Study of Optimal Operation for Huai'an Parallel Pumping Stations with Adjustable-Blade Units Based on Two Stages Decomposition-Dynamic Programming Aggregation Method

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Abstract: Two-stage decomposition-dynamic programming aggregation method has been first proposed and introduced to solve the mathematical model of daily optimal operation for parallel pumping stations with adjustable-blade units. Taking minimal daily electricity cost of single pump station as objective function, the water quantity pumped by each station as coordinated variable, by means of the type of the pump units this model is decomposed into several first-stage sub-model of daily optimal operation with adjustable-blade for single pump station. Then taking minimal daily electricity cost of single pump unit as objective function, the water quantity pumped by each unit as coordinated variable, the first-stage sub-model is decomposed into several second-stage sub-model of daily optimal operation with adjustable-blade for single pump unit which takes the blade angle as decision variable, the discrete values of water quantity pumped by each unit as state variable, and is solved by means of dynamic programming method. The constructed aggregation model takes daily water quantity pumped by each pump unit as decision variable, the discrete values of water quantity pumped by parallel station group as state variable, and is also solved by dynamic programming method. The aggregation process replaces the traditional method of constructing equations. This method has first solved the optimal operation issues for multi-units of parallel stations with various operation modes, time period division and daily average head of each station, and also provided theoretical support for the study on optimal operation of multi-stage pumping stations. Taking Huai'an No.1, No.2, and No.4 parallel pumping stations as a study case, a series of optimization results have been obtained.

Keywords: parallel pumping stations, decomposition, aggregation, dynamic programming, optimization, adjustable-blade

1 Introduction

The parallel pumping stations have a huge energy consumption in operation because of containing a large number of pump units, which makes it necessary to develop the study of optimal operation method for multi-units of parallel pumping stations. At present, the major study methods of optimal operation for parallel pumping stations contain decomposition-coordination method and decomposition-aggregation method. The former would bring tedious combinations while more pump units exist. And the latter always establishes regression equation while in aggregation process, which would affect the solution precision of optimization model. Therefor, two-stage decomposition-dynamic programming aggregation method has been proposed and applied to the study. Taking No.1, No.2 and No.4 Huai,an Pumping Station as a study case, we divide one day into several time periods according to the inlfluence of peak-valley electricityity price and the demands of not high frequency start-up/shut

down operation, by which to search the optimization benefit carried out by optimal operation of multi-units with adjustable-blade in parallel pumping stations operation.

2 Optimal daily operation model and its solving method for multi-units with adjustable-blade in parallel pumping stations

In order to be convenient for discussion, a series of definitions have been made which are as follows:

(1) Operation mode

Operation with fixed blade angle and constant speed: The pump units are operating with rating speed and the blade angle at the designing degree.

Optimal operation with adjustable-blade: The pump units are operating with constant speed and adjusting the blade angle in each time period according to operation conditions in order to obtain the minimal water pumping cost.

(2) Full load, 80% load, 60% load

The operation of pump units lasting 24 durative hours is called full load operation. 80% load operation and 60% load operation respectively represents the pump units are operating with 80% and 60% of water quantity pumped by the units while they are operating with full load at fixed blade angle and constant speed.

(3) Beginning time and the combination between length of time period and peak-valley electricityity price

Considering peak-valley electricityity price and the demand of avoiding high frequency of start-up/shut down operation, we choose beginning time at 17 :00 and divide one day into 9 periods. The time length and the electricityity price in each of period is shown in Table 1.

Tab 1. Time period division and peak-valley electricity price of each time period

Serial number	Time division	Length of time period/h	Electricityity price/yuan·kW⁻¹·h⁻¹	Serial number	Time division	Length of time period/h	Electricityity price/yuan·kW⁻¹·h⁻¹
I	17:00～19:00	2	0.978	VI	07:00～09:00	2	0.978
II	19:00～21:00	2	0.978	VII	09:00～11:00	2	0.978
III	21:00～23:00	2	0.587	VIII	11:00～14:00	3	0.587
IV	23:00～03:00	4	0.276	IX	14:00～17:00	3	0.587
V	03:00～07:00	4	0.276				

2.1 Optimal model of daily operation for multi-units with adjustable-blade in parallel pumping stations

Taking minimal daily electricity cost of entire parallel pumping group as objective function, the time period as stage variable, the blade angle of each pump unit in each time period as decision variable, the water quantity pumped in definite time period and power of electromotor equipped in station as the constraint conditions, the optimal mathematical model of daily operation for multi-units with adjustable-blade in parallel pumping stations has been construced as follows :

