## OPEN ACCESS

## Edited by:

Shiwei Yu,
China University of Geosciences Wuhan, China

## Reviewed by:

Yunfei Mu, Tianjin University, China Hongxun Hui, University of Macau, China

## *Correspondence:

Xiuyu Yang yangxiuyu2011@163.com

## Specialty section:

This article was submitted to Sustainable Energy Systems and Policies,
a section of the journal
Frontiers in Energy Research
Received: 29 March 2022
Accepted: 03 May 2022
Published: 20 June 2022

## Citation:

Yan G, Liu X, Yang X, Chai G, Guo Q and Gui J (2022) Combined Source-Storage-Transmission Planning Considering the Comprehensive Incomes of Energy Storage System. Front. Energy Res. 10:907338. doi: 10.3389/fenrg.2022.907338

# Combined <br> Source-Storage-Transmission Planning Considering the Comprehensive Incomes of Energy Storage System 

Gangui Yan ${ }^{1}$, Xueyuan Liu ${ }^{1}$, Xiuyu Yang ${ }^{1 *}$, Guofeng Chai ${ }^{2}$, Qi Guo ${ }^{1}$ and Jianzhong Gui ${ }^{3}$<br>${ }^{1}$ Key Laboratory of Modern Power System Simulation and Control and Renewable Energy Technology, (Northeast Electric Power University), Jilin, China, ${ }^{2}$ Northeast Electric Power Design Institute Company Limited of China Power Engineering Consulting Group, Changchun, China, ${ }^{3}$ School of Electrical and Computer Engineering, the University of Idaho, Moscow, ID, United States


#### Abstract

An energy storage system transfers power and energy in both time and space dimensions and is considered as critical technique support to realize high permeability of renewable energy in future power systems. It contributes to the achievement of China's long-term carbon emission abatement targets. However, the promotion and application of energy storage are severely restricted due to the high construction cost of energy storage systems and lack of effective compensation mechanisms for peak-regulating ancillary service. In this study, a source-storage-transmission joint planning method is proposed considering the comprehensive incomes of energy storage. The comprehensive income of the energy storage system is divided in detail from the planning level, and the accounting method of energy storage income is proposed. Based on the load fluctuating trend under the condition of the connecting wind power grid, the dynamic electricity pricing methods of power trisection and time trisection are introduced to achieve the dual goals of direct income from energy storage and improving system flexibility. To comprehensively consider the direct income of peak-valley arbitrage and indirect income of energy storage configuration, a coordinated planning model of source-storage-transmission is constructed and tested in the Garver-6 system using the measured data from one province grid in China. The results verify the effectiveness of the proposed methods and show improvements in cost recovery and system flexibility.


Keywords: energy storage, comprehensive incomes, flexibility, dynamic electricity price, source-storage-
transmission

## 1 INTRODUCTION

Vigorously developing renewable energy power generation is an effective remedy to reduce the dependence on fossil fuel energy and achieve a sustainable society (Chen et al., 2022). The total installed capacity of wind and solar power is expected to exceed 1.2 billion kW by 2030 , with nonfossil energy accounting for 80 percent of primary energy by 2060 (Jiang et al., 2018; Aktar et al., 2021). Due to the volatility and uncertainty of renewable energy output, the high proportion of grid connection will put forward higher requirements for the supply and demand balance of power
system flexibility. Energy storage has many technical characteristics such as energy storage capacity, controllability, and flexible installation. Its large-scale application can better solve the problem of system flexibility imbalance after highproportion renewable energy access. Energy storage is an important technical support for future high-proportion renewable energy power systems (Zhang et al., 2018; Heggarty et al., 2019; Zhai et al., 2020). However, the high cost of energy storage and the lack of a comprehensive income accounting mechanism seriously restrict the popularization and application of energy storage. Speeding up the development of energy storage technology to reduce costs and building a power market mechanism that fully considers the effectiveness of energy storage is the key to promoting large-scale investment in energy storage. Therefore, the establishment of an accounting mechanism considering the comprehensive incomes of energy storage is of great significance to the source-storage-transmission coordination planning in high-proportion renewable energy power systems.

In order to cope with the lack of flexibility caused by largescale renewable energy integration, many scholars have made a series of valuable studies on the optimal allocation of energy storage, the joint planning of energy storage and transmission networks, and the coordinated planning of source-storagenetworks. In terms of optimal allocation of energy storage, (Liu Y. et al., 2021) proposed an optimization method of energy storage capacity allocation for wind power cluster based on the ant lion algorithm, aiming at maximizing the income of wind power cluster and energy storage. (Sun et al., 2020) considered both planning and operation aspects of energy storage and proposed a storage configuration scheme that is both economically and flexibly optimal. (Sadeghian et al., 2020) proposed an optimal allocation method of energy storage based on the conditional risk value to improve the economy of energy storage layout in virtual power plants. (Zhao et al., 2021) constructed the optimal allocation model of microgrid cluster and took the minimum operation cost of energy storage as the dynamic optimization strategy of operation cost, so as to achieve the purpose of minimizing the total cost. (Cai et al., 2019) proposed an optimal allocation method of battery energy storage systems considering the comprehensive incomes of energy storage systems in electric networks. (Cui et al., 2016) considered the economic incomes of the energy storage system in terms of peak-valley arbitrage and proposed the energy storage control strategy based on the feasible region of photovoltaic acceptance. (Tang et al., 2019) took energy storage as the upper decision-maker and constructed the comprehensive income index of energy storage. The comprehensive income mainly considers the peak and valley price arbitrage and government subsidies. Finally, a bi-level optimal configuration model of the distributed energy storage system in the distribution network with the participation of aggregators is proposed. In terms of the joint planning of energy storage and transmission networks, (Jorgenson et al., 2018) compared and analyzed the respective effects of energy storage configuration and transmission network coordinated planning on reducing wind curtailment and light curtailment and found that the
coordination planning of the two was superior to the mitigation effect of their respective planning. (Bustos et al., 2018) established a transmission expansion planning model to verify the various functions of energy storage and transmission networks from the perspective of wind power reduction. It is concluded that energy storage is not only a supplement to transmission lines but also an alternative to transmission lines, and the comprehensive effect of transmission lines and energy storage is better. (Liu W. et al., 2021) established the relevant revenue models from the grid side and the power market, power supply reliability, and power supply side and proposed an optimal allocation method of energy storage for incremental distribution systems based on the intelligent generation method of operation strategy. (Dvorkin et al., 2018) incorporated peak-valley arbitrage into the three-layer optimization model of energy storage, transmission networks, and market clearing to realize the joint planning of electrochemical energy storage capacity, power, and location with transmission networks. (Sun et al., 2021) analyzed the multiple incomes of energy storage from the power grid planning and operation level and constructed a multi-stage joint planning model of energy storage and transmission, so as to maximize the resource efficiency in the joint planning of energy storage and power grids. (Yang L. et al., 2020) proposed a robust chance-constrained programming model with the constraint of the wind curtailment rate to minimize the investment cost of energy storage. In terms of source-reservoir-network coordination planning, (Yang X. et al., 2020; Jiang et al., 2021) established the source-storage-grid joint planning model with the goal of minimizing the total investment cost of the system. (Jiang et al., 2021) comprehensively considered the renewable energy planning and the inter-regional interconnection income of power. (Yang X. et al., 2020) mainly considered the supply and demand balance of system flexibility and considered the influence of energy storage configuration on power supply and power grids. However, the above studies mainly focus on the planning and operation of energy storage and only optimize the allocation for the purpose of minimizing the investment or maximizing the total revenue of energy storage. These studies do not consider that the role of energy storage in the grid side and the power side is complex and simultaneous, and the revenue of energy storage is not calculated from many aspects. At the same time, due to the inadaptability of fixed time-of-use price caused by high proportion of wind power integration, the income accounting of energy storage cannot be scientifically and accurately carried out (Zhong et al., 2013), which seriously affects the application of energy storage in power systems.

