

Article

Optimal Design of Perforated Diversion Wall Based on Comprehensive Evaluation Indicator and Response Surface Method: A Case Study

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Abstract: To investigate the impact of parameters of diversion wall holes on the flow state in the forebay of a combined sluice-pumping station project and optimize the relevant parameters, a total of 50 numerical simulations based on the CFD technique were performed, adopting the design of orthogonal experiments with 25 schemes under self-draining conditions and pumping conditions, respectively. For synthesizing flow state evaluation indicators under self-draining and pumping conditions, the variation coefficient method was used, and the results were analyzed through the response surface method. Thus, the relationship between the parameters of the diversion wall holes and the comprehensive evaluation indicator was established. The steepest ascent method was used to obtain the optimal parameters, and the results showed that the optimized holes can balance the flow state under self-draining and pumping conditions in the combined sluice-pumping station project. Compared to the case with the diversion wall unperforated, the uniformity of axial velocity distribution in the 6# inlet channel and 7# sluice chamber increased by 6.6% and 5.2%, respectively, and the maximum transverse velocity decreased from 0.32 m/s to 0.21 m/s, with a fall of 34.4%. This study provides reference and technical support for the hydraulic characteristic analysis, optimization design and rectifying measures selection of the combined sluice-pumping station project.

Keywords: perforated diversion wall; orthogonal test; response surface method; comprehensive evaluation indicator; optimization design; combined sluice-pumping station



Citation: Xu, B.; Xu, S.; Xia, H.; Liu, J.; Shen, Y.; Xu, L.; Xi, W.; Lu, W. Optimal Design of Perforated Diversion Wall Based on Comprehensive Evaluation Indicator and Response Surface Method: A Case Study. *Processes* **2023**, *11*, 1539. <https://doi.org/10.3390/pr11051539>

Academic Editors: Lijian Shi, Kan Kan, Fan Yang, Fangping Tang and Wenjie Wang

Received: 30 March 2023

Revised: 13 May 2023

Accepted: 15 May 2023

Published: 17 May 2023



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1. Introduction

The combined sluice-pumping station has advantages such as a small footprint and low construction and management costs. However, a significant disadvantage of the system is that it significantly differs in flow regimes under different operating conditions, which are consistently unsatisfactory. When the sluice or pumping station operates independently, the flow direction of the water is not aligned with the riverbed, which leads to an imbalance in the momentum of the two sides of the riverbed. As a result, backflow, whirlpools, oblique flow and transverse flow occur, which reduces the flow capacity of the sluice and the effectiveness of the pumping station [1]. Moreover, from the perspective of security and reliability while the pumping station is in operation, adverse flow patterns can significantly impact the flow in the inlet pool of the pumping station and alter the direction of water into the pump, which leads to the phenomena of cavitation and vibration [2–6]. With respect to the operation of the sluice in isolation, the asymmetry of the backflow can reduce the flow capacity of the sluice, posing a threat to the safety of the building [7–10]. If these problems cannot be solved effectively, the social and economic benefits of the combined sluice-pumping station project will be greatly reduced. Therefore, hydraulic characteristics analysis and optimal design research of inlet structures in combined sluice-pumping stations have important theoretical significance and engineering application value.

At present, some scholars have carried out a series of studies on hydraulic characteristics and optimal design methods of inlet structures in combined sluice-pumping stations, and they have obtained many beneficial results. Luo et al. [11–13] verified the reliability of numerical simulation results through model experiments and utilized numerical simulation techniques to investigate the adverse flow states existing in different types of pump station forebays and sumps as well as the adjustment and optimization effects of rectification measures on the flow states. By analyzing axial velocity distribution uniformity, velocity-weighted average angle and axial average flow velocity of the sump's longitudinal profile, the optimal rectification measures were determined. These studies fully demonstrate the importance of numerical simulation in fluid mechanics research and provide a valuable reference for improving the flow state of pump stations. Yang et al. [14] used physical model tests and computational simulations to study the flow pattern in the forebay of a pumping station. They found that the combination plan of a rectifier sill and a diversion wall opening was the most effective way to improve the flow pattern, achieving a reduction rate of the vortex area of over 85% and improving the uniformity of flow rate near and far away from the pumping station. Their research provides an optimal plan to adjust the flow pattern in the forebay of a pumping station, which can improve the efficiency and stability of the pumping station, especially in addressing the technical problems of a poor flow pattern in the forebay internal flow field of a lateral intake pumping station. Wang et al. [15] numerically simulated the flow regime of the sluice-pumping station project in the tidal river section based on the N-S equation and the standard $k-\epsilon$ model. They proposed rectification measures such as extending the diversion wall and installing additional bottom sills and diversion piers, which effectively improved the flow pattern of the forebay. Fu et al. [16] conducted an in-depth discussion on the body shape and suitable length of the diversion wall based on a planar symmetric hydraulics model test of the combined sluice-pumping station, and they concluded that the top of the diversion wall should be higher than the water surface and proposed a range of suitable lengths for the diversion wall. Xu et al. [17,18] conducted a physical model experiment to investigate flow behavior in an asymmetric sluice-pumping system and identified the optimal rectification scheme. Considering the limitations of physical model experiments, Xu et al. [19] further studied the influence of the structural parameters of the diversion wall on the flow field using numerical simulation. They then optimized the structural parameters of the diversion wall using a single-factor progressive analysis method. Xu et al. [20] proposed a Y-shaped settling diversion wall that can adapt its configuration to match the operating conditions of combined sluice-pumping station projects and greatly improve the inflow state under both self-draining and pumping conditions. However, it was also found that the perforated diversion wall was more effective than the Y-shaped settling diversion wall in reducing the flow obliquity on the inlet side of the sluice under self-draining condition in the sluice-pumping station.

In summary, the installation of diversion walls is a common and effective measure to enhance the flow conditions in the forebay of the combined sluice-pumping station project. Changing the parameters of the diversion wall, including location, length, height, angle as well as hole width, spacing and depth can affect the flow conditions on the side of the pumping station as well as the inlet flow pattern and transverse velocity on the side of sluice [19,21]. The majority of current research outcomes regarding the diversion wall in the combined sluice-pumping station project are based on the assumption of some parameter schemes of the diversion wall by numerical simulations and model tests or single-factor optimization carried out one by one according to the length, angle, height, hole width, spacing and depth of the diversion wall, without considering the interaction between the above factors [22,23]. In terms of selecting evaluation indexes for optimization, current optimization studies mostly focus on the improvement of inflow hydrodynamics under pumping conditions as the evaluation indicator and the optimized parameters of the diversion wall are obtained. Then, it is considered a success if the above scheme can be verified to have a certain improvement on the inflow hydrodynamics of the sluice under

self-discharging conditions. The aforementioned optimization method is based on a single evaluation indicator and fails to comprehensively consider the various evaluation indexes under both pumping and self-discharging conditions.

The objective of this paper is to examine the approach for optimizing the design of the diversion wall in a combined sluice-pumping station project based on the comprehensive evaluation indicator and response surface method so that the optimization design method of the diversion wall can be enhanced. First, the evaluation indexes for the optimization of the hole parameters of the diversion wall were determined through model experiments and numerical simulations. Then, based on the orthogonal test design, the effects of hole width, spacing and depth of the diversion wall on individual evaluation indexes were calculated. A hole parameter scheme was selected through extreme difference analysis and main effect analysis. Second, the weight of each evaluation indicator was calculated using the coefficient of variation method, and a comprehensive evaluation indicator was established. Then, a response surface model was established with the individual evaluation indicator with the comprehensive evaluation indicator as the objective function. Subsequently, the impact of the hole parameters on the objective function was analyzed based on the response surface method, and the hole width, center distance, depth and other parameters were optimized. Finally, compared with existing results, the optimization results were verified and analyzed. The study can provide reference and technical support for hydraulic characteristics analysis, optimization design and selection of flow control measures in combined sluice-pumping stations.

2. Research Factors and Evaluation Indicators

2.1. Study Subjects and Factors

As shown in Figure 1, the object of this study was the perforated diversion wall of a combined sluice-pumping station. The studied combined sluice-pumping station consisted of a pumping station and a sluice, with six pump units set in the pumping station and the sluice consisting of three chambers. In Figure 2, the three-dimensional layout of the diversion wall is displayed along with the schematic diagram of the perforated diversion wall of the combined sluice-pumping station. Factors in the optimization study of the perforated diversion wall include hole width M , hole center distance D and hole depth H .

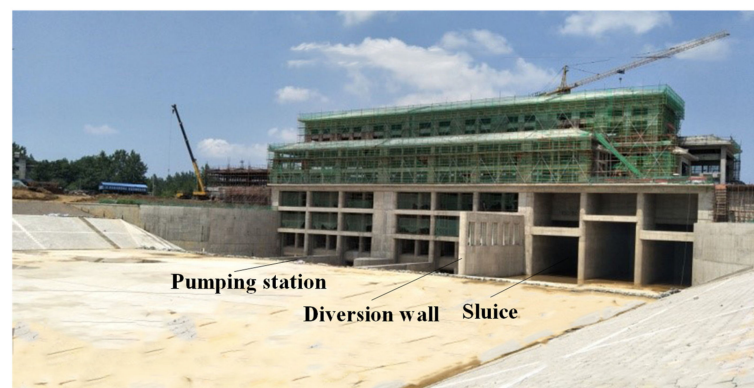


Figure 1. Combined sluice-pumping station with perforated diversion wall.

2.2. Evaluation Indicator Selection Method

For the combined sluice-pumping station project, the flow regime in the forebay can affect the efficiency of the pump unit and the safety of the pumping station as well as the operation of the sluice and the safety of navigable ships. The uniformity of axial velocity distribution and the maximum transverse velocity are essential indicators that properly reflect the quality of flow pattern [24]. However, it is necessary to further determine which location of the above parameters should be selected as the optimization evaluation index through model experiments and numerical simulations.

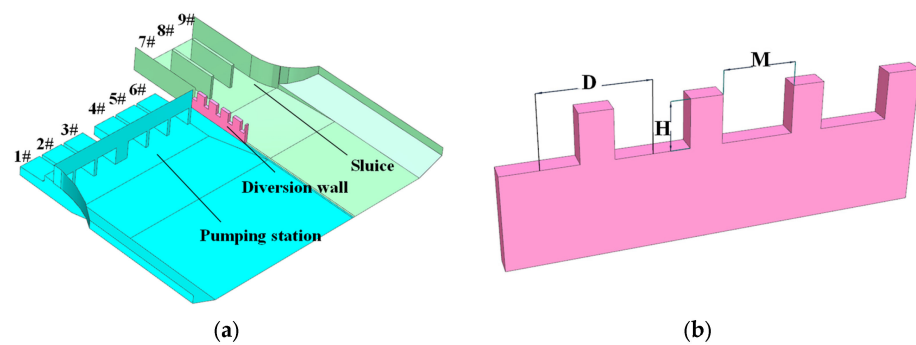


Figure 2. The three-dimensional layout of the diversion wall and the schematic diagram of the combined sluice-pumping station: (a) the schematic diagram of the combined sluice-pumping station; (b) the three-dimensional layout of the diversion wall.

2.2.1. Physical Model Experiments

Taking the aforementioned combined sluice-pumping station as an example, the layout of the model test and the overall site diagram of the model are shown in Figures 3 and 4 [24]. The scope of the model experiment study was from the end of the upstream slope protection to the downstream apron section, including the downstream channel with a total length of about 500 m and, the width was about 192 m from the upstream wing wall of flood drainage and sewage maintenance sluice to the downstream slope protection of the pumping station exit control sluice. The pump inlet channels were numbered as 1#, 2#, 3#, 4#, 5# and 6#. The 1# inlet channel was positioned in close proximity to the left wing wall of the approach river, while the 6# inlet channel was located closer to the sluice. The forebay and river bottom plate were situated at an elevation of 13.4 m, whereas the inlet pool bottom plate was located at an elevation of 6.65 m. The sluice was designed with three sluice chambers, numbered 7#, 8# and 9#, among which sluice chamber 7# was close to the pumping station side and sluice chamber 9# was positioned closer to the right wing wall of the approach river. The elevation of the sluice floor was 11.4 m. The sluice and the pumping station were separated by a diversion wall with its length of 25 m, width of 1.2 m and height of 8.8 m. The primary purpose of the project was to control and manage floodwaters and drainage, which was accomplished through two operational modes: self-draining (facilitated by the use of sluices) and pumping (provided by the pumping station). During operation of the pumping station, the sluice gate remains closed with upstream and downstream water levels designed to be 21 m and 24.3 m, respectively. However, upon opening the sluice gate, the pumping station ceased operation, causing the upstream water level to rise to 22.2 m, while the downstream water level decreased to 22.05 m. The model geometric scale λ_l was 30.