Objective function:
$$G = \min \sum_{k=1}^{BZ} G_k = \min\left(\sum_{k=1}^{BZ}\sum_{j=1}^{JZ}\sum_{i=1}^{SN} \frac{\rho g Q_{kji}(\theta_{kji}) H_{kji}}{\eta_{z,kji}\eta_{mot,kj}\eta_{int,kj}}\Delta T_{ki} P_{ki}\right) \tag{1}$$

Water quantity constraint:
$$\sum_{k=1}^{BZ}\sum_{j=1}^{JZ}\sum_{i=1}^{SN} Q_{kji}(\theta_{kji})\Delta T_i \geq W_e \tag{2}$$

Power constraint:
$$N_{kji}(\theta_{kji}) \leq N_{kj0} \tag{3}$$

Where G is the minimal daily electricity cost of the entire parallel pumping group. G_k is the daily electricity cost of the k-th pumping station. BZ is quantity of pumping stations in the parallel pumping group. JZ is quantity of pump units in each single station. SN is the quantity of time periods divided in one day. ρ is water density and g is acceleration of gravity. H_{kji} and Q_{kji} (θ_{kji}) which is corresponding to the blade angle θ_{kji} respectively represent the average daily head and flow of the j-th pump unit in the k-th pumping station and in the i-th time period. $\triangle T_{ki}$ and P_{ki} respectively represent the time length and the peak-valley electricity price of the i-th time period in the k-th pumping station. $\eta_{z,kji}$(θ_{kji}), $\eta_{mot,kj}$, $\eta_{int,kj}$ respectively represent the efficiency of equipment, electromotor and transmission of the j-th pump unit in the k-th pumping station. Among them $\eta_{z,kji}$ is relative to the flow and average head of the i-th period. $\eta_{mot,kj}$ could be regarded as constant when the load is over 60%, while in large electromotor the $\eta_{mot,kj}$ could be regarded as 94%. Also we considered 1 as the $\eta_{int,kj}$ value in direct joint unit. W_e is the objective water quantity pumped by the whole parallel pumping group in one day. And N_{kji}(θ_{kji}) is the actual electromotor power of the j-th pump unit in the k-th pumping station and in the i-th time period while the pump unit is operating under the blade angle θ_{kji}, which should be less than the rating power of N_{kj0}.

2.2 Two-stage decomposition-dynamic programming aggregation method

2.2.1 Large-scale two-stage decomposition

2.2.1.1 First-stage decomposition

Taking water quantity pumped by each pumping station as the coordinated variable, we decompose eq. (1)~(3) into *BZ* first-stage subsystems according to the type of pump unit with the assumption that the units have the same type in the same pumping station. Then the optimal mathematical model of daily operation for multi-units with adjustable-blade for single pumping station is obtained which is shown from eq. (4)~(6). This model takes minimal daily electricity cost of single pumping station as objective function, the blade angle of each pump unit in each time period as decision variable, the water quantity pumped in definite time period and power of electromotor equipped in station as the constraint conditions.

Objective function:
$$F = \min \sum_{j=1}^{JZ} F_j = \min(\sum_{j=1}^{JZ} \sum_{i=1}^{SN} \frac{\rho g Q_{i,j}(\theta_{ji}) H_{ji}}{\eta_{zi,j}(\theta_{ji})\eta_{mot,j}\eta_{int,j}} \Delta T_i P_i) \tag{4}$$

Water quantity constraint:
$$\sum_{j=1}^{JZ} \sum_{i=1}^{SN} Q_{ji}(\theta_i)\Delta T_i \geq W_k \tag{5}$$

Power constraint:
$$N_{kji}(\theta_i) \leq N_{kj0} \quad (i=1, 2, \ldots, SN ; \quad j=1, 2, \ldots, JZ) \tag{6}$$

Where F is the minimal daily electricity cost of single pumping station. F_j is daily electricity cost of the j-th pump unit. W_k is the objective water quantity pumped by single pumping station in one day Meanings of other variables could be obtained by analogy according to eq. (1)~(3).

2.2.1.2 Second-stage decomposition

Taking water quantity pumped by each pump unit as the coordinated variable, eq. (4)~(6) is decomposed into *JZ* second-stage subsystems according to the quantity of pump unit in one single

station. Then the optimal mathematical model of daily operation for single pump unit with adjustable-blade is obtained which is shown from eq. (7)~(9). This model takes minimal daily electricity cost of single pump unit as objective function, the blade angle of each pump unit in each time period as decision variable, the water quantity pumped in definite time period and power of electromotor equipped in station as the constraint conditions. The blade angle is chosen at integer degree in order to be convenient for practical operation.