Therefore, this work studies the source-storage-network joint planning method considering the comprehensive income of energy storage. First, considering the low return rate of energy storage, the income of the energy storage system is divided in detail from the planning level, and the accounting method of energy storage income is proposed. Second, considering the inadaptability of the original time-of-use electricity price after the renewable energy is connected to the grid, two dynamic electricity price formulation methods are proposed, named power trisection and time trisection. Then, a source-storagetransmission coordination planning model with peak-valley
arbitrage as the direct income and the indirect income of the impact of energy storage allocation on the system is constructed. Finally, the effectiveness and economy of the proposed method are verified by Garver-6 system example analysis and comparative analysis with fixed time-of-use electricity price planning and conventional source-storage-transmission planning.

The main contributions of this study are as follows:
(1) From the perspective of comprehensive accounting of energy storage incomes, the accounting method of direct and indirect incomes of energy storage is proposed, which effectively solves the problem of low efficiency of energy storage cost recovery;
(2) Two dynamic pricing methods of power trisection and time trisection based on wind power fluctuation are proposed. The direct income of energy storage and the flexibility of the power system are improved at the same time.
(3) A source-storage-transmission coordinated planning model to maximize the comprehensive income of energy storage is constructed, which can comprehensively calculate the income of energy storage, promote the investment of energy storage in planning, improve the flexibility and supply capacity of the system, and solve the problem of low income of energy storage enterprises to a certain extent.

## The rest of the article is organized as follows:

Section 2 describes, in detail, the accounting method for the comprehensive revenue of the energy storage system. Section 3 introduces the strategy of dynamic electricity price formulation and verifies the effectiveness of the method in this work through a case study. Section 4 constructs a source-storage-transmission planning model considering the comprehensive revenue of energy storage. The effectiveness and economy of the source-storage-transmission coordinated optimization method are verified by simulation results. Finally, Section 5 concludes the article.

## 2 COMPREHENSIVE INCOME ANALYSIS OF ENERGY STORAGE SYSTEM

Energy storage systems have different applications in all aspects of power generation, transmission, electric distribution, and consumption in the power system. Therefore, considering only the peak-to-valley arbitrage of energy storage will be difficult to cover the economic incomes generated by energy storage in each link. This study sorts out the energy storage incomes from the planning level and divides the comprehensive incomes of energy storage into direct income and indirect income.

### 2.1 Direct Income

The direct income of energy storage is mainly the use of time-ofuse electricity prices for peak-to-valley arbitrage. The direct income of energy storage is mainly peak-to-valley arbitrage using time-sharing electricity price. In the planning stage, peak-to-valley arbitrage is the simplest and most direct


FIGURE 1 | Schematic diagram of peak-valley arbitrage of energy storage.
method of revenue accounting for energy storage companies. Energy storage is charged when the load is low (low electricity price) and discharged when the load is peak (high electricity price). Usually, the peak-to-valley price difference is used for profit; the schematic diagram is shown in Figure 1.

### 2.2 Indirect Income

The indirect income of energy storage is the income generated by the beneficial impact on the power system with the configuration of energy storage. To accurately account for the indirect income of energy storage, the difference method is used to solve the problem of accounting for indirect income by comparing the system costs with and without energy storage. The reduced system cost is considered as the indirect income of energy storage.

The indirect income is calculated using the difference method, and the formula is shown in Eq. $\mathbf{1}$ as follows:

$$
\begin{equation*}
f=C_{\mathrm{NES}}-C_{\mathrm{YES}} \tag{1}
\end{equation*}
$$

where $C_{\text {NES }}$ is the cost-effectiveness of technology without an energy storage system; $C_{\mathrm{YES}}$ is the cost-effectiveness of technology with an energy storage system.

Based on the above methods, it is possible to calculate the reduced investment of conventional units $\Delta C_{\mathrm{Y}}$, the reduced investment of transmission lines $\Delta C_{\mathrm{T}}$, the reduced cost of wind abandonment $\Delta C_{\mathrm{Q}}$, and the reduced cost of network loss $\Delta C_{\mathrm{L}}$. The specific calculation processes of $\Delta C_{\mathrm{Y}}, \Delta C_{\mathrm{T}}, \Delta C_{\mathrm{Q}}$, and $\Delta C_{\mathrm{L}}$ are shown in (Eqs 7-23).

## 3 DEVELOPMENT OF DYNAMIC TIME-OF-USE ELECTRICITY PRICES

### 3.1 Analysis of Peak and Valley Fluctuation Characteristics of Netload

The volatility of netload will significantly change in the power system that has a high penetration of wind power, which is mainly reflected in the weakening of the waveform law and the diffusion


FIGURE 2 | Distribution of peak and valley occurrence time.
of peak-valley distribution during the period. Figure 2 shows the peak and valley distribution of netload with different permeabilities. In the graph, the blue line segment represents the moment when the netload valley occurs and the red line segment represents the moment when the netload peak occurs. It can be seen that with the increase in wind power permeability, the peak-valley distribution will become more and more diffused. Therefore, peak and valley electricity prices based on load fluctuations are becoming less and less applicable as wind power penetration rises.

### 3.2 Dynamic Peak-Valley Pricing Method

With the access of large-scale renewable energy to the power system, the trend of netload fluctuations is changeable and the regularity is weakened. There is a need to formulate dynamic time-of-use electricity prices based on the features of netload fluctuation. The following are the two methods named the power trisection method and the time trisection method.

### 3.21 Power Trisection Method

The power trisection method is to divide the peak-to-valley value of the netload into three equal parts using the day as a time scale, and the three parts are from high to low, corresponding to the peak, flat, and valley power values. The power trisection method calculation formula is shown in Eq. 2 as follows:

$$
\left\{\begin{array}{l}
\Delta P=\left(P_{\max }-P_{\min }\right) / 3  \tag{2}\\
L_{1}=P_{\text {net }-\min }+\Delta P \\
L_{2}=P_{\text {net }-\min }+2 \Delta P
\end{array}\right.
$$

where $P_{\max }$ and $P_{\min }$ are the maximum and minimum netload, respectively. $\Delta \mathrm{P}$ is the average power value after the trisection. $L_{1}$ and $L_{2}$ are the three bisectrix lines in the netload fluctuation range.

The formula for power at $t$ time judgment is as follows:

$$
\left\{\begin{array}{l}
T_{1}=\operatorname{sgn}\left(L_{2}<P(t)<P_{\max }\right)  \tag{3}\\
T_{2}=\operatorname{sgn}\left(L_{1}<P(t)<L_{2}\right) \\
T_{3}=\operatorname{sgn}\left(P_{\min }<P(t)<L_{1}\right)
\end{array}\right.
$$

where $T_{1}, T_{2}$, and $T_{3}$ are the electricity price time at the peak, at the flat, and at the valley. sgn is the symbol function, namely, the bracket judgment established returns 1 ; otherwise, it returns 0 .

This principle of this formulation is shown in Figure 3. The netload curve for 1 day is shown in Figure 3A, with the power values ordered from the largest to the smallest. The range of power value is divided into three equal parts, from the largest to the smallest to the peak $\left(P_{\max }-L_{2}\right)$, flat $\left(L_{2}-L_{1}\right)$, and valley $\left(L_{1}-P_{\min }\right)$. The curve is shown in Figure 3B. According to the above, the period corresponding to the netload portion of the $P_{\max }-L_{2}$ scale is defined as the peak electricity price. Similarly, the period corresponding to the $L_{2}-L_{1}$ scale is referred to as the flat electricity price, and the period corresponding to the period within the $L_{1}-P_{\min }$ scale is defined as the valley electricity price. The results are shown in Figure 3C. The sorted netload curve and electricity price curve are reordered according to time, and the final results are shown in Figure 3D.

### 3.2.2 Time Trisection Method

The time trisection method is for sorting the netload power values from the largest to the smallest, generating a continuous power curve and dividing the entire time of the day into three equal parts. The corresponding power segments are defined as the peak, valley, and


FIGURE 3 | Dynamic electricity price-setting method of power trisection.