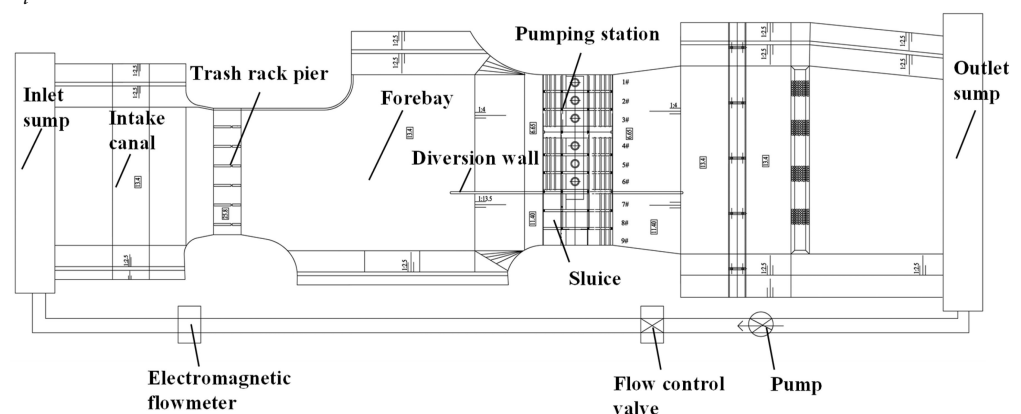


Figure 3. Physical model layout diagram.



Figure 4. Physical model scene diagram.

- (1) Investigation of the flow regime in the forebay during pump operation in the original design scheme.

The scheme was carried out under the condition of pumping, in which all pump units ran and the sluice was closed. The corresponding flow Q was $180 \text{ m}^3/\text{s}$ (model flow Q_m was $131.45 \text{ m}^3/\text{h}$) and the water level of the upper stream h_s was 21 m (model water depth was 25.3 cm) and the lower stream h_x was 24.3 m (model water depth was 36.3 cm).

Figure 5 displays the flow patterns of the surface layer and the bottom layer under pumping conditions. It is evident from the figure that the flow patterns of the bottom layer and the surface layer in the forebay are highly comparable. The water flowed into the forebay of the pumping station from the direction of the sluice. Under the condition of pumping, the counterclockwise vortex flow appeared in the forebay, which is mainly located on the left side of the diversion wall and the left bank. Since the vortex zone of the left bank is far from the inlet channel, it is no longer considered in this paper. The vortex zone on the left of the diversion wall began to appear at cross-section 19-19 and continued to the front of inlet channel 6#. Thus, a cavitation phenomenon may be produced in the pump, causing pump vibration and even threatening the stable operation of the pump.

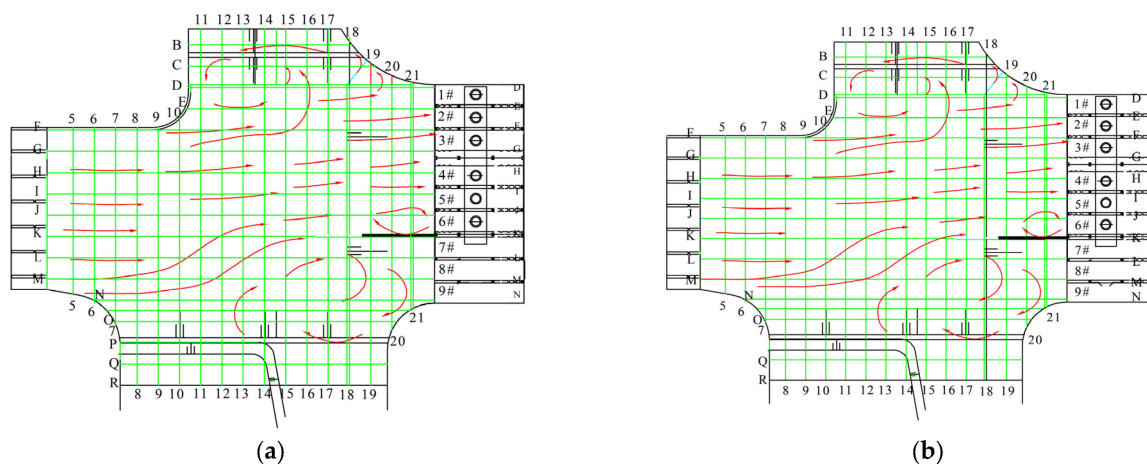


Figure 5. Flow pattern of surface and bottom layers under the pumping condition in the original design scheme: (a) surface flow pattern; (b) bottom flow pattern.

- (2) Investigation of the flow regime in the forebay during sluice operation in the original design scheme.

The scheme was carried out under the condition of self-draining, in which three sluices were opened and the pump units were all closed. The corresponding flow Q was $412 \text{ m}^3/\text{s}$ (model flow Q_m was $300.88 \text{ m}^3/\text{h}$), the water level of the upstream h_s was 22.2 m (model

water depth was 29.3 cm) and the downstream h_x was 22.05 m (model water depth was 28.8 cm).

Figure 6 displays flow pattern diagrams for the surface layer and bottom layer under self-draining conditions. The bottom layer flow pattern in the forebay was found to be consistent with that of the surface layer. Specifically, a pronounced diagonal flow was observed in front of the diversion wall, while a roundabout region appeared near the right side of the wall in front of the sluice along the flow channel of the pumping station.

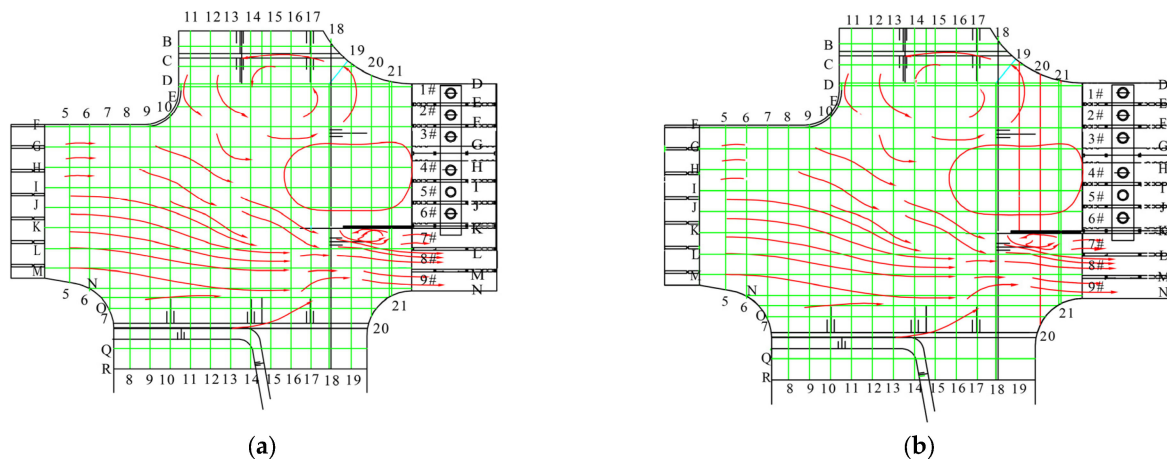


Figure 6. Flow pattern of surface and bottom layers under the self-draining condition in the original design scheme: (a) surface flow pattern; (b) bottom flow pattern.

2.2.2. Numerical Simulation Analysis

In order to compare with the results of physical model experiments and facilitate further research, a computational fluid dynamics (CFD) model of the combined sluice-pumping station was developed to simulate inflow patterns. Using the RNG $k-\varepsilon$ vorticity viscosity model and Reynolds Averaged Navier–Stokes Equations (RANS), a model that has been proven to be effective at handling complex curved streamlines was constructed [25]. The Fluent software’s built-in finite volume method solver was utilized, and the SIMPLEC algorithm was applied to iteratively solve the discrete equations in the model domain until convergence was achieved.

(1) Modeling range

In Figure 7, a 3D model of the abovementioned combined sluice-pumping station is displayed, and this model is a typical asymmetric combined sluice-pumping station layout. In order to ensure the precision of the numerical simulation study and reduce the influence of missing upstream and downstream structures on the flow pattern simulation, the inlet channel was extended, and the modeling scope was consistent for each calculation scheme. The key parameters studied in this paper were the hole size of the diversion wall, including hole width M , hole spacing D and hole depth H , which are shown in Figure 2b.

(2) Meshing

The computational model domain was relatively complex, and the application of tetrahedral unstructured mesh could improve the efficiency of cell division. The meshing quality is controlled by the aspect ratio, skewness and orthogonal quality, and the cell independence analysis showed that when the number of cells was greater than 1.6×10^6 , there was no significant difference in the calculation results, so the number of control cells was greater than 1.6×10^6 .

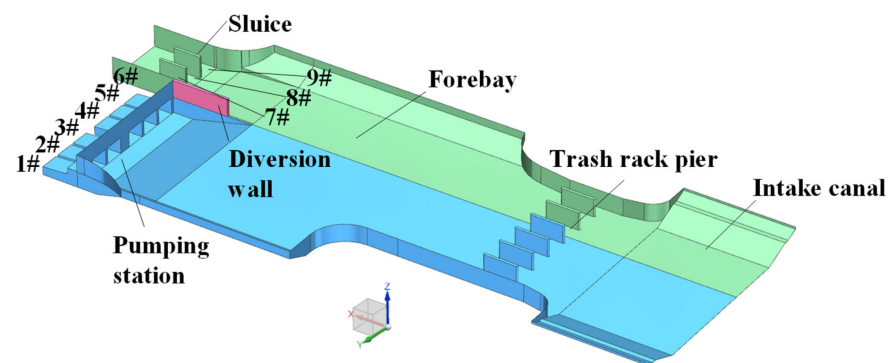


Figure 7. Three-dimensional diagram of the combined sluice-pumping station: The 1#–6# are the pump inlet channels 1# to 6#, and the 7#–9# are the sluice chambers 7# to 9#.

(3) Boundary condition

Four boundary conditions were adopted in each calculation model. The first type of boundary condition was velocity inlet [26]. Both under the condition of self-draining and pumping, the inlet boundary was defined at the inlet of the intake canal. Under the condition of pumping, the inlet velocity was 0.27 m/s, and under the condition of self-draining, the inlet velocity was 0.52 m/s. The second type of boundary condition was free outflow that is under the pumping condition. The six inlet channels 1#–6# were appropriately extended as the outlet boundary to meet the condition that turbulence was fully developed. The six pump units were of the same model, so the flow weight of the six outlets were all set as 1. Similarly, under the condition of self-draining, the length of the sluice chamber should be extended appropriately, and the outlet boundary was set at the end of the sluice. The third type of boundary condition was set on the water surface. Because the water surface changes little with time, the shear stress effect of air on the water surface was ignored and the “rigid cover assumption” was selected for calculation. In other words, the water surface was set as symmetry [3,27,28]. In addition to the aforementioned boundary conditions, the last condition was the non-slip standard wall, which was adopted in all other walls.

(4) Comparison of Simulation Results

Figure 8 presents the distribution of surface layer velocities in the 20–20 cross-section as shown in Figure 6. To facilitate comparison, the x-direction velocity (v_u) at each point on the surface layer of the 20–20 cross-section was normalized by dividing it by the average inlet velocity (v_{in}) of the intake channel, which achieves a dimensionless velocity and is used as the y-axis. The x-axis represents the distance (y) in meters from the left wing wall of the forebay to the velocity measurement point relative to the width (y_d) of the 20–20 cross-section. The left wing wall is located at $y/y_d = 0$, and the right lateral wall is at an x-coordinate of 1.

Figure 9 shows the numerical simulation results of the diversion wall without a hole in the original scheme. The aforementioned results are consistent with the findings reported in the literature [20], which were based on numerical simulations. Under pumping conditions, the adverse flow pattern in the forebay primarily affected inlet channel 6#, leading to a deteriorating inflow condition that posed a threat to the stable operation of the pumping unit. In contrast, under self-draining conditions, the flow pattern in front of sluice chamber 7# exhibited a high level of disorder, which resulted in a reduction of the sluice’s flow capacity. Therefore, the uniformity of the axial velocity distribution of inlet channel 6# was selected as the evaluation indicator for pumping conditions, while the uniformity of the axial velocity distribution of sluice chamber 7# was chosen as the evaluation indicator for self-draining conditions. Additionally, to meet the navigation requirement under self-draining conditions, the evaluation indicator included the transverse velocity ahead of the operating sluice [29].

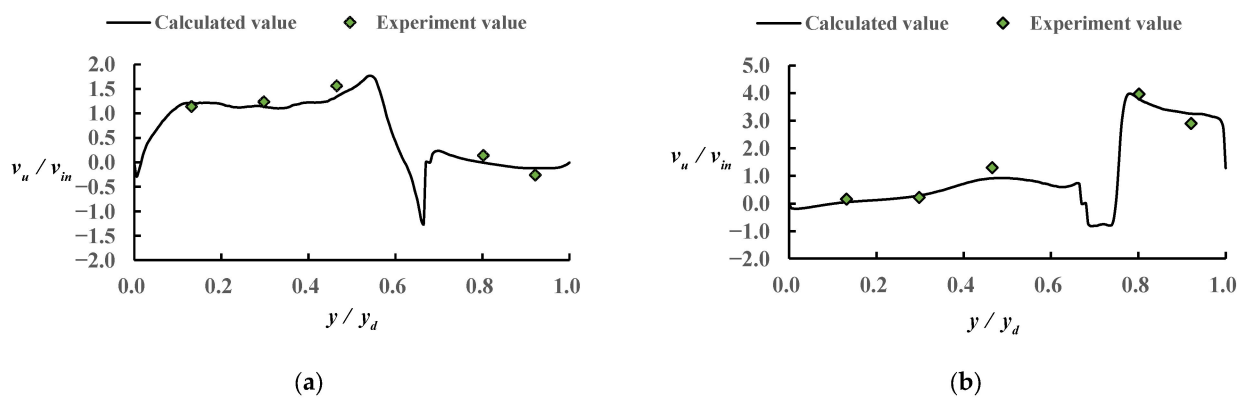


Figure 8. Comparison of experimental and numerical simulation results: (a) under pumping condition; (b) under self-draining condition.

