacity, and recently the Institute of Hydrology and Environmental Studies (IDEAM) warns of the probability of a 75% occurrence of a La Niña in the last months of 2020. This situation has generated concern in the inhabitants: mainly ranchers and farmers, located downstream the generation plants.

In this paper a stochastic model is proposed to coordinate the operation of two reservoirs in parallel, in order to obtain an optimal balance between power generation and flood control, avoiding discharges and controlling the downstream flood zone, minimizing in this way the socio-environmental risks associated with floods.

II. METHODOLOGY
2.1 Deterministic model
The basic model of the energy system of a hydroelectric generator is composed of a reservoir and its corresponding flows. Figure 1 illustrates the schematic of the analyzed model, in which two reservoirs intervene. The variables used are: flows contributed by the basins upstream of the reservoirs (series E1 and series E2), discharge flows from the reservoirs for the purpose of producing electricity (VG1 and VG2),
discharge flows by dumping (Vv1 and Vv2), a flow attributable to an external river, which is not controlled by the reservoirs under study (external river), an unbalanced flow of each reservoir (evaporation + seepage) and finally, a flood control zone (FCZ), where a maximum flow is set in order to protect a population.

![Figure 1. Schematic representation of the reservoirs under study](image)

The objective function of the optimization problem is given by equation (1), which seeks to maximize profits from energy sales. The objective function is composed of the maximization of income from energy sales minus the penalties for discharges and flooding in the FCZ. The constraints given by equations (2) and (3) indicate the minimum and maximum limits of the discharge volume through the generation pipelines and the volume of each reservoir, respectively. The restriction given by (4) indicates the limit of the volume in the flood control zone in each time interval. Equation (5) represents the volume balance of each reservoir; equation (6) indicates the generation conversion factor and finally equation (7) represents the total volume in the FCZ.

\[
\text{Max} \sum_{j=1}^{m} \left( \sum_{i=1}^{n} P_j G_{ij} - V_{Vij} \right) - V_{Inu j} \tag{1}
\]

Subject to:

\[
V_{G_i \text{min}} \leq V_{Gi} \leq V_{G_i \text{max}} \tag{2}
\]

\[
V_{E_i \text{min}} \leq V_{Eij} \leq V_{E_i \text{max}} \tag{3}
\]

\[
V_{ZC_j} - V_{Inu j} \leq V_{ZC \text{max}} \tag{4}
\]

\[
V_{Eij} = V_{Eij-1} + V_{Qij} - V_{Gi} - V_{EFi} - V_{Vij} \tag{5}
\]

\[
G_i = V_{Gi} \times FC_i \tag{6}
\]

\[
V_{FCZ_j} = \sum_{i=1}^{n} \left( V_{G_{ij}} + V_{V_{ij}} \right) + V_{Qext_j} \tag{7}
\]

Where:

- \( P_j \): Average spot price for trading day \( j \)
- \( G_{ij} \): Energy generated by reservoir \( i \) in day \( j \)
- \( V_{Vij} \): Discharge of reservoir \( i \) in day \( j \)
- \( \text{Pen}_{Vij} \): Penalty for discharges, applied to reservoir \( i \) in day \( j \)
- \( V_{Inu j} \): Volume of water above the maximum in the FCZ in day \( j \)
- \( \text{Pen}_{Inu j} \): Penalty for flooding in the control area, applied in day \( j \)
- \( V_{G_i \text{min}} \): Minimum discharge volume of reservoir \( i \)
- \( V_{G_i \text{max}} \): Maximum discharge of reservoir \( i \)
- \( V_{E_i \text{min}} \): Minimum volume of reservoir \( i \)
- \( V_{Eij} \): Volume of reservoir \( i \)
- \( V_{E_i \text{max}} \): Maximum volume of reservoir \( i \)
- \( V_{FCZ_j} \): Volume in the FCZ in day \( j \)
- \( V_{ZC \text{max}} \): Maximum volume allowed in the FCZ
- \( V_{Eij-1} \): Volume of reservoir \( i \) in day \( j - 1 \).
- \( V_{Qij} \): Volume of basins of the reservoir \( i \).
- \( V_{EFi} \): Unbalanced volume composed of filtration plus evaporation from reservoir \( i \).
- \( FC_i \): Conversion factor of reservoir \( i \).
- \( V_{Qext_j} \): Volume of the external river in day \( j \).

2.2 Stochastic approach

Studies related to hydrological prediction contain a high level of uncertainty when trying to recreate future hydrological scenarios. This is why stochastic models take relevance during the analysis of problems related to the administration of water.
resources and in the management and operation of reservoirs. Stochastic models seek to include and reflect the uncertainty of the variables under study in the results of the models. In this case, a stochastic model is proposed, through which a large number of possible scenarios are generated, in order to establish probabilities of occurrence and be able to make decisions under desired confidence levels.