FIGURE 4 | Dynamic electricity price-setting method of time trisection.
flat. The corresponding power segments are defined as the peak, flat, and valley. The formula for power at t time judgment is as follows:

$$
\left\{\begin{array}{l}
T_{1}=\operatorname{sgn}\left(P_{T 1}<P(t)<P_{\max }\right)  \tag{4}\\
T_{2}=\operatorname{sgn}\left(P_{T 2}<P(t)<P_{T 1}\right) \\
T_{3}=\operatorname{sgn}\left(P_{\min }<P(t)<P_{T 2}\right)
\end{array}\right.
$$

where $P_{\mathrm{T} 1}$ and $P_{\mathrm{T} 2}$ are the points of intersection of the time trisection line and the continuous power netload curve. $T_{1}, T_{2}$, and $T_{3}$ are the electricity price at peak time, at flat time, and at valley time, severally.

The principle of the time trisection method is shown in Figure 4. Figure 4A shows the netload curve for 1 day. The
power values are sorted from the largest to the smallest. The range of the whole time is divided into three equal parts, from the largest to the smallest, peak $\left(P_{\max }-P_{\mathrm{T} 1}\right)$, flat $\left(P_{\mathrm{T} 1}-P_{\mathrm{T} 2}\right)$, and valley $\left(P_{\mathrm{T} 2}-P_{\min }\right)$. The curves are shown in Figure 4B. According to the above, the netload portion of $P_{\text {max }}-P_{\mathrm{T} 1}$ corresponds to the time of peak electricity price. Similarly, the time corresponding to the netload portion of $P_{\mathrm{T} 1}-P_{\mathrm{T} 2}$ is the flat electricity price, and the time corresponding to the netload portion of $P_{\mathrm{T} 2}-P_{\min }$ is the valley electricity price. The results are shown in Figure 4C. The sorted netload curve and electricity price curve are reordered according to time, and the final results are shown in Figure 4D.

TABLE 1 | Statistics of netload characteristics under different permeability and different time-of-use electricity prices.

| (\%) | Indicators | Original netload | $\begin{array}{c}\text { Fixed time-of-use } \\ \text { electricity price }\end{array}$ | $\begin{array}{c}\text { Power trisection } \\ \text { method }\end{array}$ |
| :--- | :--- | :---: | :---: | :---: |
| 0 | The wind abandonment rate | $0 \%$ | $0 \%$ | $0 \%$ |
| Time trisection |  |  |  |  |
| method |  |  |  |  |$]$

### 3.2.3 Validity Check of Dynamic Time-of-Use Electricity Price

In verifying the effectiveness of dynamic electricity price based on power trisection and time trisection, it is necessary to compare and analyze the impact of energy storage peak valley arbitrage on the netload curve under different electricity price strategies. Under the same capacity and power, the storage energy is discharged at the peak price and charged at the valley price, to make a profit. First, the netload curve under different wind power permeability is arbitraged with different electricity price formulation strategies. Then, the changes of the abandoned wind rate, peak-to-valley difference, and maximum value of netload curve after peak valley arbitrage are analyzed. The effect of dynamic time-of-use price on reducing wind abandonment, peak shaving, and valley filling is verified through quantitative calculation. The specific calculation conditions are described as follows: typical daily electricity consumption is 9067 MWh and the maximum power is 470 MW. For example, when the energy storage power is 200 MW and the storage capacity is 400 MW h , the calculation results are shown in Table 1, Supplementary Table S1, and Supplementary Figure S1. Table 1 shows the effects of different electricity price strategies on the wind abandonment rate, peak valley difference, and maximum value when the wind power permeability is $0.40 \%$. Supplementary Figure S1 and Supplementary Table S1 show the time-of-use electricity price, netload curves, and statistical results before and after energy storage arbitrage in four scenarios with daily wind power penetration rates of $0,20,40$, and $60 \%$.

With the increase in permeability, the peak-valley difference of fixed price will continue to increase. After the peak-valley arbitrage of energy storage, the abandonment rate will increase with the increase in permeability. This also shows that with the increase in permeability, the inadaptability of fixed time-of-use electricity price will further deteriorate. However, methods the article proposed for the dynamic electricity price can significantly reduce the wind abandonment rate, the peak valley difference, and the maximum netload.

## 4 PLANNING MODEL OF SOURCE-STORAGE-TRANSMISSION CONSIDERING THE COMPREHENSIVE INCOME OF ENERGY STORAGE

### 4.1 Objective Function

The coordinated source-storage-transmission optimization model that considers the comprehensive income $s$ of energy
storage is to maximize the total income s (direct income and indirect income) of the power grid with the storage system. The objective function is shown in Eq. 5.

$$
\begin{equation*}
\mathrm{F}=\max \left\{\left(\Delta C_{\mathrm{Y}}+\Delta C_{\mathrm{T}}+\Delta C_{\mathrm{Q}}+\Delta C_{\mathrm{L}}\right)+C_{\mathrm{pva}}-I_{e s s}\right\} \tag{5}
\end{equation*}
$$

where $C_{\mathrm{pva}}$ is the peak-to-valley arbitrage income of the dynamic time-of-use electricity price. $\Delta C_{Y}$ is the indirect income of the energy storage system in the power supply planning, namely, the difference between the investment cost of the new power source before and after the energy storage used on the power supply side. $\Delta C_{\mathrm{T}}$ in the plan is the difference between the investment cost of the new transmission line before and after the energy storage applied on the grid side. $\Delta C_{\mathrm{Q}}$ is the difference between the cost of wind abandonment before and after using the energy storage. $\Delta C_{\mathrm{L}}$ is the difference between the cost of network loss before and after using the energy storage. $I_{\text {ess }}$ is the investment cost of the energy storage system.

### 4.1.1 Direct Income

Direct income (peak-valley arbitrage) $C_{\text {pva }}$ is calculated in Eq. 6 as follows:

$$
\begin{equation*}
C_{\mathrm{pva}}=\sum_{i}^{365}\left(W_{\mathrm{v}-i} \times \beta \times C_{\mathrm{p}}-W_{\mathrm{p}-i} \times C_{v}\right) \tag{6}
\end{equation*}
$$

where $W_{\mathrm{v}-\mathrm{i}}$ is the charged power of energy storage during the load valley on the $i$ th day. $W_{\mathrm{p}-\mathrm{i}}$ is the charged power of energy storage during the load peak on the $i$ th day. $\beta$ is the energy storage efficiency. $C_{\mathrm{p}}$ is the electricity price at the peak load. $C_{\mathrm{v}}$ is the electricity price at the load valley.

### 4.1.2 Reducing Investment in Conventional Units

The $\Delta C_{\mathrm{Y}}$ is calculated by reducing the investment of conventional units:

$$
\begin{equation*}
\Delta C_{Y}=C_{Y}-C_{Y N} \tag{7}
\end{equation*}
$$

The formulas for calculating the cost of power planning before and after the application of energy storage are shown as follows:

$$
\begin{gather*}
C_{Y}=\sum_{k \in \Omega_{g}} G_{k} P_{g k} C_{g k}  \tag{8}\\
C_{Y N}=\sum_{k \in \Omega_{g}} G_{k} P_{g k N} C_{g k}  \tag{9}\\
P_{g k N}=\max \left\{P_{E S S}(t)+P_{L}(t)\right\} \tag{10}
\end{gather*}
$$

where $C_{Y}$ is the investment cost of the original boundary power supply planning. $C_{\mathrm{YN}}$ is the investment cost of the power supply planning after the energy storage used. $G_{\mathrm{k}}$ is the investment 0,1 variable of the thermal power unit $k . P_{\mathrm{gk}}$ is the installed capacity of the unit $\mathrm{k} . C_{\mathrm{gk}}$ is the project cost of installing this capacity of the unit $k . W_{\mathrm{g}}$ is the selected unit set. $P_{\mathrm{gkN}}$ is the installed capacity of the unit k after the application of energy storage. $P_{\mathrm{ESS}}(\mathrm{t})$ is the power at time t of energy storage, and $P_{L}(\mathrm{t})$ is the load at time t .