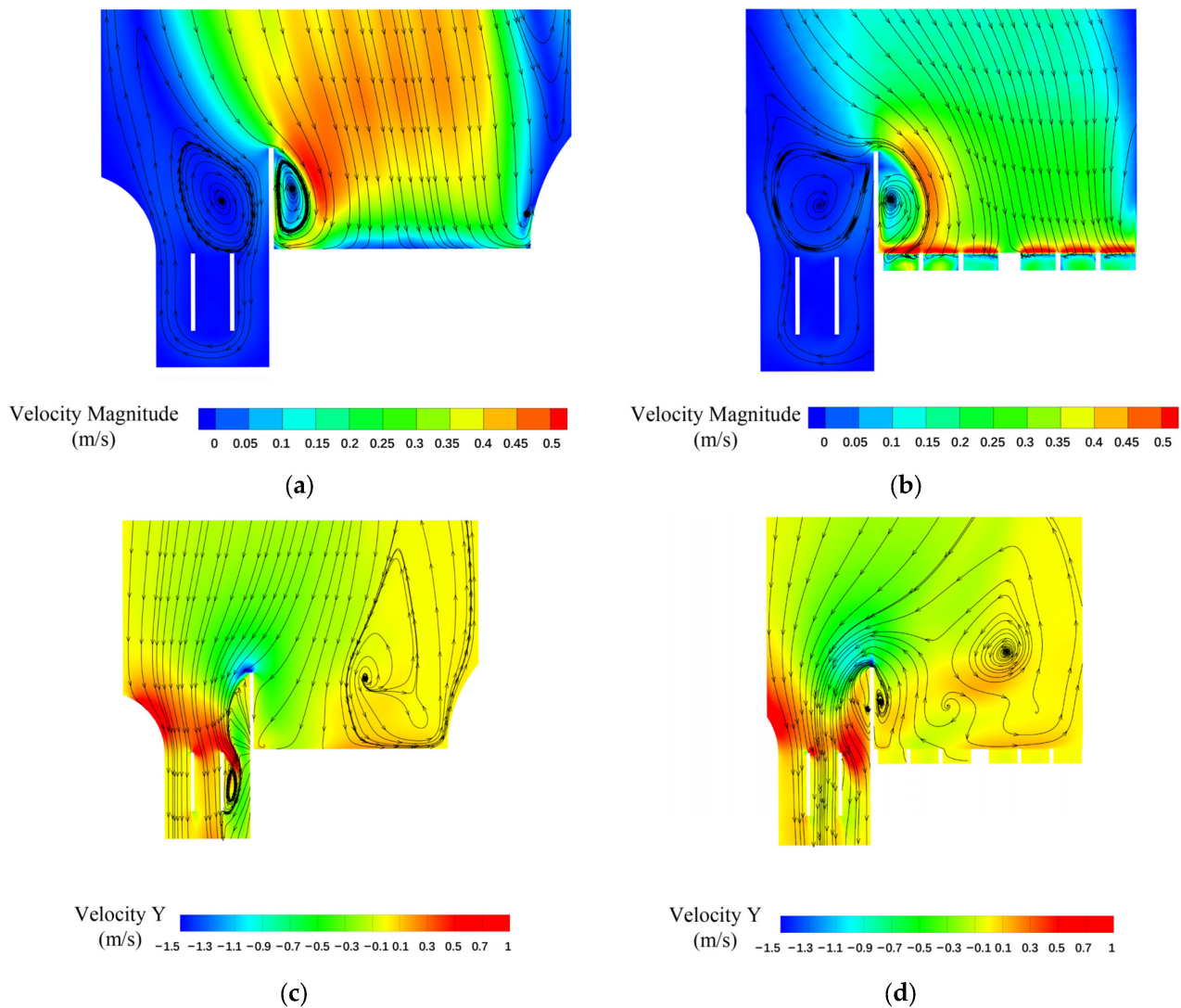


Figure 9. The numerical simulation results of the diversion wall without a hole in the original scheme: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition; (d) bottom flow pattern under self-draining condition.

3. Optimization Method of Hole Parameters of Diversion Wall Based on Numerical Simulation

3.1. Obtaining Results from Numerical Simulation

In this study, CFD-Post was applied for post-processing and data reading, and the monitoring section of post-processing data is shown in Figure 10. According to the analysis in Section 2.2, under the condition of pumping, the flow pattern at the inlet side of inlet channel 6# was poor, which had a greater impact on the normal operation of the pump unit. Therefore, the calculation and monitoring section was arranged at 0.5 m in front of inlet channel 6#. Under the condition of self-draining, the flow pattern of sluice chamber 7# was poor, so monitoring sections b, c and d were arranged in sluice chamber 7#. In addition, under the condition of self-draining, the sluice tends to be used to realize navigation functions, in which case monitoring section e is set in the navigation channel area [29].

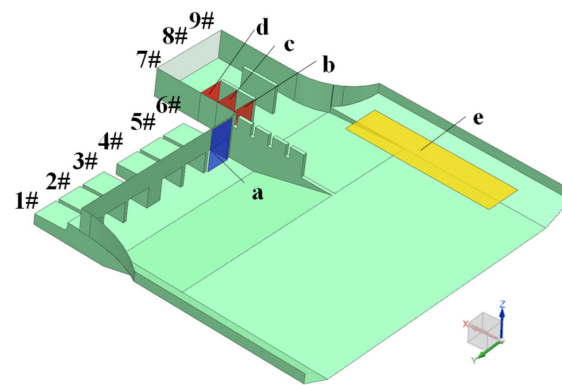


Figure 10. Layout of monitoring sections: The 1#–6# are the pump inlet channels 1# to 6#, and the 7#–9# are the sluice chambers 7# to 9#. In addition, the sections labeled a to e are the monitoring sections.

In this study, the uniformity of axial velocity distribution and the maximum transverse velocity were adopted to evaluate the flow pattern of the forebay. The uniformity of axial velocity distribution and the maximum transverse velocity can be calculated by Equations (1) and (2).

$$\lambda_i = \left\{ 1 - \frac{1}{\overline{V}_a} \sqrt{\sum_{i=1}^n (V_{ai} - \overline{V}_a)^2 / n} \right\} \times 100\% \quad (1)$$

$$V_{yi} = \max\{v_{yi1}, v_{yi2} \cdots v_{yij} \cdots v_{yin}\} \quad (2)$$

In Equations (1) and (2), λ_i is the uniformity of axial velocity distribution of monitoring section i ; \overline{V}_a is the average axial velocity on monitoring plane i ; V_{ai} is the axial velocity of the calculation unit on the monitoring plane i ; n is the number of calculation units of monitoring section i ; V_{yi} is the maximum transverse velocity on monitoring section i and v_{yij} is the value of transverse velocity on the element plane j of monitoring plane i .

Equations (3)–(5) were used to calculate the evaluation indicator of the diversion wall hole parameters under both self-draining and pumping conditions.

Pumping condition:

$$y_1 = \lambda_a \quad (3)$$

Self-draining condition:

$$y_2 = (\lambda_b + \lambda_c + \lambda_d) / 3 \quad (4)$$

$$y_3 = V_{ye} \quad (5)$$

where y_1 is the indicator evaluating the flow pattern of the combined sluice-pumping station under the pumping condition, and y_2 and y_3 are the indicators evaluating the flow pattern under the self-draining condition.

3.2. Design of Hole Parameters of Diversion Wall Based on Orthogonal Test

In this study, the parameters of the perforated diversion wall of the orthogonal test were hole width M , center distance of adjacent hole D and hole depth H . The above three factors were selected in the orthogonal design of hole parameters, and five levels were selected for each factor. The parameters corresponding to each level of the factor are listed in Table 1.

Table 1. Orthogonal design table of hole parameters of diversion wall.

Level	Factor		
	M/m	D/m	H/m
1	1.0	5.6	2.0
2	2.1	6.25	3.7
3	3.2	8.33	5.4
4	4.3	12.5	7.1
5	5.4	25	8.8

According to the selected factors and level number, orthogonal table $L_{25}(5^4)$ was selected for orthogonal design in both conditions.

After conducting orthogonal testing, we performed a range and main effect analysis to determine the influence of different factors on improving the flow pattern in both the sluice and inlet channel. As a result, we could obtain optimized combinations of geometric parameters for the holes under two different working conditions.

3.3. Establishment of Comprehensive Evaluation Indicator Based on Coefficient of Variation Method

Three evaluation indicators were used: y_1 reflects the flow pattern under pumping conditions, and y_2 and y_3 reflect the flow pattern under self-draining conditions. In this paper, the aforementioned evaluation indexes were combined, given different weights and condensed into a comprehensive indicator, thus simplifying the problem [30]. To determine the weight coefficient, the coefficient of variation method [31,32] was adopted in this paper, and the specific steps of each index are listed as follows:

- (1) Assuming the evaluation system contains K indicators, that is y_k ($k = 1, 2, 3 \dots K$) and each indicator contains n experimental data items y_{kj} ($k = 1, 2, 3 \dots K, j = 1, 2, 3 \dots n$).
- (2) The value of the evaluation indicator is normalized to make the data of different units comparable. If the larger original series is better recognized, Equation (6) can be used for calculation. If the smaller original series is better recognized, Equation (7) can be used for calculation.

$$Y_{kj} = \frac{y_{kj} - \min(y_{kj}, j = 1, 2, \dots, n)}{\max(y_{kj}, j = 1, 2, \dots, n) - \min(y_{kj}, j = 1, 2, \dots, n)} \quad (6)$$

$$Y_{kj} = \frac{\max(y_{kj}, j = 1, 2, \dots, n) - y_{kj}}{\max(y_{kj}, j = 1, 2, \dots, n) - \min(y_{kj}, j = 1, 2, \dots, n)} \quad (7)$$

where $k = 1, 2, 3 \dots, K$ and $j = 1, 2, 3 \dots, n$. K is the number of evaluation indicators, and n is the number of experimental data items. Y_{kj} ($j = 1, 2, 3 \dots, n$) is the experimental data items after normalization.

The normalized evaluation indicator is Y_k , ($k = 1, 2, 3 \dots, K$).

(3) Calculating standard deviation

$$\bar{Y}_k = \frac{1}{n} \sum_{j=1}^n Y_{kj}, k = 1, 2, 3 \dots, K \quad (8)$$

$$STD_k = \sqrt{\frac{1}{n} \sum_{j=1}^n (Y_{kj} - \bar{Y}_k)^2}, k = 1, 2, 3 \dots, K \quad (9)$$

(4) Calculating the coefficient of variation of each indicator

$$CV_k = STD_k / \bar{Y}_k, k = 1, 2, 3 \dots, K \quad (10)$$

(5) The weight coefficient of each indicator was obtained by the normalization of V_k

$$W_k = CV_k / \sum_k CV_k \quad (11)$$

(6) The final:

$$Y = W_1 Y_1 + W_2 Y_2 + W_3 Y_3 \quad (12)$$

In Equations (8)–(12), $k = 1, 2, 3 \dots, K$ and $j = 1, 2, 3 \dots, n$. K is the number of evaluation indicators, and n is the number of experimental data items. Y_{kj} ($j = 1, 2, 3 \dots, n$) is the evaluation index after normalization, and \bar{Y}_k is the average Y_{kj} ($j = 1, 2, 3 \dots, n$) of n experimental data items. STD_k , CV_k and W_k are the standard deviation, coefficient of variation and weight coefficient of indicator Y_k , respectively. Y is the comprehensive evaluation indicator.

3.4. Establishment of Response Surface Model of Diversion Wall Hole Parameters

According to the orthogonal test scheme in Table 1, a numerical simulation calculation was carried out to obtain the hydraulic characteristics of the forebay under each scheme. A response surface model was established between Y_1 , Y_2 , Y_3 and M , D , H , respectively. Taking the comprehensive evaluation indicator Y as the objective function, the response surface model was established among the hole width M , the open hole center distance D and the open hole depth H . Equation (13) is the general form of the second-order response surface model.

$$y = \beta_0 + \sum_{i=1}^k \beta_i x_i + \sum_{i < j} \beta_{ij} x_i x_j + \sum_{i=1}^k \beta_{ii} x_i^2 + \varepsilon \quad (13)$$

In Equation (13), β_i represents the undetermined coefficients of the response surface, k is the number of independent variables, ε is residual, x_i are the input parameters and y is the response value.

3.5. Analysis of Factors Influencing Objective Function

According to the response surface model between the diversion wall hole parameters and the four objective functions, the three-dimensional surface cloud map and response contour cloud map could be drawn between the hole width M , the hole center distance D and the hole depth H and Y_1 , Y_2 , Y_3 and the comprehensive evaluation indicator Y , which are the four evaluation indicators. According to the three-dimensional curved surface nephogram and response contour nephogram, the response of the diversion wall hole parameters to the four objective functions and the coupling effects on the objective functions can be analyzed.