Figure 2 presents a schematic diagram of the proposed model. It is basically composed of a stochastic series generator, which produces different values of water flows which are processed through the deterministic optimization model presented in Section 2.1. The proposed model generates possible operation scenarios, to which a reliability study is carried out, applied to the FCZ.

![Stochastic series generator](image1)

**Figure 2. Structure of the stochastic model**

The flow series generator illustrated in Figure 3 uses as input information the hydrological forecasted data, which is fixed as the mean of a normal distribution, which standard deviation is given by the standard deviation of the historical data of the river under study. After completing the iterative process for each of the hydrological series generated, there is a dispatch number equal to the number of series generated. For each of the selected dispatches, the impact generated in the FCZ is evaluated and the level of reliability is calculated based on the magnitude of the flood.

![Structure of the water flow series generator](image2)

**Figure 3. Structure of the water flow series generator**
III. TESTS AND RESULTS

Table 1 presents the main technical parameters for the deterministic model. These parameters correspond to real values of two reservoirs that are part of the Colombian electrical system and can be consulted in [14]. The maximum volume in FCZ was set to 20 Mm3, which is equivalent to 85% of the average water flow that would circulate through the small village downstream the reservoir, according to the historical hydrological series.

The water flow series generator was used to generate 30 series for each of the input flows of the system represented in Figure 1. With this result it is possible to recreate a series of possible operating scenarios according to the historical flows reported by the market agents in Colombia. Figures 4, 5 and 6 show respectively the results obtained with the flow series generator for Reservoir 1, Reservoir 2 and the external river, based on the historical series years 1978 to 2015. The graphs highlight, in red, the forecasted (mean) for each of the groups of series generated.

| Parameter                               | Reservoir 1 | Reservoir 2 |
|-----------------------------------------|-------------|-------------|
| Minimum Volume (Mm3)                    | 17.71       | 23.30       |
| Maximum Volume (Mm3)                    | 782.05      | 610.89      |
| Conversion Factor (MW/Mm3/s)            | 2,711.25    | 1,945.89    |
| Maximum Discharge Volume (Mm3-day)      | 10.62       | 12.33       |
| Maximum Discharge Capacity (MWh-day)    | 28,798.90   | 24,000.61   |
| Maximum Spillage Capacity (Mm3-day)     | 362.88      | 864         |
| Minimum Discharge Volume (Mm3-day)      | 0.53        | 0.12        |
| Maximum Generation Capacity (MWh-day)   | 1,439.67    | 239.34      |
| Net Effective Generation Capacity (MW)  | 1,200       | 1,000       |
| Maximum Volume in the FCZ (Mm3)         | 20          | 20          |

Figure 4. Flow series generated for Reservoir 1

Figure 5. Flow series generated for Reservoir 2
Once the water flow series were generated, 5 of the most critical ones were selected for each of the model inputs. Each of the 5 series were used in the proposed, obtaining a reliability of 100% in the FCZ, as observed in Figure 7, given that the volume in the FCZ remained below the maximum allowed limit (20 Mm$^3$) for each of the selected series.

A 100% reliability is achieved due to the control carried out over the generation discharges from Reservoir 2, as observed in Figure 8, while the generation through Reservoir 1, remained stable. This occurs because Reservoir 1 has a greater discharge capacity through generation, contributing to a greater extent to the fulfillment of the objective function.
IV. CONCLUSIONS

A food control model that incorporates stochastic elements was proposed in this paper. The stochastic model allows finding operating scenarios, under different hydrological conditions, based on historical information of water flows of the reservoirs under study. The data provided by the stochastic series generator are processed through a deterministic optimization model that takes into account the maximization of profits from energy sales as well as the constraints inherent to the operation of hydroelectric power plants, avoiding flooding in a given control area.

The proposed model considers the constraints inherent to generation plants that operate within an energy market, whose objective function is the maximization of profits under the guidelines of the country's regulatory framework. In the proposed model, the guidelines are given by the technical restrictions of the reservoirs and by the penalties for flood control in a given control zone.

The model and the proposed methodology can be incorporated by any generator agent or reservoir operator who is interested in validating the operating policies of hydroelectric power plants, to guarantee the required flows downstream of the reservoirs avoiding damage to the population.

ACKNOWLEDGEMENTS

The authors gratefully acknowledge the support from the Colombia Scientific Program within the framework of the call Ecosistema Científico (Contract No. FP44842-218-2018). The authors also want to acknowledge Universidad de Antioquia for its support through the project Estrategia de Sostenibilidad.

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