Objective function:
$$M = \min F_j = \sum_{i=1}^{SN} \frac{\rho g Q_{i,j}(\theta_i) H_i}{\eta_{zi,j} \eta_{mot,j} \eta_{int,j}} \Delta T_i P_i \quad (j=1,2,...JZ) \tag{7}$$

Water quantity constraint:
$$\sum_{i=1}^{SN} Q_{ji}(\theta_i) \Delta T_i \geq W_j \quad (i=1,\ 2,\ ...,\ SN;\ j=1,2,...JZ) \tag{8}$$

Power constraint:
$$N_{ji}(\theta_i) \leq N_{j0} \quad (i=1,\ 2,\ ...,\ SN;\ j=1,2,...JZ) \tag{9}$$

Where M is the minimal daily electricity cost of single pump unit. F_j is daily electricity cost of the j-th pump unit. W_j is the objective water quantity pumped by single pump unit in one day. Meanings of other variables could be obtained by analogy according to eq. (1)~(3).

2.2.2 Optimization of second-stage subsystem

Eq. (7)~(9) are typical one-dimension dynamic programming model whose stage variable is i(i=1, 2, ..., SN) and decision variable is the blade angle θ_i. Also we could know from eq. (8) that the water quantity pumped in each time period is the state variable λ. Making use of dynamic programming method to solve this model, a series of F_j values corresponding to objective water quantity W_j could be obtained. The solving details of this model have been shown as follows:

Stage 1:
$$M_1(\lambda_1) = \min \frac{\rho g Q_1(\theta_1) H_1}{\eta_{z1} \eta_{mot} \eta_{int}} \Delta T_1 P_1 \tag{10}$$

The stage variable λ_1 is discrete within its feasible region: $\lambda_1 = 0, W_1, W_2, \cdots, W_j$. The decision variable θ_1 is discrete within its feasible region for example: -4°, -3°, -2°, -1°, 0°, +1°, +2°, +3°, +4°. Also the condition $Q_1(\theta_1)\Delta T_1 \geq \lambda_1$ should be satisfied. According to the performance curve of pump device, the flow and equipment efficiency η_{z1} corresponding to each θ_1 and H_1 could be obtained.

Stage i:
$$g_i(\lambda_i) = \min[\frac{\rho g Q_i(\theta_i) H_i}{\eta_{zi} \eta_{mot} \eta_{int}} \Delta T_i \cdot P_i + g_{i-1}(\lambda_{i-1})] \tag{11}$$

λ_i and θ_i are discrete in the same way as above. Also $Q_i(\theta_i)\Delta T_i \geq \lambda_i$ should be satisfied.

According to eq. (8), the state transition equation is as follows:
$$\lambda_{i-1} = \lambda_i - Q_i(\theta_i)\Delta T_i \quad (i=2,\ 3,\ ...,\ SN-1) \tag{12}$$

Stage SN:
$$g_{SN}(\lambda_{SN}) = \min[\frac{\rho g Q_{SN}(\theta_{SN}) H_{SN}}{\eta_{zSN} \eta_{mot} \eta_{int}} \Delta T_{SN} \cdot P_{SN} + g_{SN-1}(\lambda_{SN-1})] \tag{13}$$

Where $\lambda_{SN} = W_j, W_{j+1}$; $\theta_{SN=}$-4°, -3°, -2°, -1°, 0°, +1°, +2°, +3°, +4°

The state transition equation: $\quad \lambda_{SN-1} = \lambda_{SN} - Q_{SN}(\theta_{SN})\Delta T_{SN} \quad (\lambda_{SN} \geq W_j)$ (14)

With the assumption that BZ pump stations are contained in one parallel pumping group and the pump units contained in each pumping station have the same type with no performance difference while the pump units in different stations have different types, each pumping station has one kind of performance curve of pump unit. Each pump unit has a blade angle corresponding to the maximal flow within the power constraint under the average head of each time period. After taking a definite water quantity step to disperse the total water quantity $W_{j,\max}$ which corresponds to the maximal blade angle of all time periods, the optimal mathematical model of daily operation for single pump unit with adjustable-blade could be applied to calculate the minimal daily cost of single pump unit $F_{j,m}$ ($m = 1$, 2, …, max) which respectively corresponds to each water quantity $W_{j,m}$.

With the fact that the pump units in one station have the same type with no performance difference, each pumping station only needs one optimal solution. Therefor, BZ groups of optimal solution should be done in one parallel pumping group, after which $W_{kjm} \sim F_{kjm}(W_{kjm})$ relationship could be obtained.