3.6. Optimization Method of Hole Parameters

The mathematical model of multi-objective optimization of diversion wall hole parameters is:

$$\begin{cases} \max \lambda(M, D, H) \\ \min V_y(M, D, H) \end{cases} \begin{cases} M_{\min} \leq M \leq M_{\max} \\ D_{\min} \leq D \leq D_{\max} \\ H_{\min} \leq H \leq H_{\max} \end{cases} \quad (14)$$

In Equation (14), λ is the uniformity of axial velocity distribution, V_y is the maximum transverse velocity, M is the hole width, D is the hole center distance and H is the hole depth.

In this paper, M , D and H were taken as the independent variables of optimal design and Y_1 , Y_2 , Y_3 and Y were taken as the targets. The maximum value of four objective functions in the calculation area was solved by applying the fastest rising method. The gradient of the objective function Y_1 , Y_2 , Y_3 and Y at a certain point indicates that the function value rises fastest here, and this is used to search the maximum value of the function in a certain area [31]. Through calculation, the hole parameters corresponding to the maximum value of each objective function were obtained; that is, the optimal scheme can be required by each objective function. Then, the optimized schemes obtained were numerically simulated by Fluent, and the indexes y_1 , y_2 and y_3 were analyzed so that parameters M , D and H could be finally optimized.

According to the above analysis, the steps to optimize the hole parameters of the diversion wall are as follows:

- (1) The model test and numerical simulation were used to calculate and analyze the hydrodynamic characteristics of the forebay under the original design scheme of the combined sluice-pumping station, and the evaluation indicators of the optimization of the hole parameters of the diversion wall under the conditions of pumping and self-draining were obtained. The rationality and reliability of the numerical simulation method and the calculation model were verified.
- (2) Three factors, including hole width M , hole center distance D and hole depth H , were selected for the diversion wall, and five levels were selected for each factor to carry out the design of the orthogonal test scheme.
- (3) The software of UG and MESH were used to establish 50 different calculation models for the orthogonal experimental design scheme, and the Fluent software was used to calculate the water force characteristics of the forebay.
- (4) Through the range analysis of the numerical simulation results of the orthogonal test scheme, an optimized scheme of hole parameters of the diversion wall could be obtained.
- (5) According to the numerical simulation results, the weight coefficients of three evaluation indicators, namely Y_1 , Y_2 and Y_3 , were calculated, and the comprehensive evaluation indicator Y was established.
- (6) Y_1 , Y_2 , Y_3 and Y were taken as the objective functions, and the response surface models were established with M , D and H .
- (7) Three-dimensional response surface plot between the hole parameters and the objective function were drawn so that the principle of the influence of the hole parameters on the four objective functions could be analyzed and so the coupling relationship of hole parameters could be conducted.
- (8) The maximum values of the four objective functions Y_1 , Y_2 , Y_3 and Y in the calculation area were solved by the fastest rising method, and the corresponding orifice parameter schemes were obtained when the maximum values of each objective function were obtained.
- (9) For the four schemes obtained in Step (8) and the scheme optimized by the orthogonal test, numerical simulation was carried out. The uniformity of axial velocity distribution of inlet channel 6#, the flow pattern of sluice 7# and the transverse velocity in front of sluice 9# under six schemes were compared and analyzed so that the scheme of hole parameters could be optimized.

4. Results and Analysis

Based on the changing water levels under different operating conditions, the planar arrangement of the combined sluice-pumping station was shown in Figure 3, the computation range was shown in Figure 7 and the orthogonal testing scheme was shown in Table 1, with 25 distinct calculation models for each of the pumping and self-draining conditions established using the UG software. Figure 11 presents the calculation model for the pumping condition with the hole parameters $M \times D \times H$ of $1.0 \text{ m} \times 6.25 \text{ m} \times 3.7 \text{ m}$. The Fluent software could be utilized to calculate the hydraulic characteristics of the forebay in the corresponding working conditions for the above 50 combined sluice-pumping station models.

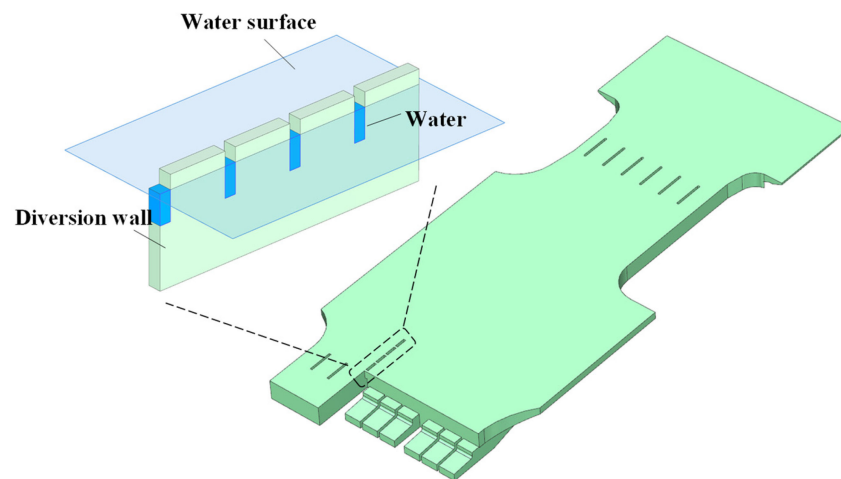


Figure 11. Calculation model for pumping conditions when the hole parameters of diversion wall $M \times D \times H$ are $1.0 \text{ m} \times 6.25 \text{ m} \times 3.7 \text{ m}$.

4.1. Analysis of Orthogonal Test Results

Based on the orthogonal experimental design and numerical simulations, the numerical simulation results are presented in Table 2. Using the mean and extreme deviation, along with main effect plots [20], we evaluated the sensitivity of the indexes to the different test factors.

Table 2. Orthogonal table and test results.

Schemes	Parameters Designed			Y1	Y2	Y3
	M (m)	D (m)	H (m)			
P1	1.00	5.60	2.00	0.501	0.790	0.284
P2	1.00	6.25	3.70	0.504	0.778	0.325
P3	1.00	8.33	5.40	0.502	0.818	0.317
P4	1.00	12.50	7.10	0.511	0.779	0.352
P5	1.00	25.00	8.80	0.476	0.711	0.337
P6	2.10	5.60	3.70	0.485	0.772	0.251
P7	2.10	6.25	5.40	0.474	0.840	0.254
P8	2.10	8.33	7.10	0.484	0.818	0.237
P9	2.10	12.50	8.80	0.504	0.801	0.252
P10	2.10	25.00	2.00	0.503	0.650	0.369
P11	3.20	5.60	5.40	0.496	0.820	0.210
P12	3.20	6.25	7.10	0.488	0.778	0.225
P13	3.20	8.33	8.80	0.512	0.752	0.218
P14	3.20	12.50	2.00	0.502	0.769	0.262
P15	3.20	25.00	3.70	0.492	0.798	0.296
P16	4.30	5.60	7.10	0.478	0.803	0.192
P17	4.30	6.25	8.80	0.498	0.749	0.174
P18	4.30	8.33	2.00	0.484	0.759	0.260

Table 2. Cont.

Schemes	Parameters Designed			Y ₁	Y ₂	Y ₃
	M (m)	D (m)	H (m)			
P19	4.30	12.50	3.70	0.530	0.869	0.252
P20	4.30	25.00	5.40	0.507	0.835	0.320
P21	5.40	5.60	8.80	0.512	0.643	0.163
P22	5.40	6.25	2.00	0.408	0.809	0.238
P23	5.40	8.33	3.70	0.477	0.870	0.225
P24	5.40	12.50	5.40	0.511	0.899	0.235
P25	5.40	25.00	7.10	0.501	0.813	0.287

The results of the experiment were analyzed for polar differences, and the results are shown in Tables 3 and 4, where K_i indicates the sum of evaluation indicators at level i for each column of factors, k_i is the mean value of K_i and the extreme difference value $R = \max(k_i) - \min(k_i)$. The extreme difference analysis revealed that the degree of influence of each factor on Y_1 in this test (from large to small) were the hole center distance D, the hole depth H and the hole width M. The degree of influence of each factor on Y_2 (from large to small) were the hole depth H, the hole center distance D and the hole width M. The degree of influence of each factor on Y_3 (from large to small) were the hole center distance D, the hole width M and the hole depth H.

Table 3. Range analysis of test results (pumping condition).

Evaluation Index	Parameter	Factors		
		M (m)	D (m)	H (m)
Y ₁	K1	3.711	3.531	2.927
	K2	3.348	2.704	3.657
	K3	3.678	3.423	3.669
	K4	3.73	4.234	3.457
	K5	3.01	3.585	3.767
	k1	0.742	0.706	0.585
	k2	0.67	0.541	0.731
	k3	0.736	0.685	0.734
	k4	0.746	0.847	0.691
	k5	0.602	0.717	0.753
	R	0.144	0.306	0.168

Table 4. Range analysis of test results (self-draining condition).

Evaluation Index	Parameter	Factors		
		M (m)	D (m)	H (m)
Y ₂	K1	2.578	2.389	2.194
	K2	2.6	2.883	3.405
	K3	2.74	3.137	3.892
	K4	3.125	3.525	3.033
	K5	3.2	2.309	1.719
	k1	0.516	0.478	0.439
	k2	0.52	0.577	0.681
	k3	0.548	0.627	0.778
	k4	0.625	0.705	0.607
	k5	0.64	0.462	0.344
	R	0.124	0.243	0.435
Y ₃	K1	1.104	3.612	2.090
	K2	2.333	3.042	2.396
	K3	3.073	2.847	2.459
	K4	3.135	2.380	2.673
	K5	3.372	1.136	3.399
	k1	0.221	0.722	0.418
	k2	0.467	0.608	0.479
	k3	0.615	0.569	0.492
	k4	0.627	0.476	0.535
	k5	0.674	0.227	0.680
	R	0.453	0.495	0.262

The main effect analysis method can be used to study the influence of hole parameters (M, D and H) on the three evaluation indicators (Y_1 , Y_2 and Y_3) and obtain the corresponding hole parameters when the evaluation indicators are optimal. The relationship between

Y_1 , Y_2 and Y_3 and hole parameters is shown in Figure 12, where the horizontal coordinate is the five horizontal values of each factor and the vertical coordinate is the average value of each indicator after normalization under the corresponding factor level. The dotted line in the figure is the average value of each index.

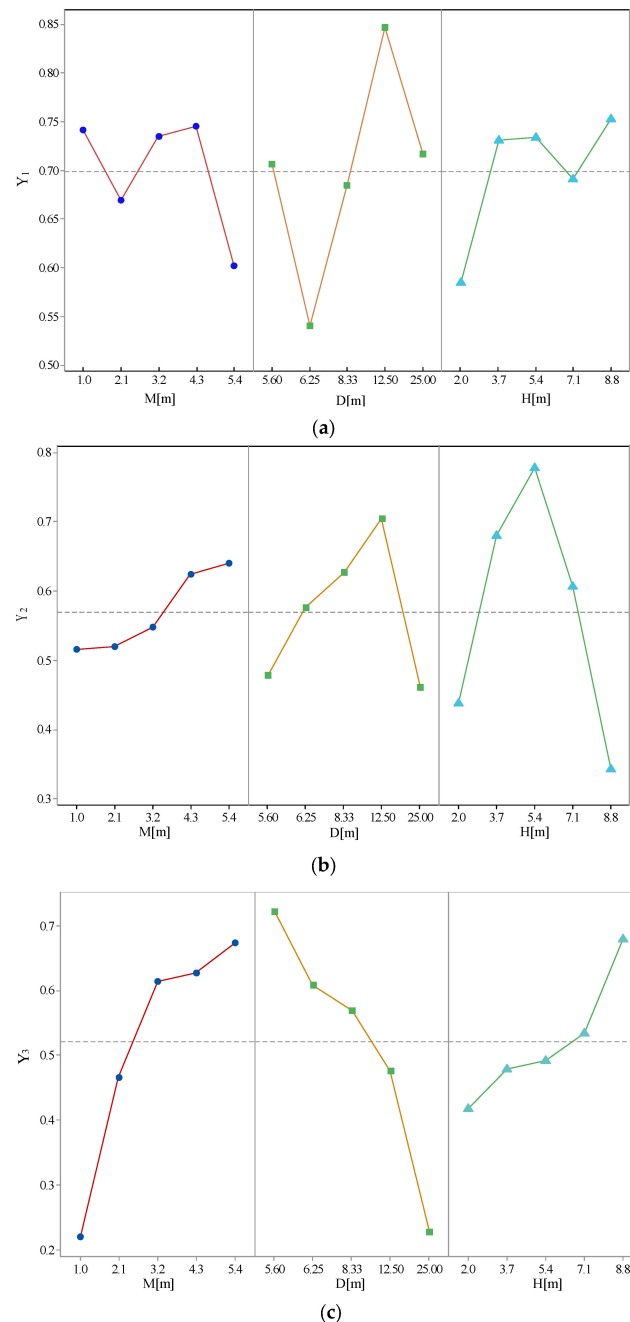


Figure 12. Relationship between hole parameters and various evaluation indicators: (a) relationship between hole parameters and various evaluation indicators Y_1 ; (b) relationship between hole parameters and various evaluation indicators Y_2 ; (c) relationship between hole parameters and various evaluation indicators Y_3 .

