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Article

# Low-Carbon Economic Dispatch of Virtual Power Plant Considering Hydrogen Energy Storage and Tiered Carbon Trading in Multiple Scenarios

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**Abstract:** Under the "dual carbon" target in China, virtual power plants (VPPs) play an important role in improving grid security and promoting clean and low-carbon energy transformation. VPPs can integrate and control distributed resources to participate in the energy market and make full use of distributed resources. However, the intermittency and volatility of renewable energy and the "heat-driven" working mode of CHP units create contradictions that seriously affect the peak-shaving ability of VPPs and lead to high carbon emissions. To solve these problems, this paper aggregates CHP units, wind power, photovoltaics, carbon capture, hydrogen energy storage, and electric boilers into a new type of virtual power plant. The "hydrogen energy storage-electric boiler" joint decoupling CHP working mode is used to strengthen the coupling relationship between electric-thermal-hydrogen load. At the same time, a tiered carbon trading mechanism is considered, with the net profit of the VPP as the optimization objective, balancing economic and environmental considerations. A low-carbon economic dispatch model for VPPs is established, and a genetic algorithm is used for optimization. Three different scheduling strategies are set, and simulations are conducted in three different seasonal scenarios. The results show that the net profit in the cooling season increased by 50.4%, and carbon emissions decreased by 42.3%. In the transitional season, the net profit increased by 39.2%, and carbon emissions decreased by 44.9%. In the heating season, the net profit increased by 19.4%, and carbon emissions decreased by 43.4%. Overall, the proposed dispatch strategy can improve the new energy consumption capacity and total revenue of VPPs while achieving the goal of reducing carbon emissions.

**Keywords:** hydrogen energy storage; tiered carbon trading mechanism; virtual power plant; low-carbon economy

## 1. Introduction

With the increasing global energy crisis and pollution issues, reducing carbon dioxide emissions and efficiently utilizing distributed energy sources have become major tasks for countries worldwide. However, distributed energy faces challenges such as uneven resource distribution, lack of coordination in management, and inefficient scheduling. Therefore, new technologies such as smart grids, energy hubs, integrated energy systems, and virtual power plants (VPPs) have been introduced to achieve multi-energy coordinated supply and cascaded utilization of energy resources[1,2]. These technologies play a crucial role in large-scale and efficient utilization of renewable energy, as well as in building efficient, secure, green, and low-carbon power systems. This paper aims to provide an academic translation of these concepts.

As a new type of technology, virtual power plants (VPPs) can aggregate distributed energy sources through advanced control, measurement, and communication technologies to achieve coordinated and optimized operation, thereby improving overall stability and competitiveness in the electricity market[3]. As a distributed energy grid technology, VPPs can monitor and regulate flexible resources, allowing them to participate in electricity system energy trading, frequency regulation,

peak load regulation, and other ancillary services as a whole. This promotes the coordinated interaction of the "source-grid-load-storage" of the new power system and can also optimize and schedule traditional thermal power, centralized renewable energy bases, or other forms of energy to promote the smooth operation of the power system. The use of market price incentive mechanisms can fully tap the potential of user-side resource regulation, and a series of hardware and software technologies such as the Internet of Things and big data can aggregate different types of operators to enable their participation in the electricity market [3]. Existing research on VPPs has focused mainly on optimization and scheduling, increasing the consumption of new energy, reducing the impact of distributed resource fluctuations on the power system, and energy conservation and emission reduction. Future research should focus on the trading rules of VPPs in the medium and long-term electricity and spot markets, as well as in ancillary service markets, to promote the establishment of market mechanisms adapted to the new power system.

Currently, virtual power plants (VPPs) have been piloted and practiced in most provinces of China, participating in various market models such as ancillary markets and spot markets. For example, since its launch in December 2019, the Jibei VPP has participated in the North China electricity market clearance for over 3,200 hours, with a cumulative increase of 34.12 GWh of new energy generation[4]. In addition, on July 16, 2021, China's national carbon trading market was officially launched, with the power industry being the first to be included in carbon emission management[5]. Building a new power system based on new energy and vigorously developing distributed resources is an important way for China to achieve green energy transformation, carbon neutrality, and peak carbon emissions[6,7]. Most researchers studying VPPs focus on operational optimization. Wang and Wu proposed a peak load optimization strategy based on a unified model of VPP adjustable space, which verified that VPPs can ensure the reliability of power system operation[8,9]. Falabretti and Gougheri proposed a two-stage robust optimization model considering wind power uncertainty, generating their own trading strategy. This trading strategy can realize the internal thermal power joint optimization operation of VPPs, help VPPs achieve internal resource optimization scheduling, and maximize VPP market revenue[10,11]. However, how to improve the consumption rate of renewable energy and reduce carbon emissions has become a key issue facing VPPs and a crucial step in promoting the green transformation of China's power system.