2.2.3 Dynamic programming aggregation of large-scale system

After a series of $W_{kjm} \sim F_{kjm}(W_{kjm})$ relationships are obtained by means of the second-stage submodel solutions ($k = 1$, 2, …, BZ; $j = 1$, 2, …, JZ; $m = 1$, 2, …, max), eq. (1)~(3) could be transformed into the following aggregation model.

Objective function: $$G = \min \sum_{k=1}^{BZ} \sum_{j=1}^{JZ} F_{kj}(W_{kj})$$ (15)

Water quantity constraint: $$\sum_{k=1}^{BZ} \sum_{j=1}^{JZ} W_{kj} \geq W_e$$ (16)

Power constraint: $$N_{kji}(\theta_{kji}) \leq N_{kj0}$$ (17)

Taking BZ pump stations as a suppositional station with AZ pump units ($AZ = JZ \times BZ$), eq. (15) ~ (17) are also one-dimension dynamic programming model whose stage variable is n ($n = 1$, 2, …, AZ), the decision variable W_n is the daily water quantity pumped by each unit, and the state variable λ is the discrete value of water quantity pumped by all units. Applying dynamic programming method to solve the model above, the minimal daily electricity cost of entire parallel pumping group corresponding to the objective water quantity W_e could be obtained, by which the optimal water quantity of each pump unit W_n^* ($n = 1$, 2, …, AZ) could be obtained. The solving details of this model are similar to Chapter 2.2.2.

After getting a series of W_n^* values ($n = 1$, 2, …, AZ), by means of the results of solving the second-stage subsystem which is the optimal mathematical model of daily operation for single pump unit with adjustable-blade, we could get a series of optimal operation schemes of each pump unit which is the optimal blade angle θ_{in}^* ($i = 1$, 2, …, SN; $n = 1$, 2, …, AZ) in each time period corresponding to each W_n^* ($n = 1$, 2, …, AZ).

2.3 Analysis of optimal operation for multi-units with adjustable-blade in Huai'an parallel pumping stations

2.3.1 Basic informations of Huai'an parallel pumping stations

The basic information of No.1, No.2 and No.4 Huai'an Pumping Stations which are the second stage stations in the Eastern Route of the South-to-North Water Transfer Project is shown in Table 2. During

the optimization process, one standby unit contained in No.4 Huai'an Pumping Station is not considered.

Table 2. Basic information of No.1, No.2 and No.4 Huai'an Pumping Stations

Pumping station	Type of pump unit	Unit quantity	Impeller diameter /mm	Rated speed /r·min^{-1}	Match motor power /kW	Rated blade angle/°	Range of adjustable-blade
No.1	Axial-flow pump	8	1640	250	1000	0	-4°～+4°
No.2	Axial-flow pump	2	4500	100	5000	0	-4°～+4°
No.4	Axial-flow pump	3	2900	150	2500	0	-4°～+4°

The upstream and downstream rivers of Huai'an parallel pumping stations have a big enough cubage, which makes the daily head has a small change scope. Therefor, with the assumption that the daily average head has a constant value, and within the feasible domain of parallel pumping stations, we disperse it into 6 average daily heads which are 3.13m, 3.53m, 3.93m, 4.13m, 4.53m and 4.93m. In each of daily average head, full load, 80% load and 60% load of water quantity corresponding to operation with fixed blade angle and constant speed are considered as the optimal objective water quantity. Taking use of two-stage decomposition-dynamic programming aggregation method, we could get the electricity cost per 10^4m^3 water quantity corresponding to minimal daily electricity cost of entire parallel pumping group under each daily average head and operation load.

2.3.2 Optimization results of optimal operation model for muilt-units with adjustable-blade in Huai'an parallel pumping stations

Making use of the method above, the optimal operation scheme of No.1, No.2 and No.4 Huai'an Pumping Station under each daily average head and operation load could be obtaned. Taking the daily average head of 4.13m, 80% load for example, the optimal operation scheme is shown in Tab. 3 whose electricity cost per 10^4m^3 water quantity is 79.84 yuan/10^4m^3. Fig.1 shows the electricity cost per 10^4m^3 water quantity of optimization under each operation load. And Fig.2 shows the optimal water quantity allocation among all pmup units respectively under full load, 80% load and 60% load while the daily average head is 4.13m.
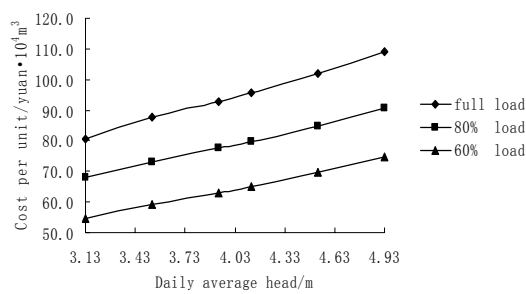