It can be seen from Figure 12 that the effect of hole parameters on Y_1 , Y_2 and Y_3 is different. For the evaluation indexes Y_1 and Y_3 , the most influencing factor is D, while factor M and H show relatively little impact. With an increase in D, the evaluation indicator Y_1 fluctuates, while Y_3 shows a decreasing trend. For evaluation indicator Y_2 , the most influencing factor is H. Specifically, with an increase in H, Y_2 first increases from 0.44 to

0.78, followed by a decline of 0.44. According to Figure 12, to make the evaluation index Y_1 maximum possible, M should be taken as 4.3 m, D should be taken as 12.5 m and H should be taken as 8.8 m. To make the evaluation indicator Y_2 maximum possible, M should be taken as 5.4 m, D should be taken as 12.5 m and H should be taken as 5.4 m. To make the evaluation index Y_3 maximum possible, M should be taken as 5.4 m, D should be taken as 5.6 m and H should be taken as 8.8 m.

To summarize, the effect of hole parameters on Y_1 , Y_2 and Y_3 is different, and the corresponding hole parameters are also diverse when Y_1 , Y_2 and Y_3 reach the maximum value. In fact, it is impossible for Y_1 , Y_2 and Y_3 to get the maximum value at the same time, so it is necessary to adopt the multi-objective optimization method for further optimization research.

4.2. Calculation of Weight Coefficients and Establishment of Comprehensive Evaluation Indicators

According to the variation coefficient method used to calculate the weight coefficients, the results are presented in Table 5. The optimization of the hole parameters on the diversion wall is expected to improve the flow pattern of inlet channel 6# under pumping conditions and to result in smoother flow in sluice chamber 7# and lower transverse velocity in the sluice area ahead of the navigable sluice chamber 9# under self-draining conditions. Notably, the larger the Y value, the better the operational state of the combined sluice-pumping station project.

Table 5. Calculation table of weighting coefficients.

Schemes	Parameters Designed			Y_1	Y_2	Y_3	Y
	M (m)	D (m)	H (m)				
P1	1.00	5.60	2.00	0.763	0.573	0.410	0.546
P2	1.00	6.25	3.70	0.782	0.528	0.210	0.449
P3	1.00	8.33	5.40	0.769	0.684	0.251	0.518
P4	1.00	12.50	7.10	0.844	0.531	0.080	0.408
P5	1.00	25.00	8.80	0.553	0.263	0.154	0.281
P6	2.10	5.60	3.70	0.628	0.502	0.571	0.560
P7	2.10	6.25	5.40	0.536	0.768	0.556	0.625
P8	2.10	8.33	7.10	0.622	0.685	0.640	0.652
P9	2.10	12.50	8.80	0.783	0.618	0.566	0.633
P10	2.10	25.00	2.00	0.779	0.027	0.000	0.184
P11	3.20	5.60	5.40	0.719	0.690	0.771	0.731
P12	3.20	6.25	7.10	0.655	0.527	0.697	0.628
P13	3.20	8.33	8.80	0.852	0.426	0.733	0.653
P14	3.20	12.50	2.00	0.768	0.493	0.520	0.566
P15	3.20	25.00	3.70	0.684	0.604	0.353	0.514
P16	4.30	5.60	7.10	0.574	0.624	0.861	0.714
P17	4.30	6.25	8.80	0.731	0.413	0.947	0.713
P18	4.30	8.33	2.00	0.618	0.455	0.528	0.522
P19	4.30	12.50	3.70	1.000	0.884	0.566	0.774
P20	4.30	25.00	5.40	0.807	0.750	0.234	0.542
P21	5.40	5.60	8.80	0.847	0.000	1.000	0.618
P22	5.40	6.25	2.00	0.000	0.647	0.633	0.496
P23	5.40	8.33	3.70	0.562	0.887	0.696	0.732
P24	5.40	12.50	5.40	0.839	1.000	0.648	0.813
P25	5.40	25.00	7.10	0.762	0.666	0.396	0.572
Standard Deviation				0.181	0.229	0.257	
Coefficient of Variation				0.259	0.401	0.494	
Weight Coefficient				0.224	0.348	0.428	

According to the calculation results in Table 5, the equation of comprehensive evaluation indicator is shown in Equation (15)

$$Y = 0.224Y_1 + 0.348Y_2 + 0.482Y_3 \quad (15)$$

4.3. Regression Modeling Based on Response Surface Methodology

Regression equations between each evaluation indicator and the perforation parameters were established using the least square method, based on the results of the orthogonal experiment.

The regression equation of evaluation indicator Y is shown as follows:

$$Y = 0.4419 + 0.5788A + 0.3601B + 0.2639C - 0.1068AB + 0.4465AC + 0.4248BC - 0.5363A^2 - 0.702B^2 - 0.5294C^2 \quad (16)$$

The regression equation of Y_1 is shown as follows:

$$Y_1 = 0.763 - 0.2654A + 1.94B - 0.3205C - 0.4064AB + 1.573AC + 0.397BC - 0.463A^2 - 1.775B^2 - 0.4851C^2 \quad (17)$$

The regression equation of Y_2 is shown as follows:

$$Y_2 = 0.3607 + 0.3947A + 0.1996B + 1.177C + 0.4888AB - 0.4228AC + 0.4156BC - 0.1669A^2 - 0.7537B^2 - 1.171C^2 \quad (18)$$

The regression equation of Y_3 is shown as follows:

$$Y_3 = 0.3397 + 1.171A - 0.3374B - 0.1714C - 0.4335AB + 0.5624AC + 0.4469BC - 0.8746A^2 - 0.09812B^2 - 0.03159C^2 \quad (19)$$

In Equations (16)–(19), A , B and C were the normalized variables of the perforation parameters of the diversion wall, which were calculated by Equations (20)–(22).

$$A = \frac{M - 1}{4.4} \quad (20)$$

$$B = \frac{D - 5.6}{19.4} \quad (21)$$

$$C = \frac{H - 2}{6.8} \quad (22)$$

As shown in Figure 13, the predicted values and the calculated values from the numerical simulation are plotted against each other. The points are clustered around the 1:1 line, which suggests a high degree of model fit. The composite objective function Y had a response surface model with a coefficient of determination of 0.878. This implies that the model can explain 87.8% of the variation in the data. The model was also highly significant, as its p -value of 2.25×10^{-5} is much lower than 0.01. The coefficients of determination for the individual objective functions Y_1 , Y_2 and Y_3 were 0.835, 0.816 and 0.943 respectively. These values are all above 0.8, which indicates that the models have a good fit as well.

4.4. Analysis of the Impact of Hole Parameters on the Evaluation Index Based on Response Surface Model

Figures 14–17 (respectively) depict the response surface plots of two parameters and the target value when a certain parameter is fixed at the intermediate level. In Figures 14–17, A , B and C are the normalized values of H , M and D , respectively. If there is no interaction between H , M and D , the contours on the response surface plot should appear as concentric circles. Conversely, if the contours on the response surface plot are strongly distorted, it indicates a strong interaction between the two factors.

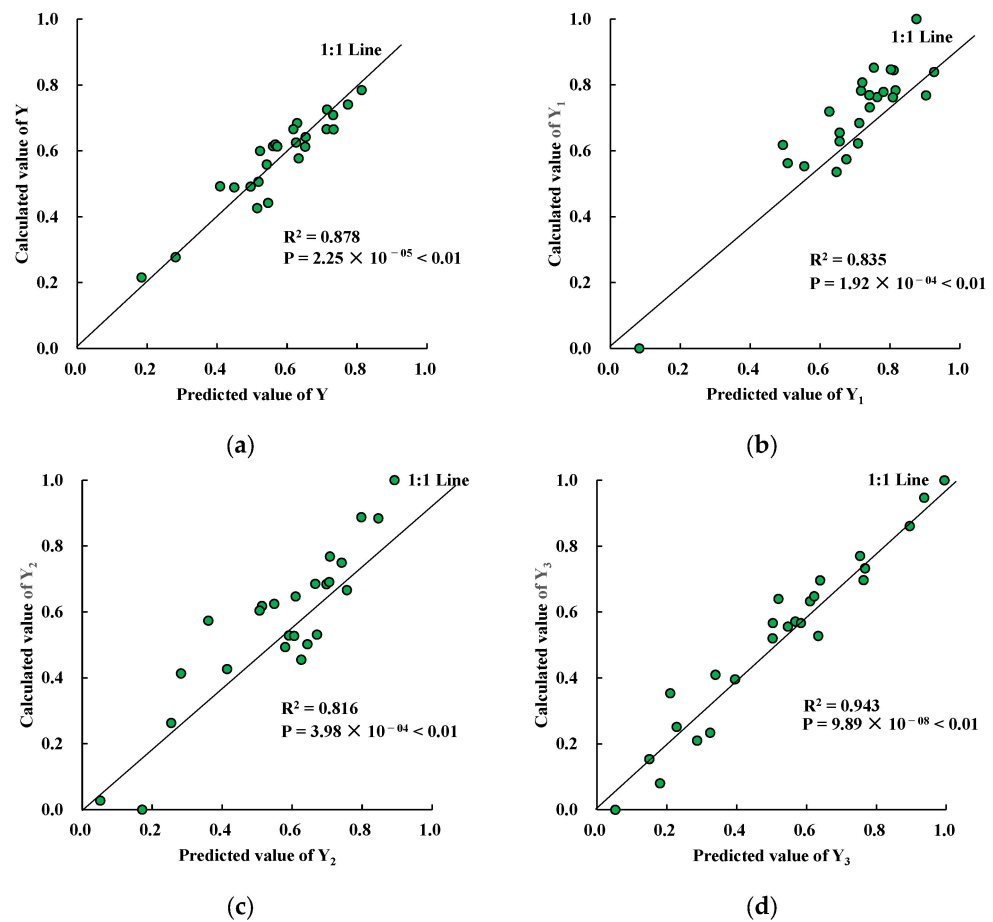


Figure 13. Error analysis plot of regression model predicted values versus numerically simulated computation values: (a) error analysis of regression model for Y; (b) error analysis of regression model for Y_1 ; (c) error analysis of regression model for Y_2 ; (d) error analysis of regression model for Y_3 .

As can be seen from Figures 14–17, the three hole parameters have a strong interaction effect on each evaluation indicator. For the overall evaluation indicator Y, as H increases, the optimal values of M and D also gradually increase. Within the range of values that contains the maximum value of the overall evaluation indicator Y, when M is at a high level (around 0.8), D is at a medium level (around 0.5) and H is at a relatively high level (around 0.65), Y can reach its maximum value. The fastest ascent method can be used to find the maximum values of each response surface model in the calculation region, and the results are listed in Table 6.

Table 6. Optimization results of different hole parameters.

Scheme	Method	Optimization Objectives	M [m]	D [m]	H [m]	y_1 [%]	y_2 [%]	y_3 [m/s]
F1	/	/	/	/	/	48.5	78.3	0.32
F2	Main Effect Analysis	Y_1	4.3	12.5	8.8	55.0	83.2	0.28
F3		Y_2	5.4	12.5	5.4	51.1	89.9	0.24
F4		Y_3	5.4	5.6	8.8	51.2	64.3	0.16
F5	Response Surface Methodology	Y_1	5.4	15.9	8.8	57.1	85.1	0.34
F6		Y_2	5.4	16.5	4.9	51.1	90.3	0.18
F7		Y_3	5.4	5.6	8.8	51.2	64.3	0.16
F8		Y	4.6	14.1	7.2	55.1	83.5	0.21