In recent years, carbon capture and storage (CCS) systems have received widespread attention as a new technology capable of sequestering carbon dioxide and reducing carbon emissions. MacDowell et al.[12] provided an overview of this technology and demonstrated its potential to achieve 80%-90% emissions reduction targets. Y. Cui et al.[13] analyzed the "energy time-shifting characteristics" of carbon capture plants and achieved peak shaving through liquid storage operation. R. Zhou et al.[14] established a dual-carbon quantity model for liquid storage CCS systems and constructed a real-time two-stage low-carbon economic dispatch model with the goal of maximizing net revenue in the electricity and carbon trading markets. D. Chen et al.[15] considered the operational mechanisms of CCS power plants and carbon transport systems and combined them with an economic dispatch model. In addition, W. Zhong et al.[16] introduced CCS systems and tower-type solar thermal power plants into a virtual power plant and verified the high-efficiency coordination ability between CCS systems and renewable energy power plants. Therefore, introducing CCS systems into virtual power plants can reduce their carbon emissions and improve their flexible dispatch capabilities. At the same time, the energy consumption of carbon capture is a movable and adjustable load. By controlling it, CCS power plants have the characteristics of flexible operation and rapid power adjustment to respond to the stochastic fluctuations of wind turbine and photovoltaic power. Compared with traditional power plants, CCS power plants can reduce carbon emissions and adjust power output flexibly. Carbon trading is also one of the main measures to reduce carbon emissions in virtual power plants, and a stepped carbon trading mechanism can help the system find a balance between low-carbon and economic performance.[17-19] introduced carbon trading costs into the dispatch models of integrated energy systems (IES) and verified the inhibitory effect of stepped carbon trading mechanisms on carbon emissions. They also studied and analyzed the impact of stepped carbon trading mechanisms on the low-carbon and economic performance of

IES.[20]compared traditional carbon trading mechanisms with stepped carbon trading mechanisms and found that stepped carbon trading mechanisms can achieve more carbon emissions reductions, and the increase in system costs for participating in stepped carbon trading mechanisms is smaller when achieving the same emissions reduction targets.[21]combined the actual carbon emissions of gas turbines and boilers to construct a comprehensive energy system carbon trading mechanism. Finally, a low-carbon optimization operation model for integrated energy systems was established with the minimum objective function of energy purchase cost, carbon trading cost, and operation and maintenance cost. Therefore, it is evident that stepped carbon trading mechanisms play an important role in reducing carbon emissions, and this paper will introduce them to reduce carbon emissions from virtual power plants.