### 4.1.3 Reducing Investment in Transmission Lines

The $\Delta C_{\mathrm{T}}$ is calculated by reducing the investment in transmission lines as shown in Eq. 11.

$$
\begin{equation*}
\Delta C_{T}=C_{T}-C_{T N} \tag{11}
\end{equation*}
$$

The planning boundary before configuring energy storage is the maximum load, and the calculation formula is shown in Eq. 12 as follows:

$$
\begin{equation*}
P_{L}=\max \left\{P_{L i}(t)\right\} \tag{12}
\end{equation*}
$$

$\mathrm{P}_{L i}(\mathrm{t})$ is the load of node $i$ at time t , and $\mathrm{P}_{\mathrm{L}}$ is the planning boundary.

The planning boundary after energy storage configured is the maximum value of the corrected netload, and the calculation formulas are shown as follows:

$$
\begin{align*}
P_{L N} & =\max \left\{P_{L N i}(t)\right\}  \tag{13}\\
P_{L N i}(t) & =k_{i} P_{E S S}(t)+P_{L i}(t) \tag{14}
\end{align*}
$$

$P_{L N}$ is the planning boundary after energy storage configured, $\mathrm{P}_{\mathrm{LNi}}(\mathrm{t})$ is the corrected load of node $i$ at time $\mathrm{t}, \mathrm{P}_{\mathrm{ESS}}(\mathrm{t})$ is the power of storage energy at time t , and $k_{\mathrm{i}}$ is the proportion of overall energy storage configuration at node $i$.

The planning and construction cost of the transmission grid before and after the energy storage invested is consistent with the formula in Eq. 15:

$$
\begin{equation*}
C_{T}=\sum_{i \in \Omega_{1}} n_{i-j} K_{\mathrm{L}} P_{i-j} L_{i-j} Z_{i-j} \tag{15}
\end{equation*}
$$

where $C_{\mathrm{T}}$ is the investment cost of the transmission line under the original boundary. $C_{\mathrm{TN}}$ is the investment cost of the transmission line after the energy storage is applied. $n_{i}$ is the number of construction times of the $i$ th candidate line. $C_{i}$ is the per unit length price of the $i$ th candidate line. $K_{\mathrm{L}}$ is the power cost per unit length line. $L_{i}$ is the length of the $i$ th candidate line. $Z_{i}$ is the $0-1$ decision variable for the investment of the $i$ th candidate line. $P_{\mathrm{L}-i}$ is the transmission capacity of the $i$ th candidate line. $W_{1}$ is the collection of the candidate lines.

### 4.1.4 Reducing Wind Curtailment Costs

The reduced wind curtailment cost is set as $\Delta C_{\mathrm{Q}}$, which is calculated in Eq. 16:

$$
\begin{equation*}
\Delta C_{Q}=C_{Q}-C_{Q N} \tag{16}
\end{equation*}
$$

where $C_{Q}$ is the cost of system wind abandonment before energy storage is used. $C_{\mathrm{QN}}$ is the cost of system wind abandonment after energy storage is used.

The cost of wind curtailment is calculated in Eq. 17:

$$
\begin{equation*}
C_{Q}=W_{Q} K_{Q} T_{S} \tag{17}
\end{equation*}
$$

where $K_{\mathrm{Q}}$ is the unit penalty cost of abandoned wind power. $T_{\mathrm{s}}$ is the cost recovery period. $W_{Q}$ is the abandoned wind power before energy storage is used, and $W_{\mathrm{QN}}$ is the abandoned wind power after energy storage is used.

The equation of the annual wind power curtailment before the energy storage is put into use is constructed in Eq. 18:

$$
W_{Q}= \begin{cases}\sum\left[\int_{t}^{\tau}\left(P_{g}^{\min }-P_{n e t}(t)\right) d t\right] & , P_{\text {net }}(t) \leq P_{g}^{\min }  \tag{18}\\ 0 & , P_{\text {net }}(t) \geq P_{g}^{\min }\end{cases}
$$

The calculation of the annual wind power curtailment after the energy storage is put into operation is shown in Eq. 19 as follows:

$$
W_{\mathrm{QN}}= \begin{cases}\sum\left\{\int_{t}^{\tau}\binom{P_{g}^{\min }-P_{\text {ess }}(t)}{-P_{\text {net }}(t)} d t\right\} & , P_{\text {net }}(t) \leq P_{g}^{\min }  \tag{19}\\ 0 & , P_{\text {net }}(t) \geq P_{g}^{\min }\end{cases}
$$

where $P_{\text {net }}(\mathrm{t})$ is the netload at time $\mathrm{t} . P_{\text {ess }}(\mathrm{t})$ is the output power of energy storage at time t . $P$ min $g$ is the minimum technical output of conventional units.

### 4.1.5 Reducing Network Loss Costs

After configuring the energy storage system, peak-shaving and valley-filling are used to improve the power flow distribution in the power grid and reduce the cost caused by power grid losses. This cost of grid loss is calculated as follows:

$$
\begin{equation*}
\Delta C_{\mathrm{L}}=C_{\mathrm{L}}-C_{\mathrm{LN}} \tag{20}
\end{equation*}
$$

The power loss of the power grid is calculated by using the node equivalent power method shown in Eq. 21:

$$
\begin{equation*}
I^{2}(t)=P^{2}(t) /(U \cos \alpha)^{2} \tag{21}
\end{equation*}
$$

According to Equation 21, the calculation for line loss cost before applying energy storage is shown in Eqs. 22 and 23:

$$
\begin{align*}
& C_{\mathrm{L}}=\sum_{1}^{n} \sum_{1}^{8760} I_{i}^{2}(t) R_{i} e(t)=\sum_{1}^{n} \sum_{1}^{8760} \frac{P_{i}(t)^{2}}{U_{i}(t)^{2} \cos ^{2} \alpha} R_{i} e(t)  \tag{22}\\
& C_{L N}=\sum_{i}^{n} \sum_{1}^{8760}\left[I_{i}(t)+I_{e s s-i}(t)\right]^{2} R_{i} e(t) \\
&=\sum_{i}^{n} \sum_{1}^{8760} \frac{\left[P_{i}(t)+P_{e s s-i}(t)\right]^{2}}{U_{i}^{2}(t) \cos ^{2} \alpha} R_{i} e(t) \tag{23}
\end{align*}
$$

where $n$ is the number of system nodes. $I_{i}(\mathrm{t})$ is the electric current at the $i$ th node at time $t . P_{i}(\mathrm{t})$ is the active load power at the $i$ th node at time $t . U_{i}(\mathrm{t})$ is the voltage at the $i$ th node at time $t . \cos \alpha$ is the power factor. $R_{i}$ is the $i$ th node. $I_{\text {ess }-i}(\mathrm{t})$ is the electric current of the energy storage system on the $i$ th node at time $t . P_{\text {ess-i }}(\mathrm{t})$ is the active output power of the energy storage system on the $i$ th node at time $t . e(\mathrm{t})$ is the grid electricity price at the time $t$ in the system.


FIGURE 5 | Schematic block diagram of the source-storage-transmission coordinated planning method considering comprehensive incomes of energy storage.

### 4.2 Restrictions

### 4.2.1 Power Balance Constraint

The power balance constraints are shown in Eq. 24:

$$
\begin{equation*}
\sum_{k} P_{\mathrm{gk}}(t)+P_{\mathrm{w}}(t)+P_{\text {ess }}(t)+\Delta P_{\mathrm{Q}}(t)+\Delta P_{\text {loss }}(t)=P_{\mathrm{L}}(t) \tag{24}
\end{equation*}
$$

where $\sum P_{\mathrm{gk}}(t)$ is the output of all thermal power units at time $t$. $P_{\mathrm{w}}(t)$ is the output power of wind power generation at time $t$. $P_{\text {ess }}(t)$ is the output power of energy storage at time $t . \Delta P_{\mathrm{Q}}(t)$ is the abandonment power at time $t . \Delta P_{\text {loss }}(t)$ is the power loss at time $t$. $P_{\mathrm{L}}(t)$ is the total system load power at time $t$.