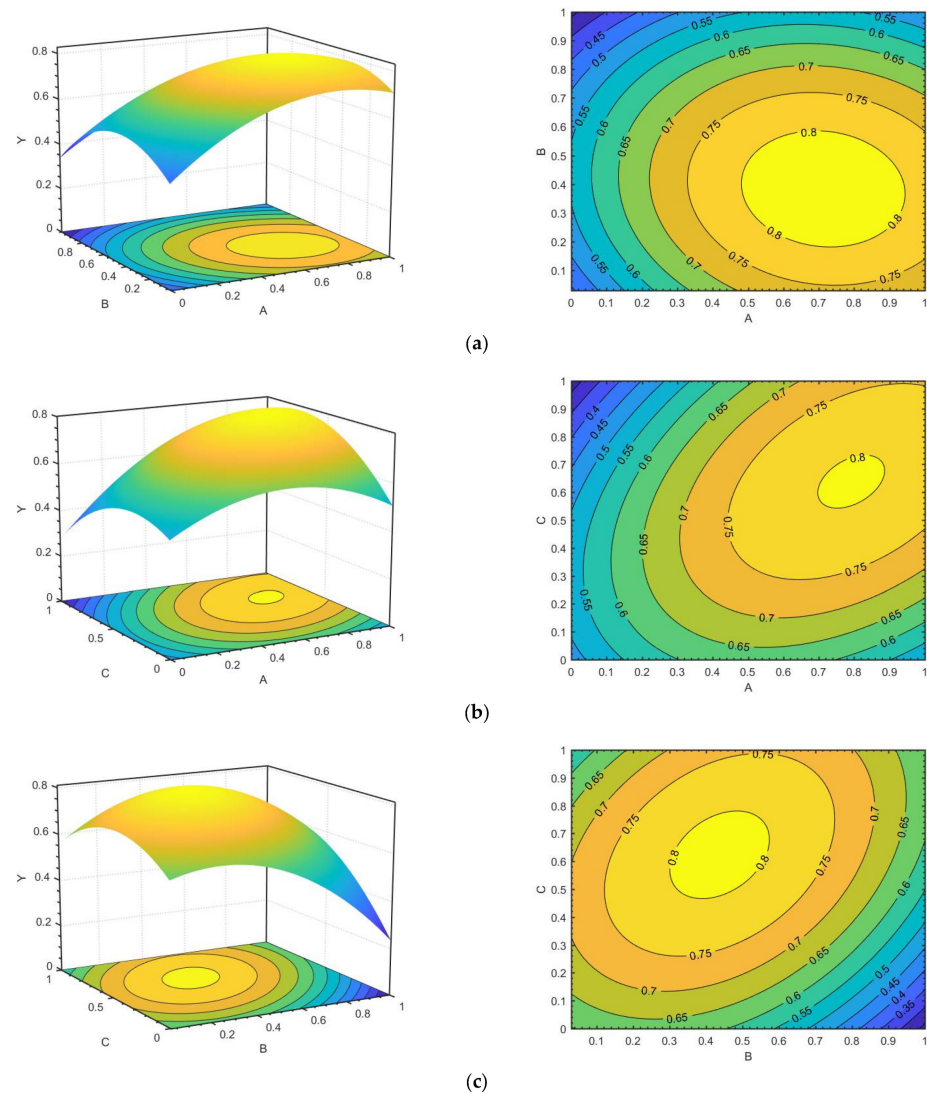
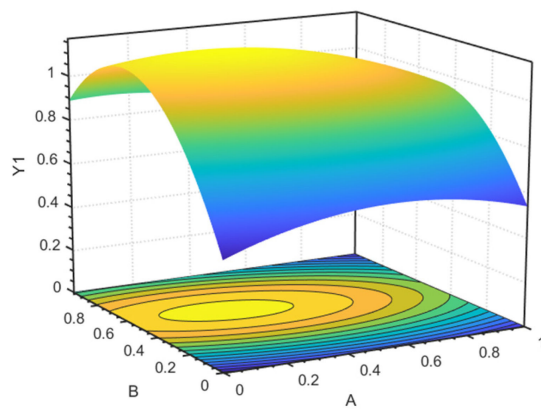


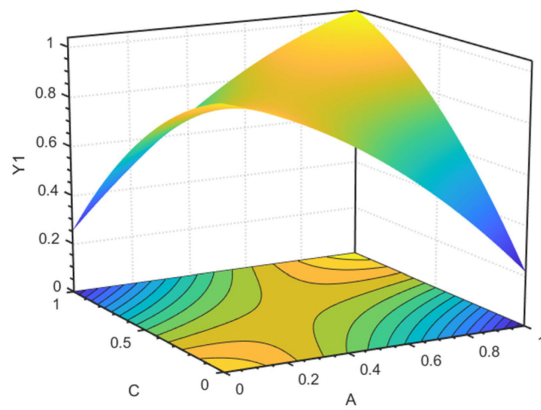
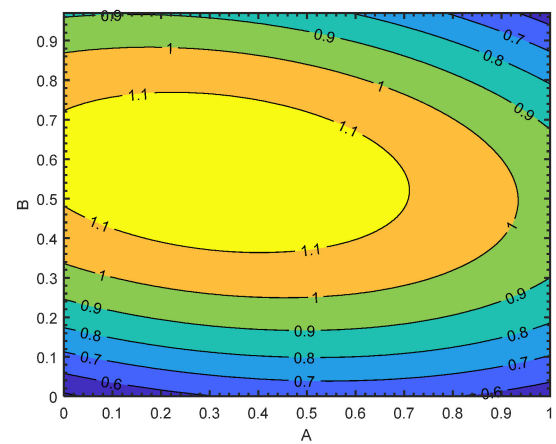
Figure 14. Response surface plots of the diversion wall hole parameters and the comprehensive evaluation indicator Y: (a) response surface of Y with respect to A and B; (b) response surface of Y with respect to A and V; (c) response surface of Y with respect to B and C.

4.5. Optimization Results and Validation of Hole Parameters

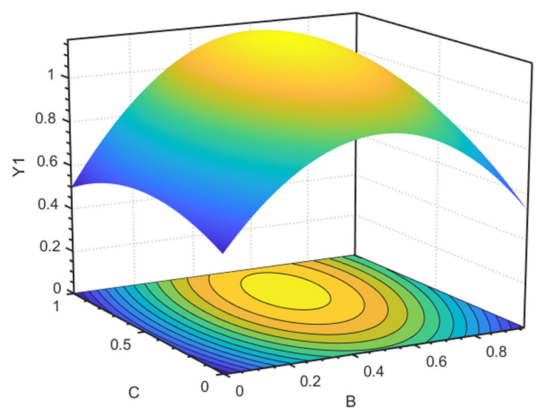
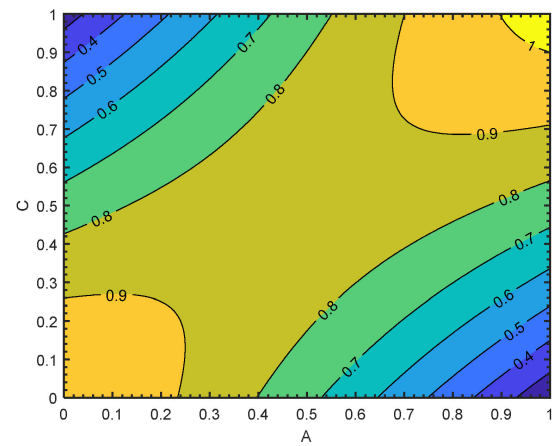
Numerical simulation experiments were conducted on the original scheme, three optimization schemes obtained by main effect analysis and four optimization schemes obtained by response surface analysis. The results of the numerical simulation are shown in Table 6 and Figure 18, where F1 represents the original scheme with the diversion wall non-perforated. F2–F4 represent the aperture schemes obtained by main effect analysis with Y_1 , Y_2 and Y_3 as optimization objectives, respectively. F5–F8 represent the aperture schemes obtained by response surface analysis with Y_1 , Y_2 , Y_3 and Y as optimization objectives, respectively. Figures 19–26 display the flow pattern under pumping and self-draining conditions for each of the abovementioned schemes.



(a)



(b)



(c)

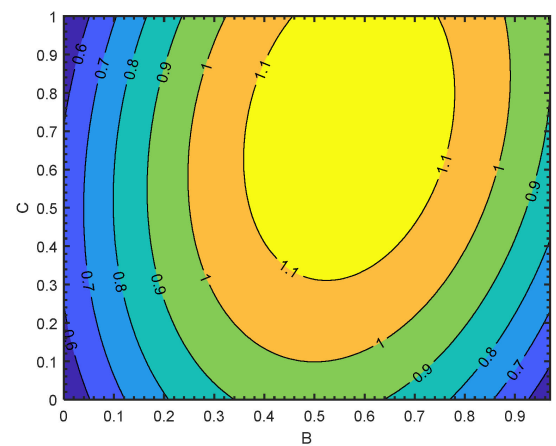
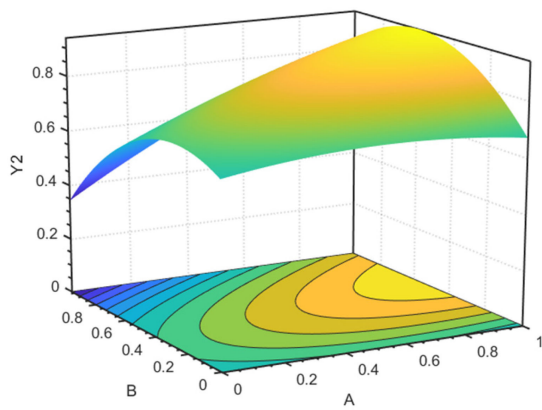
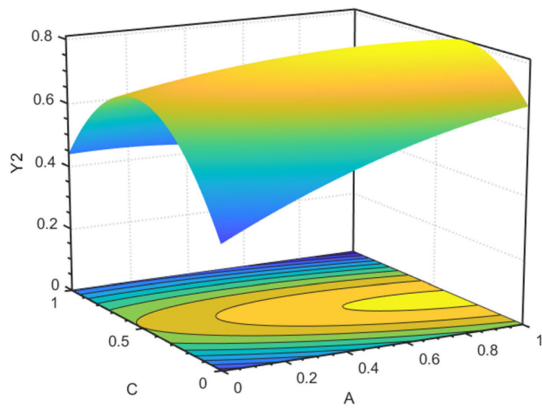
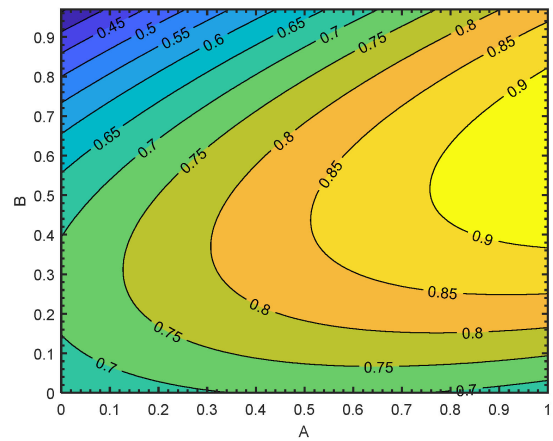


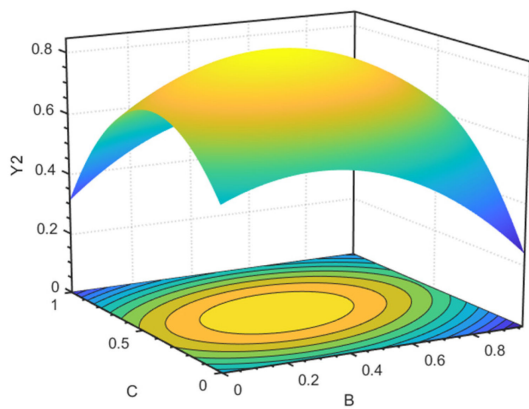
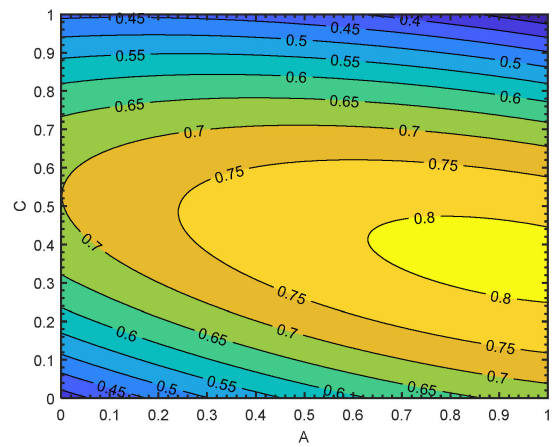
Figure 15. Response surface plots of the diversion wall hole parameters and the evaluation indicator Y_1 : (a) response surface of Y_1 with respect to A and B; (b) response surface of Y_1 with respect to A and V; (c) response surface of Y_1 with respect to B and C.



(a)



(b)



(c)

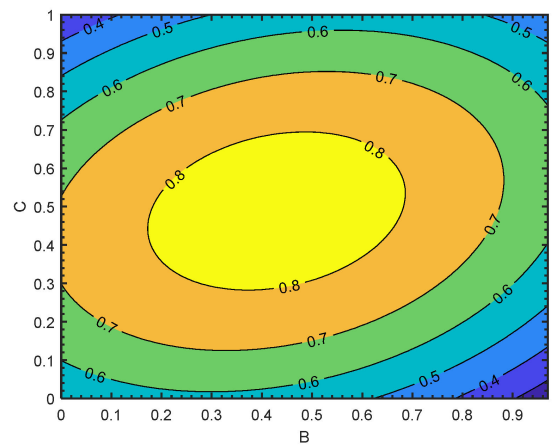
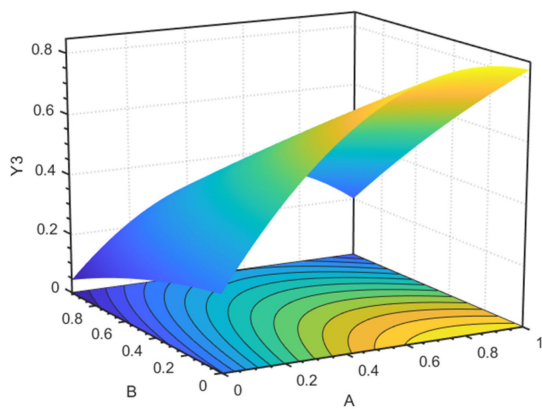
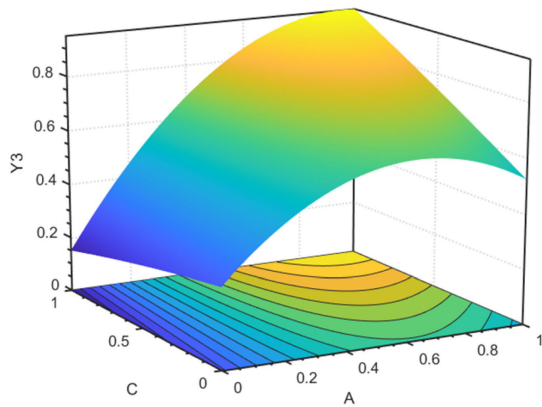
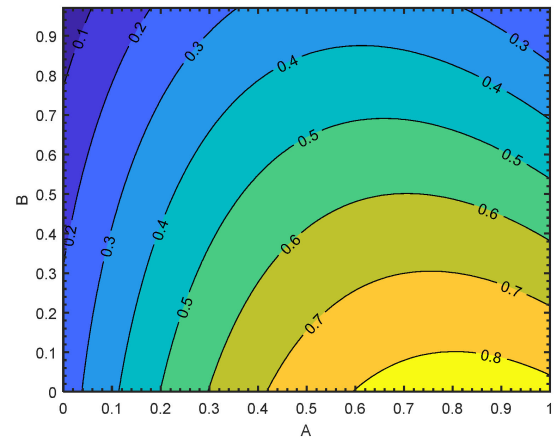