However, in the northern regions of China, the heating work in winter is usually completed by combined heat and power (CHP) units, which prioritize meeting the heat load demand and often operate in a "heat-driven" mode, resulting in the forced power output of the units being maintained at a relatively high level. Due to the thermal-electric coupling characteristics of CHP units, the range of adjustable electric output to meet user heating demand is reduced, which reduces the flexibility of CHP units and seriously affects the ability of virtual power plants (VPPs) to consume new energy sources[22]. There are two main ways to decouple heat and electricity for CHP units: configuring thermal storage tanks and electric heating equipment, both of which can enhance the peak-shaving ability of CHP units[23,24]. However, the consumption of distributed energy sources such as wind and photovoltaics also needs to be addressed, and hydrogen storage as an emerging technology in recent years is composed of an electrolyzer, a fuel cell, and a hydrogen storage tank. When the load is in a valley period, the electrolyzer electrolyzes water to produce hydrogen, realizing energy conversion from electricity to hydrogen, which is injected into the hydrogen storage tank for storage; when the load is in a peak period, the stored hydrogen energy is converted into electrical energy through a hydrogen fuel cell, optimizing the operation of VPPs.[25]established an optimal energy storage scheduling model for a wind-solar-hydrogen integrated system that includes multiple energy storage devices such as electricity, heat, and hydrogen. The results show that the proposed energy storage model can reduce the total operating cost and improve the flexibility of system regulation while ensuring safe system operation.[26] simulated the economic efficiency of wind turbines with and without hydrogen storage devices and ultimately concluded that hydrogen storage systems can effectively improve the utilization efficiency of renewable energy sources.[27]proposed an innovative hybrid model of a solar device based on a parabolic trough collector, proton exchange membrane electrolyzer, and fuel cell, selecting the best working fluid and ideal working conditions for the solar device with the minimum cost rate and maximum energy efficiency, demonstrating that hydrogen storage has good economic and environmental benefits as well as the ability to store energy for a long time. It can be seen that traditional energy storage and hydrogen storage are both aimed at smoothing wind power output fluctuations and reducing costs, but due to the single form of energy conversion, the role of traditional energy storage in waste heat co-utilization and carbon emission reduction is relatively limited. Compared with traditional energy storage, hydrogen storage has significant advantages in the flexibility and economy of power system regulation and seasonal energy storage, so hydrogen storage is expected to play a greater role in building low-carbon, green comprehensive energy systems. However, most studies only consider the electric-hydrogen coupling and do not consider the heat energy generated by the combustion of hydrogen gas in the hydrogen storage system's fuel cell.

The main contributions of this paper are as follows:

(1) A new VPP structure is designed by integrating hydrogen energy storage and carbon capture into the traditional VPP. The surplus wind and solar resources are converted into hydrogen energy through hydrogen storage, and the carbon emissions from CHP generation are captured and stored or transported to MR, where CO<sub>2</sub> is converted into CH<sub>4</sub>, achieving an optimized electric-thermal-carbon-hydrogen cycle.

(2) Based on the new VPP structure, a low-carbon economic scheduling model is established considering tiered carbon trading, which takes into account factors such as revenue, renewable energy consumption, and carbon emissions. The model is solved using a genetic algorithm.

(3) Different scheduling strategies are proposed for three different scenarios: cooling season, transition season, and heating season. By selecting some parameters for comprehensive comparison, it is shown that the proposed scheduling approach has high practicality and economic benefits, effectively improving the VPP's ability to integrate renewable energy generation, mitigating the problem of mismatch between renewable energy output and load demand, achieving source-load balance, promoting VPP's low-carbon transformation, strengthening electric-thermal load coupling and complementary use, and has strong academic significance and engineering application value.

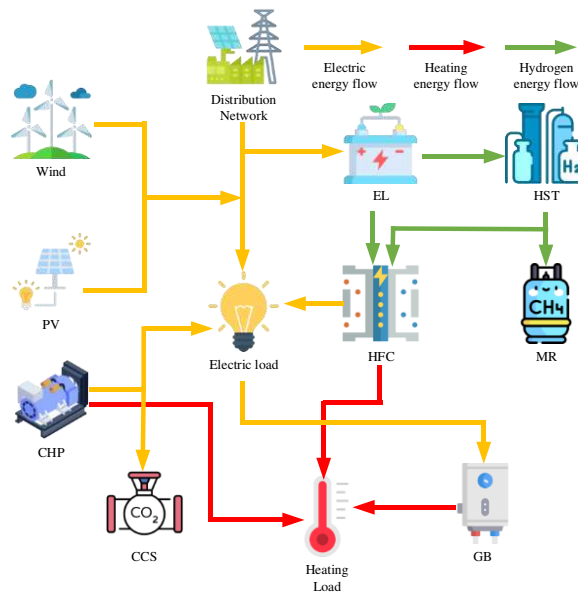
The rest of this paper is organized as follows: Section 2 describes the operating framework of the VPP, introduces the hydrogen energy storage system and tiered carbon trading model. Section 3 presents the objective function and model solving process of the VPP. Section 4 provides the system parameters, simulation results, and analysis. Finally, Section 5 summarizes the research results in this paper.