### 4.2.2 The Upper and Lower Limits of the Output of Thermal Power Units

The output limits of thermal power units are shown in Eq. 25:

$$
\begin{equation*}
P_{\mathrm{gk}}^{\min } \leq P_{\mathrm{gk}}(t) \leq P_{\mathrm{gk}}^{\max } \tag{25}
\end{equation*}
$$

### 4.2.3 The State of Charge (SOC) of Full Charge and Discharge Constraints for Using the Energy Storage System

The SOC limits of using the energy storage system are shown in Eq. 26:

$$
\left\{\begin{array}{l}
\delta_{\mathrm{SOC} \text { min }} \leq \delta_{\mathrm{SOC}}(t) \leq \delta_{\mathrm{SOCmax}}  \tag{26}\\
\delta_{\mathrm{SOC}}(0)=\delta_{\mathrm{SOC}}(24)
\end{array}\right.
$$

where $\delta_{\text {SOCmin }}$ and $\delta_{\text {SOCmax }}$ are the lower limit and upper limit of the SOC of the energy storage device, respectively. $\delta_{\mathrm{SOC}}(0)$ and $\delta_{\text {soc }}(24)$ are the states of charge of the energy storage device at times 0 and 24 , respectively, and both are equal.

TABLE 2 | Planning scheme of the power grid side without energy storage input.

| Power side thermal <br> power installed capacity <br> (MW) | The installed cost (yuan) | New lines on the <br> grid side |
| :--- | :--- | :--- |
| 690 | 3.45 billion | Cost of the new <br> line (yuan) |

TABLE 3 | Source-storage-transmission planning scheme under power trisection strategy.

| Project | Cost and allocation |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Peak and valley arbitrage | 4.39 billion yuan |  |  |  |  |
| Reduced wind abandonment | Energy storage reduces wind curtailment 105,634.4 MW h/year |  | Reduced $1.75 \text { billic }$ | for aban |  |
| Reduced investment in thermal power | 0.677 billion yuan |  |  |  |  |
| Reduced transmission investment | 40 million yuan |  |  |  |  |
| Reduced network loss | Reduced power loss on the network 414 MW h/year |  | Reduce 32 millio | the netwo |  |
| Energy storage configuration | Energy storage capacity 760 MW h |  | Converter 210 MW |  |  |
| Energy storage investment cost | 2.385 billion yuan |  |  |  |  |
| Energy storage layout | Node 1 Node 2 <br> $16 \%$ $9 \%$ | $\begin{aligned} & \text { Node } 3 \\ & 28 \% \end{aligned}$ | Node 4 20\% | Node 5 <br> 8\% | Node 6 20\% |
| Power network planning scheme | 1-5(1), 2-3(3), 3-5(2), 2-6(2), 4-6(2) |  |  |  |  |
| Comprehensive incomes of energy storage | 4.511 billion yuan |  |  |  |  |

Power network planning scheme
1-5(1), 2-3(3), 3-5(2), 2-6(2), 4-6(2)
Comprehensive incomes of energy storage

### 4.2.4 Line Flow Constraint

The limits of line flow are shown in (27):

$$
\begin{equation*}
P_{i-j} \leq a_{i-j} P_{i-j, \max } \tag{27}
\end{equation*}
$$

where $a_{i, j}$ is the load rate on the transmission line from node $i$ to node $j$, and its value range is $a_{i-j} \in(0,1] . P_{i-j}$ is the transmitting power in the transmission line from node $i$ to node $j$, and $P_{i-j, \text { max }}$ is the maximum value of the line transmission capacity.

### 4.3 Solution Process of the Source-Storage-Transmission Planning Model Considering Comprehensive Income of Energy Storage

Based on the given annually planned target load, there are two categories generated due to the indirect income of energy storage calculated using different methods. The specific solution process is shown in Figure 5.

One is that the original boundary is applied in planning conditions without energy storage. In this case, the construction costs on source side $C_{Y}$ and grid side $C_{T}$ are calculated directly. The wind abandonment $\operatorname{cost} C_{\mathrm{Q}}$ and the grid loss cost $C_{\mathrm{L}}$ are obtained through the production sequence simulation.

Another one is that the source-storage-grid planning is coordinated with energy storage processed in the following steps. The first step is to formulate the dynamic time-of-use electricity price for each typical daily scenario based on wind power and load data. The second step is to provide the initial values of the energy storage configuration and the dynamic timesharing electricity price strategy. The direct income of the energy


FIGURE 6 | Power grid planning scheme under power trisection.
storage system is obtained after the time series simulation, and a new planning boundary is generated. The third step is to conduct power planning within the new planning boundary to calculate the power planning construction cost $C_{\mathrm{YN}}$ and to carry out the site and capacity selection of the energy storage system used in grid planning. In this way, the power grid planning and construction cost $C_{\mathrm{TN}}$ are obtained. Finally, a production simulation is performed to obtain the abandonment cost $C_{\mathrm{QN}}$ and network loss cost $C_{\mathrm{LN}}$. The indirect income of energy storage is calculated using the difference method, and the comprehensive income accounting of energy storage is completed. If the


FIGURE 7 |Optimal process of coordinated planning of source-storagetransmission under dynamic time-of-use; electricity price based on the power trisection method.

comprehensive income is the maximum value, it is the optimal solution and outputs the final planning scheme; if the integrated return is not the maximum value, the energy storage configuration is corrected and returned to the second step for recalculation until the optimal scheme of source-storagetransmission planning considering the integrated return of energy storage is derived.

## 5 CASE STUDY

### 5.1 Basic Data

To verify the effectiveness of the proposed source-storagetransmission coordination optimization method that considers the comprehensive incomes of energy storage, the planning model is performed in the Garver-6 system that matches the measured data of a certain power grid in Northeast China. In this data system, the total real load power is 710 MW , and the installed capacity of wind power at Node 6 is 2000 MW , which reaches $30 \%$ wind power penetration. The total system load, typical scenarios, and corresponding probabilities of wind power are shown in Supplementary Figure S2 and Supplementary Table S2. The topology and parameters of the Garver-6 system are shown in Supplementary Table S3 and Supplementary Figure S3. The typical load scenarios of five nodes are shown in Supplementary Figure S4.

The specific calculation conditions are described as follows:
(1) The construction cost of thermal power unit: 5 million yuan/MW;
(2) The penalty cost of abandoning wind power is 830 yuan/MW.h;
(3) The unit capacity cost of energy storage is 1.5 million yuan/ MW. The converter cost per megawatt is 250,000 yuan, and the life span of energy storage is 10 years;
(4) The capacity and length cost of the $220-\mathrm{kV}$ transmission line is 10,000 yuan/(MWkm);
(5) The planning cycle is 20 years
(6) The setting categories of time-of-use electricity prices are as follows: the peak hour electricity price is 1.42 yuan $/ \mathrm{kW} . \mathrm{h}$.

TABLE 4 | Source-storage-transmission planning under the time trisection strategy.

## Project

Cost and allocation

| Peak and valley arbitrage | 5.117 billion yuan |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Reduced wind abandonment | Energy storage reduces wind curtailment 109,778 MW h/year |  |  | Reduced the penalty for abandoning wind 1.822 billion yuan |  |  |
| Reduced investment in thermal power | 0.794 billion yuan |  |  |  |  |  |
| Reduced transmission investment | 20 million yuan |  |  |  |  |  |
| Reduced network loss | Reduced power loss on the network |  |  | Reduce the loss of the network |  | 34 million yuan |
| Energy storage configuration | Energy storage capacity |  |  | Converter power |  |  |
| Energy storage investment cost | 2.558 billion yuan |  |  | Node 4 | Node 5 | Node 6 |
| Energy storage layout | Node 1 | Node 2 | Node 3 |  |  |  |
|  | 20\% | 14\% | 24\% | 15\% | 4\% | 23\% |
| Power network planning scheme | 1-5(3), 2-3(4), 2-4(1), 3-5(3), 3-6(1) |  |  |  |  |  |

TABLE 5 | Planning scheme under fixed time-of-use electricity price strategy.