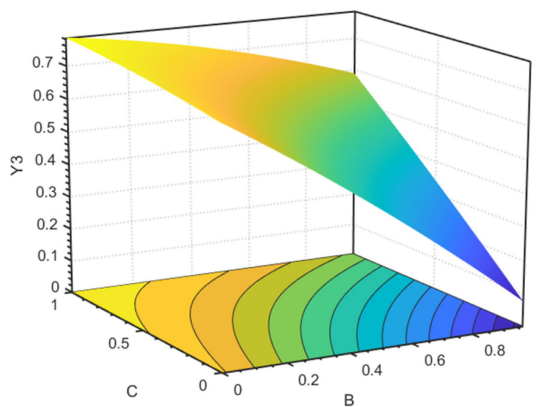
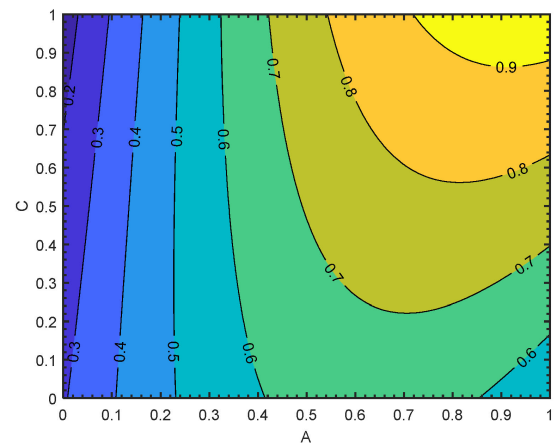
Figure 16. Response surface plots of the diversion wall hole parameters and the evaluation indicator Y_2 : (a) response surface of Y_2 with respect to A and B; (b) response surface of Y_2 with respect to A and V; (c) response surface of Y_2 with respect to B and C.



(a)



(b)



(c)

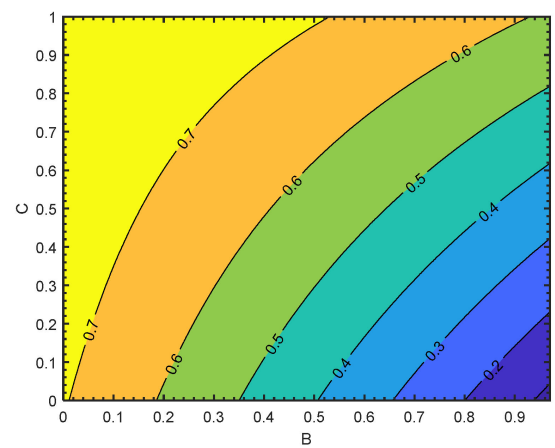


Figure 17. Response surface plots of the diversion wall hole parameters and the evaluation indicator Y_3 : (a) response surface of Y_3 with respect to A and B; (b) response surface of Y_3 with respect to A and V; (c) response surface of Y_3 with respect to B and C.

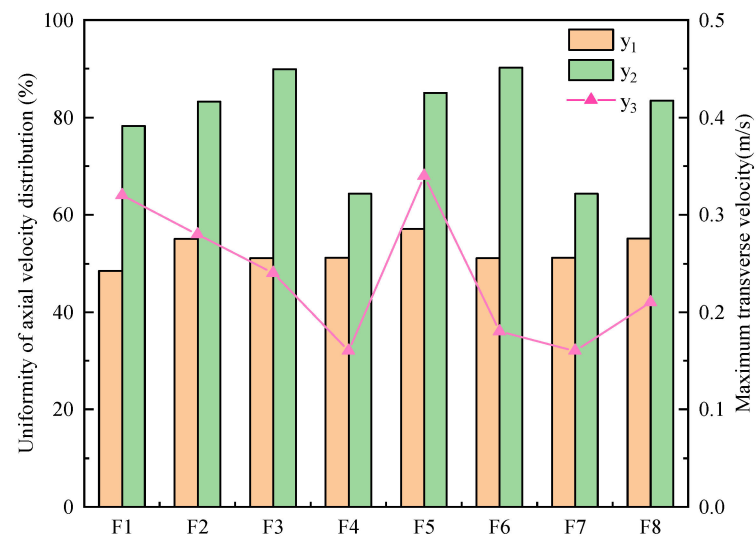


Figure 18. Optimization results with different hole parameter configurations.

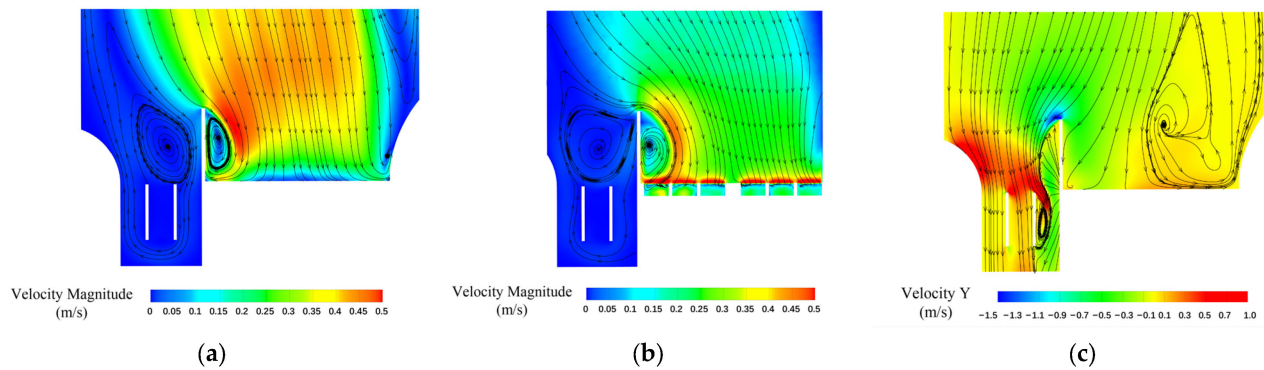


Figure 19. Flow pattern in the forebay of the original scheme F1: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

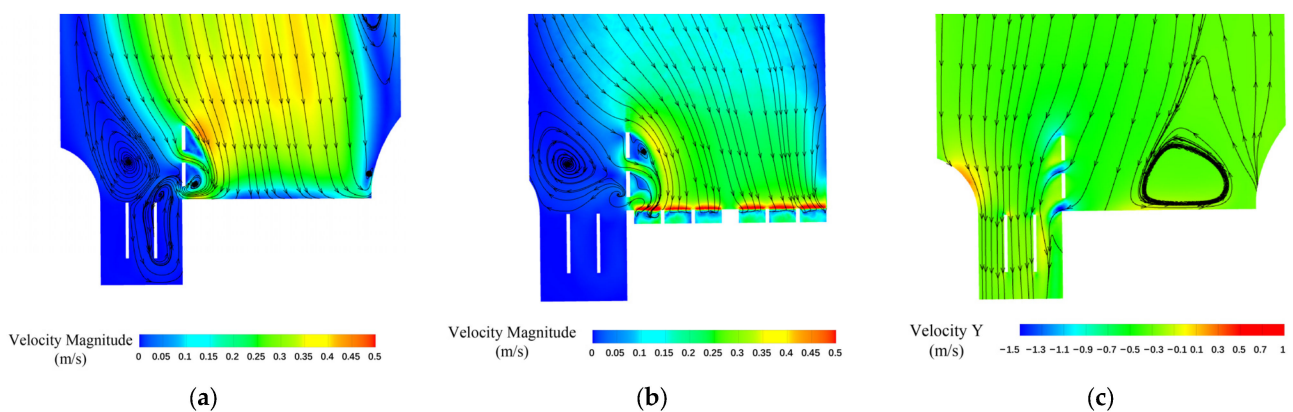


Figure 20. Flow pattern in the forebay of scheme F2: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

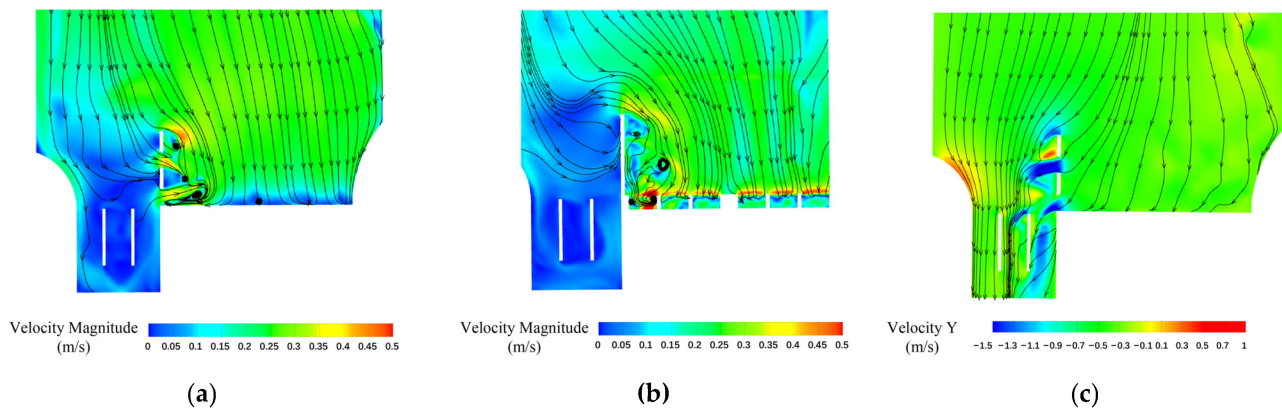


Figure 21. Flow pattern in the forebay of scheme F3: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

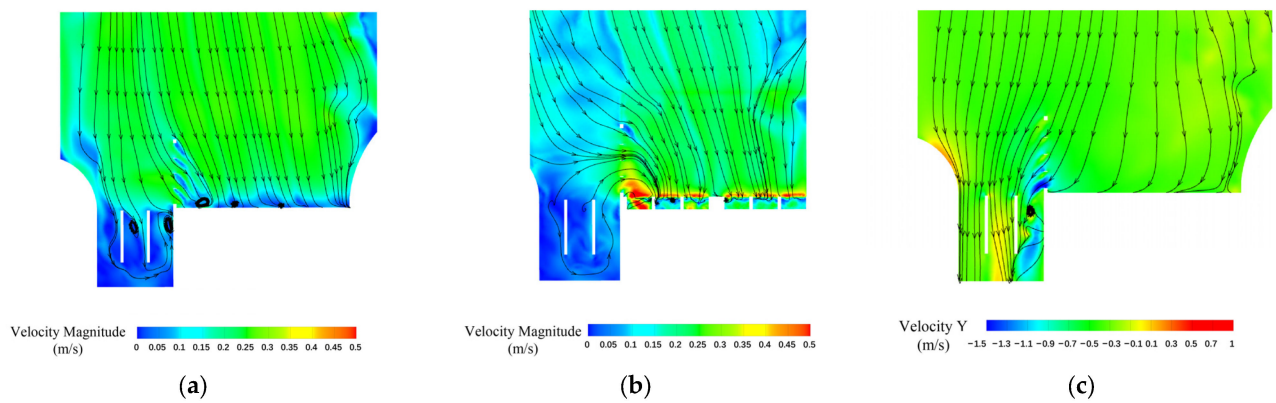


Figure 22. Flow pattern in the forebay of scheme F4: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

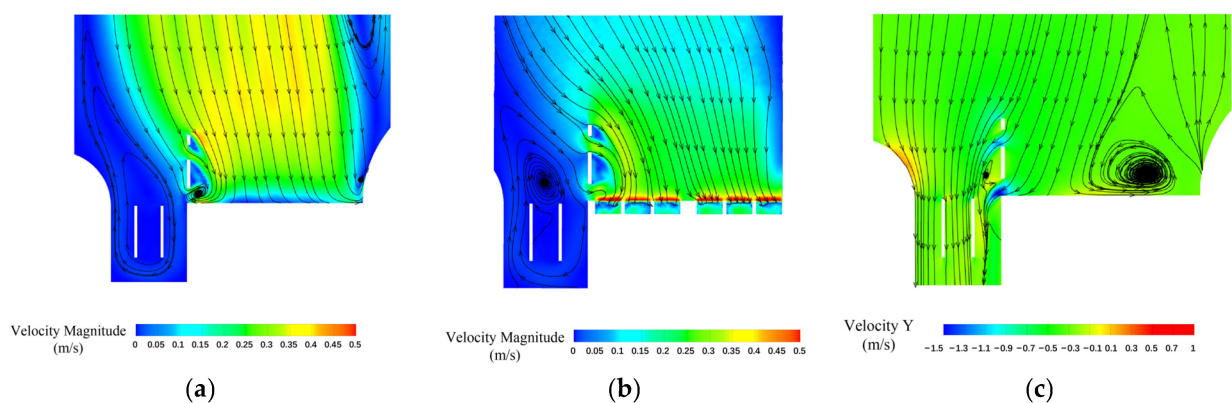


Figure 23. Flow pattern in the forebay of scheme F5: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