## 2. Framework for VPP Operation with Hydrogen Storage and Carbon Trading

### 2.1. Composition of Virtual Power Plant (VPP)

A Virtual Power Plant (VPP) integrates various energy sources such as wind power, solar photovoltaic (PV), thermal power, hydropower, and natural gas within a specific region. It establishes a unified virtual control center to manage and dispatch energy resources. In a broader sense, by incorporating technologies like demand response, energy storage, electric vehicles, as well as communication and control systems, the integration of supply and demand sides can be achieved. This enables flexible coordination between power generation and consumption, and orderly integration of distributed energy sources. However, traditional VPPs heavily rely on coal-fired or combined heat and power (CHP) units, resulting in high carbon emissions and low utilization efficiency of clean energy, which hinders the implementation of China's 30-60 plan. In contrast, a combined system of carbon capture and storage (CCS) and hydrogen energy storage can effectively sequester a large amount of carbon dioxide and convert it into methane, thereby promoting a zero-carbon-oriented energy planning at the level of the power supply chain. This provides a feasible pathway for emission reduction, improving energy utilization efficiency, and implementing carbon neutrality strategies. Therefore, integrating CCS and hydrogen storage systems into the VPP can effectively control carbon emissions.

The proposed framework for the VPP, as illustrated in the figure below, includes PV, wind power, CHP, carbon capture, hydrogen storage systems, and electric boilers. By introducing hydrogen storage and electric boilers into the VPP, a portion of the CO<sub>2</sub> emitted from the combustion of coal in CHP units can be captured and stored using carbon capture devices. Additionally, hydrogen produced by the hydrogen storage system can be converted into methane through a methanation reactor. The generated methane can be directly sold. Furthermore, the hydrogen fuel cells can generate electricity and heat by burning hydrogen, which can be operated in conjunction with electric boilers. This further decouples the CHP units from thermal-based electricity generation, leading to a reduction in carbon emissions, lowering system energy costs, and improving economic benefits.



**Figure 1.** Topological Structure of Virtual Power Plant (VPP).

## 2.2. Hydrogen energy storage model and methanation process.

Hydrogen Energy Storage System [29] and the principle of carbon dioxide methanation process: EL first converts electrical energy into hydrogen energy. A portion of the hydrogen energy is inputted into the methanation reactor (MR) along with CO<sub>2</sub> to synthesize natural gas, while another portion is directly supplied to a hydrogen fuel cell (HFC) for conversion into electrical and thermal energy. The remaining portion is stored in hydrogen storage tanks. The direct conversion of hydrogen energy into electrical and thermal energy by HFC improves energy efficiency and does not produce CO<sub>2</sub>. It can be seen that supplying hydrogen energy directly to HFC has multiple benefits. The energy conversion model described above can be summarized as follows in an academic paper format:

### (1) Electrolysis cell equipment(EL)

$$P_{el,H_2}(t) = \eta_{el} P_{el}(t) \quad (1)$$

$$P_{el}^{\min} \leq P_{el}(t) \leq P_{el}^{\max} \quad (2)$$

$$\Delta P_{el}^{\min} \leq P_{el}(t+1) - P_{el}(t) \leq \Delta P_{el}^{\max} \quad (3)$$

In the equation,  $P_{el}(t)$  is the electrical energy input to EL in time period  $t$ ;  $P_{el,H_2}(t)$  is the hydrogen energy output from EL in time period  $t$ ;  $\eta_{el}$  is the energy conversion efficiency of EL;  $P_{el}^{\max}$  and  $P_{el}^{\min}$  are the upper and lower limits of electrical energy input to EL, respectively;  $\Delta P_{el}^{\max}$  and  $\Delta P_{el}^{\min}$  are the upper and lower limits of EL's ramp rate.

### (2) Hydrogen fuel cell(HFC)

$$P_{HFC,e}(t) = \eta_{HFC}^e P_{H_2,HFC}(t) \quad (4)$$

$$H_{HFC,h}(t) = \eta_{HFC}^h P_{H_2,HFC}(t) \quad (5)$$

**Commented [M1]:** Please cite the figure in the text and ensure that the first citation of each figure appears in numerical order.