| Project | Cost and allocation |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Peak and valley arbitrage | 3.26 billion yuan |  |  |  |  |
| Reduced wind abandonment | Energy storage reduces wind curtailment 20061 MW h/year |  | Reduced the penalty for abandoning wind 0.333 billion yuan |  |  |
| Reduced investment in thermal power | 0 billion yuan |  |  |  |  |
| Reduced transmission investment | 0 million yuan |  |  |  |  |
| Reduced network loss | Reduced power loss on the network 375.86 MW h/year |  | Reduce the loss of the network 0.302 million yuan |  |  |
| Energy storage configuration | Energy storage capacity |  | Converter power |  |  |
| Energy storage investment cost | 1.793 billion yuan |  |  |  |  |
| Energy storage layout | Node 1 Node 2 <br> $19 \%$ $28 \%$ | $\text { Node } 3$ 3\% | Node 4 20\% | Node 5 4\% | Node 6 27\% |
| Power network planning scheme | 1-5(2), 2-3(4), 3-5(3), 2-6(2), 4-6(2) |  |  |  |  |
| Comprehensive incomes of energy storage | 1.827 billion yuan |  |  |  |  |



The valley hour electricity price is 0.47 yuan $/ \mathrm{kW} . \mathrm{h}$, and the normal electricity price is 0.945 yuan $/ \mathrm{kW}$.h.

### 5.2 Source-Storage-Transmission Planning Scheme Under Different Pricing Strategies

In this study, the fixed time-sharing electricity price strategy and the two dynamic electricity price strategies are used for sourcestorage transmission coordination planning, respectively. The dynamic electricity price proposed in this study only changes the time of peak-valley leveling, the electricity price is fixed, and the change of electricity price will be added in the subsequent study.

To calculate the comprehensive incomes of energy storage based on the different price methods, it is necessary to know the planning condition and costs of the power supply and grid before and after energy storage is applied.


FIGURE 10 | Economic comparison of the three methods.

When there is no usage of energy storage, the installed capacity of thermal power on the supply side, the newly built lines on the power grid side, and the corresponding costs are shown in Table 2.

### 5.2.1 Source-Storage-Transmission Planning Scheme Under Dynamic Time-of-Use Electricity Price

After wind power is accessed, the fluctuation law of netload is greatly weakened, which is extremely different from the fluctuation law of the original load. The purpose of this study is to verify the dynamic electricity price method proposed in this study. The coordinated planning of the source-storage transmission is conducted under the dynamic time-sharing electricity price strategy generated using the power trisection method and the time trisection method, respectively.

## (1) Power Trisection Method

Dynamic electricity price is established using the power trisection method. The dynamic electricity price of each typical scene is shown in Supplementary Figure S5.

Based on the dynamic time-of-use electricity price, the coordinated planning of source-storage-transmission considering the comprehensive incomes of energy storage is carried out.

Under the power trisection dynamic time-of-use electricity price strategy, the coordinated planning of sources-storagetransmission considering the comprehensive income of energy storage is carried out. The energy storage investment cost is 2.385 billion yuan, and the peak-valley arbitrage income is 4.39 billion yuan. The thermal power installation investment is reduced by 677 million yuan, and the transmission line investment is decreased by 40 million yuan. Finally, the comprehensive income of energy storage is 4.511 billion yuan. It is shown in Table 3 and Figure 6 for the optimal planning scheme of the time-of-use electricity price strategy written using power trisection. The relationship between energy storage configuration and total comprehensive incomes is shown in Figure 7.

It can be seen from Figure 7 that plotting of energy storage configuration and comprehensive income is presented as an upconvex surface. When there is no energy storage configuration, the comprehensive income is 0 . With the increasing energy storage power and capacity configuration, the comprehensive incomes will also increase. The central point in the figure is the optimal configuration of energy storage.

## (2) Time Trisection Method

Under the time trisection dynamic time-of-use electricity price strategy, the coordinated planning of sources-storagetransmission considering the comprehensive income of energy storage is carried out. The energy storage investment cost is 2.558 billion yuan, and the peak-valley arbitrage income is 5.417 billion yuan. The thermal power installation investment is reduced by 784 million yuan and the transmission line investment is decreased by 20 million yuan. Finally, the comprehensive income of energy storage is 5.231 billion yuan.

The detailed planning scheme is shown in Table 4 and Figure 8. By comprehensively comparing the data in Table 4 and Table 5, it shows that the time trisection method is better than the power trisection method on the whole. In terms of reducing investment in thermal power and the power grid, the time trisection method increasing the comprehensive income by 720 million yuan is compared with the power trisection method.

In terms of energy storage and wind abandoning quantity reduction, the time three equal method increasing the income by 72 million yuan is compared with the power three equal methods. The reason for such a result is that the dynamic time-sharing electricity price established using the time trisection method can eliminate the problem of the mismatching of charging and discharging time of energy storage caused by the power trisection method. In other words, the dynamic time-sharing electricity value established using the power trisection method may result in unequal charging time and discharging time of energy storage and no space for charging and discharging. Typically, scenario 1 in Supplementary Figure S5 is the time-of-use electricity price established using the trisection method of power.

### 5.2.2 Planning Scheme Under Fixed Time-of-Use Electricity Price Strategy

The fixed electricity price strategy adopts the electricity price of the power grid in Northeast China. The peak hours are 8:00-11: 00 in the morning and 18:00-23:00.23:00-7:00 valley time; usually 7:00-8:00 in the morning, 11:00-18:00 afternoon. Peak valley arbitrage is carried out for valley charging and peak discharging of the energy storage system. The planning model proposed in this study is used to carry out the coordinated source-storage-transmission planning. The planning scheme is shown in Table 5 and Figure 9.

The fixed time-of-use electricity price cannot adapt to the netload fluctuations after wind power access, so the role energy storage played in peak reduction and valley filling in the arbitrage process is not effective. In this planning scheme, the reduction value of thermal power investment and transmission line investment after energy storage input is 0 .

Compared with the investment in energy storage configuration under the fixed tariff strategy, the power trisection and time trisection dynamic time-sharing tariff strategies increase by 592 million yuan and 765 billion, respectively. In addition, the peak-valley arbitrage, the reduction of abandoned wind power before and after using energy storage, thermal power investment, and transmission investment are also better than the planning scheme under the fixed tariff strategy, and the final comprehensive incomes of energy storage increase by 2.684 billion yuan and 3.404 billion yuan, respectively. The comparison of source-storagetransmission planning schemes conducted by the fixed price, power trisection, and time trisection are shown in Figure 10, which intuitively show that fixed price is not suitable for wind power access with high permeability.

## 6 CONCLUSION

This study addresses the problems of the single role of energy storage and incomplete consideration of incomes in previous planning, proposes two dynamic electricity price formulation methods, namely, power trisection and time trisection, explores the impact of fixed time-sharing electricity price and dynamic time-sharing electricity price on flexibility supply, constructs a coordinated source-storage-transmission planning method that takes into account the comprehensive incomes of energy storage, and verifies the effectiveness of the proposed method through example analysis. The main conclusions are as follows.
(1) This study proposes two dynamic electricity price methods based on netload fluctuation power trisection and time trisection, realizing that energy storage can maximize filling system flexibility in peak-valley arbitrage.
(2) This study proposes a method of accounting for the return on energy storage that takes into account direct and indirect income and demonstrates through examples that the return on investment in energy storage can be significantly increased in this accounting method, in which the cost of
wind abandonment can be reduced by 4.255 times and 4.471 times for the power trisection method and the time trisection method, respectively, compared to the investment in wind abandonment at a fixed time-sharing electricity price, and the final comprehensive return on energy storage is increased by 146.9 and $186.3 \%$, respectively.
(3) A coordinated source-storage-transmission planning method that takes into account the comprehensive incomes of energy storage can comprehensively account for the incomes of energy storage and promote the input of energy storage in planning, thereby enhancing the system's flexibility supply capacity, reducing the cost of abandoned wind, and, to a certain extent, overcoming the difficulties of energy storage enterprises.