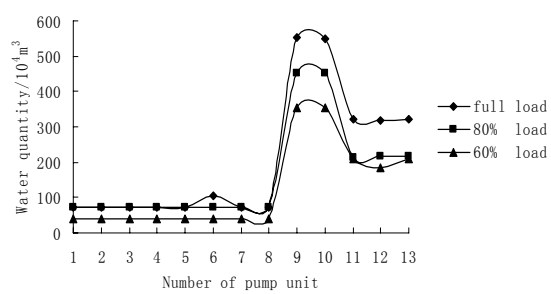Fig 1. Unit cost of water pumping under the optimal operation with adjustable -blade

Fig 2. Optimal water quantity allocation among units under different loads and daily average head of 4.13m

Tab 3. Optimal operation schemes of 80% load with adjustable-blade under daily average head of 4.13m considering peak-valley electricity price

Pumping station	Unit number	1	2	3	4	5	6	7	8	9
		Time period								
No.1	Unit 1	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 2	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 3	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 4	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 5	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 6	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 7	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
	Unit 8	Stop	Stop	0°	+1.5°	+1.5°	Stop	Stop	-2°	-2°
No.2	Unit 1	+2°	+2°	+4°	+4°	+4°	Stop	Stop	+4°	+4°
	Unit 2	+2°	+2°	+4°	+4°	+4°	Stop	Stop	+4°	+4°
No.4	Unit 1	Stop	Stop	+2°	+4°	+4°	Stop	Stop	+1°	+1°
	Unit 2	Stop	Stop	+1°	+4°	+4°	Stop	Stop	+2°	+4°
	Unit 3	Stop	Stop	+1°	+4°	+4°	Stop	Stop	+2°	+4°

2.3.3 Discussion of optimization results on optimal operation of multi-units with adjustable-blade in Huai'an parallel pumping stations

Analyzing upon the figures and tables obtained from the optimization on multi-units with adjustable-blade in Huai'an parallel pumping stations by two-stage decomposition-dynamic programming aggregation method aiming to each daily average head and operation load, following results could be obtained.

(1) Average electricity cost per $10^4 m^3$ water quantity of all daily average heads corresponding to full load, 80% load and 60% load operation are respectively 94.60yuan/$10^4 m^3$, 78.98yuan/$10^4 m^3$ and 64.37yuan/$10^4 m^3$.

(2) Optimization results show that shut-down periods always appear in the period of high electricity price (0.978 yuan/kW·h) and while in operation period the high price corresponds to small blade angle of pump unit and vice versa. In the meantime, it is necessary to increase the shut-down periods instead of operating at the minus blade angle in order to save the electricity cost. That means there is a preferential consideration of controlling the number of operation units, after which the adjustable-blade measure would be taken.

(3) Fig.2 shows that as a result of higher unit performance of No.2 Huai'an pumping station, the water quantity distributed to No.2 station is more that the others, which reflects efficiency priority principle.

(4) As the two-stage decomposition-dynamic programming aggregation method firstly takes optimal operation calculation for single pump unit with adjustable-blade by means of dynamic programming, after which the general coordination of water quantity by means of the aggregation model is taken, we could obtain optimal operation mode under the different blade angles of each pump unit in the same time period. Therefore, this method is suitable for solving the optimal daily operation problems of parallel pumping stations with different daily average heads, different time period divisions and different adjustable mode of pump unit in each pumping station.

3 Conclusion

Two-stage decomposition-dynamic programming aggregation method is first put forward to solve the optimal mathematical model of daily operation for multi-units with adjustable-blade in parallel pumping stations, by which the notable optimization results could be obtained. This method has a general guiding significance for the optimization problems of complex nonlinear mathematical models which are similar to eq. (1)~(3), and could solve the optimal daily operation problems of parallel pumping stations with different daily average heads, different time period divisions and different adjustable mode of pump unit in each pumping station. Besides, a set of optimal operation schemes of parallel pumping stations under different daily average heads and operation loads have been established by means of calculatiing typical parallel pumping stations, which could offer references for the optimal operation of parallel pumping stations with small daily average head amplitude, and also make the study basis for the optimal operation for multi-stage pumping stations.

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