**Commented [M2]:** Refs. [28] is missing. Please add and rearrange all the references to appear in numerical order.

$$P_{H_2,HFC}^{\min} \leq P_{H_2,HFC}(t) \leq P_{H_2,HFC}^{\max} \quad (6)$$

$$\Delta P_{H_2,HFC}^{\min} \leq P_{H_2,HFC}(t+1) - P_{H_2,HFC}(t) \leq \Delta P_{H_2,HFC}^{\max} \quad (7)$$

In the equation,  $P_{H_2,HFC}(t)$  is the hydrogen energy input to the hydrogen fuel cell (HFC) in time period  $t$ ;  $\eta_{HFC}^e$  is the hydrogen-to-electricity conversion efficiency of the HFC;  $\eta_{HFC}^h$  is the hydrogen-to-thermal energy conversion efficiency of the HFC;  $P_{H_2,HFC}^{\min}$  and  $P_{H_2,HFC}^{\max}$  are the upper and lower limits of the hydrogen energy input to the HFC, respectively;  $\Delta P_{H_2,HFC}^{\min}$  and  $\Delta P_{H_2,HFC}^{\max}$  are the upper and lower limits of the ramp rate of the HFC

(3) Hydrogen storage tank(HST)

$$P_{ES}^{H_2}(t) = \eta_{H_2}^{chr} P_{H_2}^{chr}(t) - \frac{P_{H_2}^{dis}(t)}{\eta_{H_2}^{dis}} \quad (8)$$

$$E_{H_2}(t) = E_{H_2}(t-1) + P_{ES}^{H_2}(t) \quad (9)$$

$$E_{H_2,\min} \leq E_{H_2}(t) \leq E_{H_2,\max} \quad (10)$$

$$E_{H_2}(0) = E_{H_2}(T) \quad (11)$$

$$P_{H_2}^{dis}(t) P_{H_2}^{chr}(t) = 0 \quad (12)$$

In the equations,  $\eta_{H_2}^{chr}$  is the hydrogen charging efficiency of the hydrogen storage tank;  $\eta_{H_2}^{dis}$  is the hydrogen discharging efficiency of the hydrogen storage tank;  $P_{ES}^{H_2}(t)$  is the hydrogen charging power of the hydrogen storage tank at time  $t$ .  $E_{H_2}(t-1)$  and  $E_{H_2}(t)$  are the hydrogen storage levels of the hydrogen storage tank at times  $t$  and  $t-1$ , respectively.  $E_{H_2,\min}$  and  $E_{H_2,\max}$  are the lower and upper limits of the hydrogen storage tank capacity, respectively.  $T$  is the scheduling period, which is 24 hours.

(4) Methane reactor(MR)

$$P_{Mg,g}(t) = \eta_{MR} P_{H_2,MR}(t) \quad (13)$$

$$P_{H_2,MR}^{\min} \leq P_{H_2,MR}(t) \leq P_{H_2,MR}^{\max} \quad (14)$$

$$\Delta P_{H_2,MR}^{\min} \leq P_{H_2,MR}(t+1) - P_{H_2,MR}(t) \leq \Delta P_{H_2,MR}^{\max} \quad (15)$$

In the equation,  $P_{H_2,MR}(t)$  is the hydrogen power input to the methane reactor in time period  $t$ ;  $P_{Mg,g}(t)$  is the methane power output;  $\eta_{MR}$  is the conversion efficiency of the methane reactor;  $P_{H_2,MR}^{\max}$  and  $P_{H_2,MR}^{\min}$  are the upper and lower limits of the hydrogen power input, respectively;  $\Delta P_{H_2,MR}^{\max}$  and  $\Delta P_{H_2,MR}^{\min}$  are the upper and lower limits of the ramp rate of the methane reactor.

### 2.3. Tiered carbon trading model

The carbon trading mechanism controls carbon emissions by establishing legal carbon emission rights and allowing producers to trade them on the market. Regulatory agencies first allocate carbon emission quotas to each carbon emission source, and manufacturers produce and emit carbon within their allocated quotas. If actual carbon emissions are lower than the allocated quota, the remaining quota can be traded on the carbon trading market; otherwise, additional carbon emission quotas must be purchased.

The tiered carbon trading mechanism model is mainly composed of three parts: the carbon emission quota model, the actual carbon emission model, and the tiered carbon emission trading model. The carbon emission sources in this paper mainly come from purchased electricity and CHP. Some of the carbon is captured and stored by CCS, and some is synthesized into methane by MR for sale. The rest of the emissions are optimized through the electricity-heat-carbon-hydrogen cycle to promote the low-carbon transformation of VPP.