In the formulation of dynamic electricity price rules, this study only considers the effect of the change of electricity price occurrence time on net load but does not consider the impact of the change of electricity price on it. Considering the mutual influence between demand-side response and electricity price (Zhong et al., 2013), we will plan to add the incentive coupon mechanism to induce demand-side response on the basis of the method in this study to explore the impact on the source-storagetransmission planning.

## DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/Supplementary Material; further inquiries can be directed to the corresponding authors.

## REFERENCES

Aktar, M. A., Alam, M. M., and Al-Amin, A. Q. (2021). Global Economic Crisis, Energy Use, CO2 Emissions, and Policy Roadmap amid COVID-19. Sustain. Prod. Consum. 26, 770-781. doi:10.1016/j.spc.2020.12.029
Bustos, C., Sauma, E., Torre, S., Aguado, J. A., Contreras, J., and Pozo, D. (2018). Energy Storage and Transmission Expansion Planning: Substitutes or Complements? IET Gener. Transm. \& Distrib. 12, 1738-1746. doi:10. 1049/iet-gtd.2017.0997
Cai, J., Xu, Q., Yuan, X., and Wang, X. (2019). Configuration Strategy of LargeScale Battery Storage System Orienting Wind Power Consumption Based on Temporal Scenarios. High. Volt. Eng. 45, 993-1001. doi:10.13336/j.1003-6520. hve. 20190226041
Chen, Y., Wei, W., Li, M., Chen, L., and Catalao, J. P. S. (2022). Flexibility Requirement when Tracking Renewable Power Fluctuation with Peer-To-Peer Energy Sharing. IEEE Trans. Smart Grid 13, 1113-1125. doi:10.1109/tsg.2021. 3128631
Cui, Y., Xu, B., Zhang, J., Yan, G., Wang, M., and Zheng, X. (2016). Control Strategy and Economic Evaluation of Energy Storage System Based on Feasible Area of PV Power. Acta Energiae Solaris Sin. 37, 2519-2525. doi:10.3969/j.issn. 0254-0096.2016.10.011
Dvorkin, Y., Fernandez-Blanco, R., Wang, Y., Xu, B., Kirschen, D. S., Pandzic, H., et al. (2018). Co-Planning of Investments in Transmission and Merchant Energy Storage. IEEE Trans. Power Syst. 33, 245-256. doi:10.1109/tpwrs. 2017.2705187

Heggarty, T., Bourmaud, J.-Y., Girard, R., and Kariniotakis, G. (2019). Multitemporal Assessment of Power System Flexibility Requirement. Appl. Energy 238, 1327-1336. doi:10.1016/j.apenergy.2019.01.198

## AUTHOR CONTRIBUTIONS

GY contributed to the conception of the study; XL performed the experiment and wrote the manuscript; XY contributed significantly to analysis and manuscript preparation; GC and JG performed the data analyses; QG helped perform the analysis with constructive discussions.

## FUNDING

This study was supported by the Northeastern Electric Power University Doctoral Research Start-up Fund (BSJXM-2021206) and by the National Key R\&D Program of China (2017YFB0902200).

## ACKNOWLEDGMENTS

I would like to express my sincere gratitude to Brother Xu Minghong. I was particularly moved and encouraged by his detailed comments and suggestions when revising my thesis. Without his supervision and guidance, I could not have finished the task.

## SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fenrg.2022.907338/ full\#supplementary-material

Jiang, H., Du, E., Jin, C., Xiao, J., Hou, J., and Zhang, N. (2021). Optimal Planning of Multi-Time Scale Energy Storage Capacity of Cross-National Interconnected Power System with High Proportion of Clean Energy. Proc. CSEE 41, 2101-2115. doi:10.13334/j.0258-8013.pcsee. 201634
Jiang, S., Wan, C., Wan, C., Chen, C., Cao, E., and Song, Y. (2018). Distributed Photovoltaic Generation in the Electricity Market: Status, Mode and Strategy. Csee Jpes 4, 263-272. doi:10.17775/cseejpes.2018.00600
Jorgenson, J., Denholm, P., and Mai, T. (2018). Analyzing Storage for Wind Integration in a Transmission-Constrained Power System. Appl. Energy 228, 122-129. doi:10.1016/j.apenergy.2018.06.046
Liu, W., Yang, M., Wang, J., and Teng, Y. (2021a). Energy Storage Planning for Incremental Power Distribution Systems Based on the Intellectual Generating Method of Operational Strategies. Proc. CSEE 41, 3317-3329+3658. doi:10. 13334/j.0258-8013.pcsee. 200655
Liu, Y., Wang, W., Wang, X., and Han, Y. (2021b). Optimization of Storage Capacity Allocation in Wind Farm Cluster Based on Ant Lion Optimization Algorithm. Acta Energiae Solaris Sin. 42, 431-437. doi:10.19912/j.0254-0096. tynxb.2018-0851
Sadeghian, O., Oshnoei, A., Khezri, R., and Muyeen, S. (2020). Riskconstrained Stochastic Optimal Allocation of Energy Storage System in Virtual Power Plants. J. Energy Storage 31, 101732. doi:10.1016/j.est.2020. 101732
Sun, W., Liu, W., Pei, L., Xiang, W., and Li, H. (2021). Multistage Energy StorageTransmission Network Joint Planning Considering the System Value of Energy Storage under the Background of High Penetration Renewable Energy. High. Volt. Eng. 47, 983-993. doi:10.13336/j.1003-6520.hve. 20200352
Sun, W., Song, H., Qin, Y., and Li, H. (2020). Energy Storage System Optimal Allocation Considering Flexibility Supply and Demand Uncertainty. Power Syst. Technol. 44, 4486-4497. doi:10.13335/j.1000-3673.pst.2020.0667

Tang, Q., Xu, W., Ye, X., Sheng, L., Gou, J., and Liu, Y. (2019). Optimized Configuration of Distributed Energy Storage System in Distribution Network Considering the Participation of Aggregators. Power Syst. Prot. Control 47, 83-92. doi:10.19783/j.cnki.pspc. 181270
Yang, L., Cao, Y., Wei, W., Chen, L., and Mei, S. (2020a). Configuration Method of Energy Storage for Wind Farms Considering Wind Power Uncertainty and Wind Curtailment Constraint. Automation Electr. Power Syst. 44, 45-52. doi:10.7500/AEPS20200224004
Yang, X., Mu, G., Chai, G., Yan, G., and An, J. (2020b). Source-storage-grid Integrated Planning Considering Flexible Supply-Demand Balance. Power Syst. Technol. 44, 3238-3246. doi:10.13335/j.1000-3673.pst. 2020.0753

Zhai, S., Zhou, H., Wang, Z., and He, G. (2020). Analysis of Dynamic Appliance Flexibility Considering User Behavior via Non-intrusive Load Monitoring and Deep User Modeling. Csee J. Power Energy Syst. 6, 41-51. doi:10.17775/CSEEJPES.2019.02100
Zhang, R., Jiang, T., Jiang, T., Li, G., Chen, H., Li, X., et al. (2018). Day-ahead Scheduling of Multi-Carrier Energy Systems with Multi-type Energy Storages and Wind Power. Csee Jpes 4, 283-292. doi:10.17775/cseejpes. 2017.01250

Zhao, B., Li, D., Wu, Z., Zhang, X., Wang, X., and Tang, Y. (2021). Capacity Optimal Sizing of Island Microgrid Clusters Based on the Target of $100 \%$ Green Energy Power Supply. Proc. CSEE 41, 932-946. doi:10.13334/j.02588013.pcsee. 191903

Zhong, H., Xie, L., and Xia, Q. (2013). Coupon Incentive-Based Demand Response: Theory and Case Study. IEEE Trans. Power Syst. 28, 1266-1276. doi:10.1109/ tpwrs. 2012.2218665

Conflict of Interest: GC was employed by Northeast Electric Power Design Institute Company Limited of China Power Engineering Consulting Group.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Publisher's Note: All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors, and the reviewers. Any product that may be evaluated in this article, or claim that may be made by its manufacturer, is not guaranteed or endorsed by the publisher.

Copyright © 2022 Yan, Liu, Yang, Chai, Guo and Gui. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.