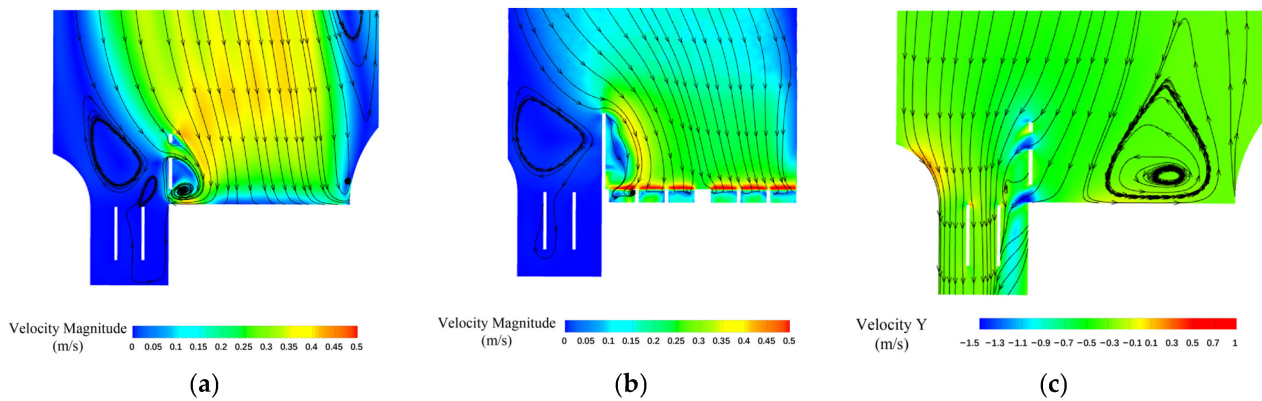


Figure 24. Flow pattern in the forebay of scheme F6: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

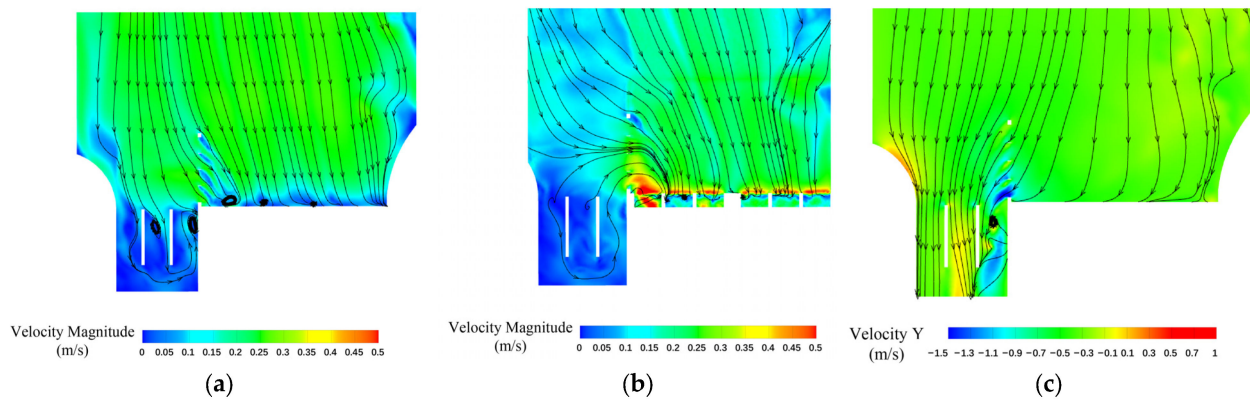


Figure 25. Flow pattern in the forebay of scheme F7: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

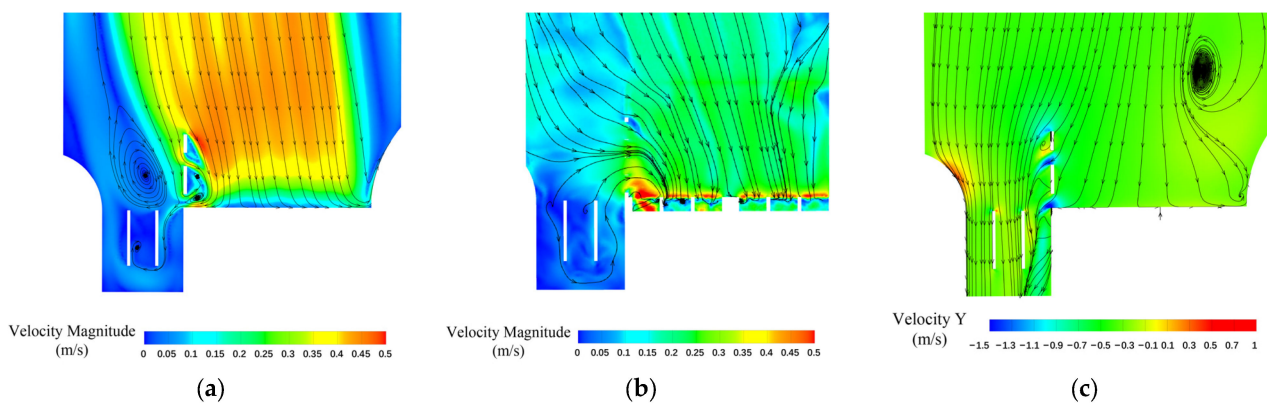


Figure 26. Flow pattern in the forebay of scheme F8: (a) surface flow pattern under pumping condition; (b) bottom flow pattern under pumping condition; (c) surface flow pattern under self-draining condition.

The results of numerical simulation experiments indicate that appropriate holes on the diversion wall can improve the uniformity of axial flow velocity distribution and reduce the transverse flow velocity under self-draining and pumping conditions, so that the flow state of the forebay in the combined sluice-pumping station project can be improved. The hole scheme in F8 obtained by adopting the response surface analysis method and taking

the comprehensive evaluation indicator as the optimization objective was found to result in an improvement in the uniformity of axial flow velocity distribution in inlet channel 6# by 6.6% and in sluice chamber 7# by 5.2% compared to the original scheme F1. Additionally, the maximum transverse flow velocity decreased from 0.32 m/s to 0.21 m/s, which is a reduction of 34.4%. After a series of calculations and comparisons, the optimized solution met the navigation requirements.

4.6. Discussion

As shown by the results of numerical simulation calculations for the optimization scheme, creating reasonable holes on the diversion wall can improve the flow state of the forebay in the combined sluice-pumping station project. As seen in Figure 19, under the pumping condition, the original design without holes on the diversion wall leads to a large area of backflow forming in front of inlet channel 6#, forcing the flow to deviate from the channel and affecting the flow state of the pumping station. Under the self-draining condition, the backflow area occurs near the junction of the sluice and the diversion wall, affecting the flow state in the sluice chamber. Compared to the original scheme, the optimization target y_1 increased by 6.5% under the optimization scheme F2, and there was also some improvement in the non-optimization targets y_2 and y_3 . As seen in Figures 20–26, it can be inferred that the holes in the diversion wall have a smoothing effect on the flow, dispelling the backflow area and improving the flow state in the forebay. This smoothing effect not only improves the flow state under pumping conditions, but it also has a positive effect on the flow state under self-draining conditions.

The main effect analysis method can only perform optimization at the level of orthogonal experimental design. Therefore, for the same optimization objective, the response surface analysis method has a more significant optimization effect and more precise optimization parameters compared to the main effect analysis method. The F3 and F6 optimization schemes were obtained using the main effect analysis method and single-objective response surface analysis method, respectively, with y_2 as the optimization objective. The y_2 value of the F6 scheme was better than that of the F3 scheme. However, the single-objective response surface analysis method may result in worse non-objective values while obtaining a better objective value. For example, compared to F2, the target value y_1 increased by 2.1% in the F5 scheme, but the maximum transverse flow velocity increased from 0.24 m/s to 0.34 m/s, which does not meet the navigation requirements [29].

The utilization of the comprehensive evaluation indicator Y (multi-objective optimization) leads to a more balanced and reasonable hole scheme compared to single-objective optimization. For instance, adopting the single-objective response surface optimization for F5 results in the highest y_1 value among all the schemes, but it results in an unacceptably high y_3 of 0.34 m/s for safe navigation of ships. When the F6 optimization with a single-objective response surface makes y_2 optimal, y_1 is only 51.1%, and under the F7 scheme, the numerical simulation result of the optimization index y_3 is 0.16 m/s, while y_2 is only 64.3%.

In conclusion, the response surface method proves to be an efficient optimization technique in engineering structure design. Adopting comprehensive evaluation indexes is crucial in accounting for multiple objectives in the optimization process. The evaluation indexes and response surface method adopted in this study offer useful insights for analyzing the hydraulic characteristics and optimizing the design of the inlet and outlet structures in the combined sluice-pumping station project. This methodology is deserving of further consideration and promotion in future studies.

5. Conclusions

In this study, the optimal hole parameters of the diversion wall were sought. The design of experiments was carried out by adopting the orthogonal test method, and numerical simulations were performed using numerical simulation software for the combined sluice-pumping station. A set of comprehensive evaluation indexes were proposed. Based

on the response surface analysis of the evaluation indexes on the experimental data, the relationship between the comprehensive evaluation indexes and the hole parameters of the diversion wall was established, resulting in the development of a method and theory for optimizing the hole parameters of the diversion wall in the combined sluice-pumping station. The following main conclusions were obtained from this research:

- (1) Utilization of the coefficient of variation method enables a comprehensive evaluation of the flow state assessment indexes of the combined sluice-pumping station under different operating conditions. This leads to a more reasonable evaluation of the operation status of the combined sluice-pumping station. By combining the orthogonal experimental design and response surface analysis, a second-order polynomial function relating the hole parameters of the diversion wall to the response values is established. The optimization parameters for the hole obtained through the steepest ascent method to obtain the maximum value are more efficient and accurate.
- (2) The numerical simulation results demonstrate the feasibility of the method of the comprehensive evaluation indicator combined with the response surface method. The optimization of the hole parameters obtained by this method is more balanced and reasonable compared to other single-objective optimization methods. The final optimization parameters of the hole are as follows: hole width 4.6 m, hole center distance 14.1 m and hole depth 7.2 m. Compared to the original scheme, the uniformity of axial velocity distribution in inlet channel #6 improved by 6.6%, the uniformity of axial velocity distribution in chamber #7 improved by 5.2% and the maximum transverse velocity decreased by 34.4%. Hence, the combined sluice-pumping station project met the navigation requirements after optimization.
- (3) The response surface methodology and the methodology that employs the variance coefficient to calculate weights were shown to be effective optimization approaches. In the context of engineering structure optimization, it is crucial to synthesize all relevant evaluation indexes. The methodologies proposed in this study can provide guidance for analyzing hydraulic characteristics, selecting corrective measures and optimizing the inlet and outlet structures in combined sluice-pumping stations. Although the case study is limited to a specific geometry, the evaluation index selection method and optimization methodology proposed in this study are valuable and can be adapted to other engineering structures based on their specific characteristics. Given the benefits of these evaluation indicator selection and optimization design methodologies, they deserve further promotion and consideration.
- (4) In the forthcoming stage, physical model tests will be performed to verify the optimized outcomes. Furthermore, the research will delve into novel forms of the diversion wall structure and optimization techniques, offering guidance and technical assistance for the hydraulic analysis of the inlet and outlet structures, optimization design and selection of rectifying measures in the combined sluice-pumping station project.
- (5) Our research demonstrated that the perforated diversion wall is an effective solution for improving flow conditions in the forebay under certain operating conditions. However, it is important to note that our study only considered a limited range of operating conditions. Further optimization is needed to ensure reliable operation of the wall under a wider range of water levels and pump unit activations. Therefore, future studies should focus on optimizing the perforated diversion wall for more common operating conditions to ensure good flow conditions in the forebay under all operating conditions.

Author Contributions: Conceptualization, B.X. and S.X.; methodology, B.X.; software, B.X., S.X. and J.L.; validation, W.L., B.X. and S.X.; formal analysis, S.X.; investigation, B.X. and W.X.; resources, B.X.; data curation, S.X.; writing—original draft preparation, S.X. and Y.S.; writing—review and editing, S.X.; visualization, S.X. and W.X.; supervision, B.X., H.X. and L.X.; project administration, W.L.; funding acquisition, W.L. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by the National Natural Science Foundation of China (No. 52079120; Funder: Bo Xu), Water Conservancy Science and Technology Project of Jiangsu Province (2022060, Funder: Weigang Lu), the Jiangsu South-to-North Water Diversion Technology R&D Project (JSNSBD202105, Funder: Lei Xu) and the Water Science and Technology Project of Jiangsu Province (2022010, Funder: Lei Xu).

Data Availability Statement: The data that support the findings of this study can be provided by the corresponding author upon reasonable request.

Conflicts of Interest: The authors declare no conflict of interest.

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