#### (1) VPP carbon emission quota allocation model.

There are mainly two types of carbon emission sources in VPP: purchasing electricity from the superior power grid and CHP. Currently, the most commonly used quota allocation method in China is free allocation, and this paper assumes that the purchased electricity from the superior power grid is generated by coal-fired units[30].

$$\begin{cases} E_{vpp,a} = E_{q,a} + E_{buy,a} \\ E_{q,a} = \sum_{t=1}^{24} \sum_{i \in \theta} \delta_h (H_{chp}^i(t) + \phi P_{chp}^i(t)) \\ E_{buy,a} = \chi_g \sum_{t=1}^{24} P_{grid, buy}(t) \end{cases} \quad (16)$$

In the equation,  $E_{vpp,a}$ ,  $E_{q,a}$  and  $E_{buy,a}$  are the carbon emission quota for VPP, CHP,  $\delta_h$  and purchasing electricity from the superior power grid, respectively;  $\phi$  is the carbon emission quota for unit heat supply;  $\chi_g$  is the conversion factor for converting electricity generation into heat supply;  $\chi_g$  is the carbon emission quota assigned to unit purchased electricity;  $H_{chp}^i(t)$  and  $P_{chp}^i(t)$  are the thermal output and electrical output of the  $i$ th CHP in time period  $t$ ;  $P_{grid, buy}^t$  is the electrical power input from the superior power grid to VPP.

#### (2) Actual carbon emissions of VPP

The carbon capture device can partially sequester the CO<sub>2</sub> generated by VPP, and additionally, the MR can absorb a portion of CO<sub>2</sub> during the hydrogen-to-methane conversion process. Therefore, the actual carbon emission model is as follows:

$$\begin{cases}
E_{vpp} = E_{chp} + E_{buy} - E_{MR} - E_{CCS} \\
E_{chp} = \sum_{t=1}^{24} (b_0 + b_1 P_{total}(t) + b_2 P_{total}^2(t)) \\
P_{total}(t) = \sum_{i \in \theta} P_{chp}^i(t) + H_{chp}^i(t) \\
E_{buy} = \sum_{t=1}^{24} (a_0 + a_1 P_{grid,buy}(t) + a_2 P_{grid,buy}^2(t)) \\
E_{MR} = \sum_{t=1}^{24} \varpi P_{MR}(t) \\
E_{CCS} = \sum_{t=1}^{24} E_{CCS}(t)
\end{cases} \quad (17)$$

In the equation,  $E_{vpp}$  is the actual carbon emissions of VPP,  $E_{chp}$  is the carbon emissions of CHP,  $E_{chp}$  is the purchased electricity from the superior power grid by VPP,  $E_{MR}$  is the amount of CO<sub>2</sub> absorbed by MR,  $E_{CCS}$  is the amount of CO<sub>2</sub> sequestered by CCS.  $P_{grid,buy}(t)$  is the purchased electricity power from the superior power grid by VPP in time period  $t$ .  $a_0$ ,  $a_1$ ,  $a_2$  and  $b_0$ ,  $b_1$ ,  $b_2$  are the carbon emission calculation parameters for purchased electricity power and CHP output, respectively.  $P_{chp}^i(t)$  and  $H_{chp}^i(t)$  are the electrical output and thermal output of the  $i$ -th CHP in time period  $t$ .  $\theta$  is the number of CHP.  $P_{MR}(t)$  is the hydrogen power input to the MR in time period  $t$ .  $\varpi$  is the parameter for CO<sub>2</sub> absorption during the hydrogen-to-natural-gas conversion process in the MR equipment.  $E_{CCS}(t)$  is the amount of CO<sub>2</sub> sequestered by CCS at time  $t$ .