## NOMENCLATURE

$\boldsymbol{C}_{\mathbf{g k}}$ the project cost of installing this capacity of the unit $k$
$\boldsymbol{P}_{\mathbf{L}-i}$ the transmission capacity of the $i$ th candidate line
$\boldsymbol{C}_{\boldsymbol{i}}$ the per unit length price of the $i$ th candidate line
$\mathbf{P}_{\mathbf{L}}$ the planning boundary
$C_{\boldsymbol{L}}$ the grid loss cost before energy storage is used
$\mathbf{P}_{\mathbf{L N}}$ the planning boundary after energy storage configured
$C_{L N}$ the grid loss cost after energy storage is used
$\mathbf{P}_{\mathbf{L N i}}(\mathbf{t})$ the corrected load of node $i$ at time t
$\boldsymbol{C}_{\text {NES }}$ the cost-effectiveness of technology without an energy storage system
$\boldsymbol{P}_{\text {max }}$ the maximum netload
$\cos \boldsymbol{\alpha}$ the power factor
$\boldsymbol{P}_{\text {min }}$ the minimum netload
$\boldsymbol{C}_{\mathbf{p}}$ the electricity price at the peak load
$\boldsymbol{P}_{\min } \boldsymbol{g}$ the minimum technical output of conventional units
$\boldsymbol{C}_{\mathbf{p v a}}$ the peak-to-valley arbitrage income of the dynamic time-of-use electricity price
$\boldsymbol{P}_{\text {net }}(\mathbf{t})$ the netload at time $t$
$C_{Q}$ the cost of system wind abandonment before energy storage is used
$\mathbf{P}_{\mathbf{T 1}}$ the lower point of intersection of time trisection line and continuous power netload curve
$C_{\mathrm{QN}}$ the cost of system wind abandonment after energy storage is used.
$\mathbf{P}_{\mathbf{T} 2}$ the upper point of intersection of time trisection line and continuous power netload curve
$\boldsymbol{C}_{\mathbf{T}}$ the investment cost of the transmission line under the original boundary $\boldsymbol{P}_{\mathbf{w}}(\boldsymbol{t})$ the output power of wind power generation at time $t$
$\mathbf{C}_{\mathbf{T N}}$ the investment cost of the transmission line after the energy storage is applied
$\boldsymbol{R}_{\boldsymbol{i}}$ the $i$ th node
$C_{\mathrm{v}}$ the electricity price at the load valley
$\mathbf{s g n}$ the symbol function
$C_{\mathbf{Y}}$ the investment cost of the original boundary power supply planning
$\boldsymbol{T}_{\mathrm{s}}$ the cost recovery period
$C_{\text {YES }}$ the cost-effectiveness of technology with an energy storage system
$\mathrm{T}_{\mathbf{1}}$ the electricity price time at the peak
$\boldsymbol{C}_{\mathbf{Y N}}$ the investment cost of the power supply planning after the energy storage used
$\mathbf{T}_{2}$ the electricity price time at the flat
$\boldsymbol{e}(\mathbf{t})$ the grid electricity price at the time $t$ in the system
$\mathbf{T}_{3}$ the electricity price time at the valley
$\boldsymbol{G}_{\mathbf{k}}$ the investment 0-1 variable of the thermal power unit $k$
$\boldsymbol{U}_{\boldsymbol{i}}(\mathbf{t})$ the voltage at the $i$ th node at time $t$
$\boldsymbol{I}_{\text {ess }}$ the investment cost of energy storage system
$\boldsymbol{W}_{\mathbf{g}}$ the selected unit set
$\boldsymbol{I}_{\text {ess-i }}(\mathbf{t})$ the electric current of the energy storage system on the $i$ th node at time $t$
$\boldsymbol{W}_{\mathbf{p - i}}$ the charged power of energy storage during the load peak on the $i$ th day
$\boldsymbol{I}_{\boldsymbol{i}}(\mathbf{t})$ the electric current at the $i$ th node at time $t$
$\boldsymbol{W}_{\mathbf{Q}}$ the abandoned wind power before energy storage is used
$\boldsymbol{k}_{\mathbf{i}}$ the proportion of overall energy storage configuration at node $i$
$\boldsymbol{W}_{\mathbf{Q N}}$ the abandoned wind power after energy storage is used
$\boldsymbol{K}_{\mathrm{L}}$ the power cost per unit length line
$\boldsymbol{W}_{\mathbf{v}-\mathbf{i}}$ the charged power of energy storage during the load valley on the $i$ th day
$K_{\mathbf{Q}}$ the unit penalty cost of abandoned wind power
$W_{1}$ the collection of the candidate lines
$\boldsymbol{L}_{\boldsymbol{i}}$ the length of the $i$ th candidate line
$\boldsymbol{Z}_{\boldsymbol{i}}$ the 0-1 decision variable for the investment of the $i$ th candidate line
$\boldsymbol{L}_{\mathbf{1}}$ the three bisectrix lines in the netload fluctuation range
$\boldsymbol{a}_{i-j}$ the load rate on the transmission line from node $i$ to node $j$
$\boldsymbol{L}_{\mathbf{2}}$ the three bisectrix lines in the netload fluctuation range
$\boldsymbol{\beta}$ the energy storage efficiency
$\boldsymbol{N}$ the number of system nodes
$\boldsymbol{\delta}_{\text {SOCmax }}$ the upper limit of the SOC of the energy storage device
$\boldsymbol{n}_{\boldsymbol{i}}$ the number of construction times of the $i$ th candidate line
$\boldsymbol{\delta}_{\text {SOCmin }}$ the lower limit of the SOC of the energy storage device
$\boldsymbol{P}_{\text {ess- } i}(\mathbf{t})$ the active output power of the energy storage system on the $i$ th node at time $t$
$\boldsymbol{\delta}_{\text {SOC }}(\mathbf{0})$ the states of charge of the energy storage device at time 0
$\mathbf{P}_{\text {ESS }}(\mathbf{t})$ the power at time $t$ of energy storage
$\boldsymbol{\delta}_{\text {SOC }}(\mathbf{2 4})$ the states of charge of the energy storage device at time 24
$\mathbf{P}_{\mathbf{g} \boldsymbol{k}}$ the installed capacity of the unit $k$
$\Delta \mathbf{P}$ the average power value after the trisection
$\mathbf{P}_{\mathbf{g} k \mathbf{N}}$ the installed capacity of the unit $k$ after the application of energy storage
$\Delta C_{\mathrm{Y}}$ the indirect income of the energy storage system in the power supply planning, namely, the difference between the investment cost of the new power source before and after the energy storage used on the power supply side
$\boldsymbol{P}_{\boldsymbol{i}}(\mathbf{t})$ the active load power at the $i$ th node at time $t$
$\Delta C_{\mathbf{T}}$ the difference between the investment cost of the new transmission line before and after the energy storage applied on the grid side
$\boldsymbol{P}_{i-j}$ the transmitting power in the transmission line from node $i$ to node $j$
$\Delta C_{\mathrm{Q}}$ the difference between the cost of wind abandonment before and after using the energy storage
$\boldsymbol{P}_{\boldsymbol{i}-\mathrm{j}, \boldsymbol{\operatorname { m a x }}}$ the maximum value of the line transmission capacity
$\Delta C_{\mathrm{L}}$ the difference between the cost of network loss before and after using the energy storage
$\boldsymbol{P}_{\mathbf{L}}(\boldsymbol{t})$ the total system load power at time the load at time $t$
$\Delta P_{\mathbf{Q}}(\boldsymbol{t})$ the abandonment power at time $t$
$\mathbf{P}_{\mathbf{L}}(\mathbf{t})$ the total system load power at time the load at time $t$
$\Delta \boldsymbol{P}_{\text {loss }}(\boldsymbol{t})$ the power loss at time $t$
$\mathbf{P}_{\boldsymbol{L} i}(\mathbf{t})$ the load of node $i$ at time t
$\sum_{k} \boldsymbol{P}_{\mathrm{g} k}(\boldsymbol{t})$ the output of all thermal power units at time $t$