### (3) Tiered carbon trading model.

The tiered carbon trading model adopts a tiered carbon price, which sets different carbon emission ranges based on the difference between actual carbon emissions and carbon quotas. Each range corresponds to a different unit carbon trading price. When the difference between actual carbon emissions and carbon quotas exceeds the set range, the carbon trading price for the excess emissions also increases. The greater the difference, the higher the corresponding carbon trading price. The cost calculation expression for the tiered carbon trading model is as follows[30]:

$$\begin{aligned}
E_{vpp,t} &= E_{vpp} - E_{vpp,a} & (18) \\
F_{CO_2} &= \begin{cases} \lambda E_{vpp,t} & E_{vpp,t} \leq l \\ \lambda(1+\alpha)(E_{vpp,t}-l) + \lambda l & l \leq E_{vpp,t} \leq 2l \\ \lambda(1+2\alpha)(E_{vpp,t}-2l) + \lambda(2+\alpha)l & 2l \leq E_{vpp,t} \leq 3l \\ \lambda(1+3\alpha)(E_{vpp,t}-3l) + \lambda(3+3\alpha)l & 3l \leq E_{vpp,t} \leq 4l \\ \lambda(1+4\alpha)(E_{vpp,t}-4l) + \lambda(4+6\alpha)l & 4l \geq E_{vpp,t} \end{cases} & (19)
\end{aligned}$$

In the equation,  $f_{CO_2}^{price}$  is the tiered carbon trading cost,  $\lambda$  is the base carbon trading price,  $l$  is the length of the carbon emission range,  $\alpha$  is the rate of price increase.

## 3. Virtual Power Plant Low-carbon Economic Dispatch Model

### 3.1. Objective function

To maximize the economic benefits of a virtual power plant over a 24-hour scheduling period, a low-carbon dispatch model is constructed. The expression for the objective function is as follows:

$$\max F = \max(F_{sale} - F_{om} - F_{main} - F_{CO_2}) \quad (20)$$

In the equation,  $F_{sale}$  is the revenue from electricity, heating, and gas sales of the VPP,  $F_{om}$  is the annual operating cost of the VPP;  $F_{main}$  is the annual equipment maintenance cost of the VPP,  $F_{CO_2}$  is the carbon trading cost.

### 3.1.1. Revenue from selling electricity, heat, and gas for a Virtual Power Plant (VPP)

$$F_{sale} = \sum_{t=1}^{24} \left[ \alpha(t)(P_{wind}(t) + P_{pv}(t) + P_{HFC,e}(t) + \sum_{i \in \theta} P_{chp}^i(t) - P_{ccs}(t) - P_{el}(t) - P_{EH}(t)) + \beta(t)(\sum_{i \in \theta} H_{chp}^i(t) + H_{EH}(t) + H_{HFC,h}(t)) + \gamma(t)P_{Mg,g}(t) \right] \quad (21)$$

In the equation,  $i$  is the index of the CHP unit.  $\theta$  is the total number of CHP units in the VPP.  $P_{chp}^i(t)$  and  $H_{chp}^i(t)$  are the electricity and heat output of the  $i$ -th CHP unit at time  $t$ , respectively.  $P_{wind}(t)$  and  $P_{pv}(t)$  are the power output of the wind and photovoltaic power plants at time  $t$ , respectively.  $P_{EH}(t)$  and  $H_{EH}(t)$  are the electric-to-heat conversion power and heat supply power of the electric boiler at time  $t$ , respectively.  $P_{ccs}(t)$  is the total energy consumption of the CCS at time  $t$ .  $P_{HFC,e}(t)$  and  $H_{HFC,h}(t)$  are the power output of the hydrogen fuel cell for electricity and heat supply,  $P_{el}(t)$  is the power consumption of the electrolyzer, respectively, at time  $t$ .  $P_{Mg,g}(t)$  is the output power of the methane reactor at time  $t$ .  $\alpha(t)$ ,  $\beta(t)$  and  $\gamma(t)$  are the selling prices of electricity, heat, and gas for the VPP at time  $t$ , respectively.

### 3.1.2. Operating cost of a Virtual Power Plant (VPP)

The operating cost of a Virtual Power Plant (VPP) includes, CHP unit fuel cost, Purchased electricity cost from the main power grid, Wind and solar curtailment penalty cost, CCS equipment carbon capture and storage cost, Environmental cost.

$$F_{om} = F_{fuel} + F_{grid} + F_{waste} + F_{FQ} + F_{CB} \quad (22)$$

#### (1) The fuel cost of Combined Heat and Power (CHP) units

$$F_{fuel} = \sum_{i \in \theta} \varphi \left[ c_0 + c_1 P_{chp}^i(t) + c_2 H_{chp}^i(t) + c_3 (P_{chp}^i(t))^2 + c_4 P_{chp}^i(t) H_{chp}^i(t) + c_5 (H_{chp}^i(t))^2 \right] \quad (23)$$

In the equation,  $F_{fuel}$  is the cost of purchasing coal for the CHP units.  $\varphi$  is the unit price of standard coal.  $c_0$ ,  $c_1$ ,  $c_2$ ,  $c_3$ ,  $c_4$ ,  $c_5$  is the fitting coefficient for the coal consumption characteristics of the CHP units.

#### (2) The purchased electricity cost

$$F_{grid} = \sum_{t=1}^{24} C_{grid, buy}(t) P_{grid, buy}(t) \quad (24)$$

In the equation,  $F_{grid}$  is the cost of purchasing electricity from the main power grid for the Virtual Power Plant (VPP).  $P_{grid, buy}(t)$  is the power purchased by the VPP from the main power grid during time period  $t$ .  $C_{grid, buy}(t)$  is the unit price of electricity purchased by the VPP from the main power grid during time period  $t$ .

#### (3) The cost of curtailment for wind and solar power

$$F_{waste} = \sum_{t=1}^{24} [C_{waste,wind} P_{waste,wind}(t) + C_{waste,pv} P_{waste,pv}(t)] \quad (25)$$

$$P_{waste,wind}(t) = P_{wind0}(t) - P_{wind}(t) \quad (26)$$

$$P_{waste,pv}(t) = P_{pv0}(t) - P_{pv}(t) \quad (27)$$

In the equation,  $F_{waste}$  is the cost of curtailment for the Virtual Power Plant (VPP).  $C_{waste,wind}$  and  $C_{waste,pv}$  are the penalty fee per unit of curtailed wind and solar power.  $P_{wind0}(t)$  and  $P_{pv0}(t)$  the potential generation capacity of solar and wind power during time period  $t$ .  $P_{wind}(t)$  and  $P_{pv}(t)$  are the actual generation capacity of solar and wind power during time period  $t$ .

#### (4) Cost of CO<sub>2</sub> Capture and Storage (CCS)

$$F_{FQ} = \sum_{t=1}^{24} k_{FQ} E_{ccs}(t) \quad (28)$$

$$P_{ccs}(t) = P_B + P_R(t) \quad (29)$$

$$P_R(t) = w_c E_{ccs}(t) \quad (30)$$

In the equation,  $k_{FQ}$  is the cost coefficient of carbon capture and storage (CCS),  $E_{ccs}(t)$  is the total energy consumption of CCS during time period  $t$ ,  $P_B$  is the baseline energy consumption of CCS, also known as fixed energy consumption,  $P_R(t)$  is the operating energy consumption of CCS, which can be calculated based on the amount of CO<sub>2</sub> captured,  $w_c$  is the energy required to process one unit of CO<sub>2</sub>.

#### (5) Environmental Cost of VPP

The environmental cost of a virtual power plant can be calculated based on the amount of pollutants emitted by CHP units during time period  $t$ , using the following formula[31],

$$F_{CB} = \sum_{t=1}^{24} [\sum_j v_{ej} d_{ej} \sum_{i \in \theta} (P_{chp}^i(t) + H_{chp}^i(t) + v_j)] \quad (31)$$

In the equation,  $m$  is the type of different pollutants, which mainly include SO<sub>2</sub>, NO<sub>x</sub>, CO<sub>2</sub>, CO, etc.  $v_{ej}$  is the control cost of the  $j$ -th pollutant,  $d_{ej}$  is the amount of the  $j$ -th pollutant emitted per unit output of the CHP unit,  $v_j$  is the penalty cost for emitting the  $j$ -th pollutant by the CHP unit.

#### 3.1.3. Operational and Maintenance Cost of VPP

The operational and maintenance costs of a Virtual Power Plant (VPP) including hydrogen energy storage systems, electric boilers, and carbon capture power plants can be referred to as follows.

$$F_{main} = F_{H_2} + F_{chsom} + F_{epom} \quad (32)$$

##### (1) Operational and Maintenance Cost of Hydrogen Energy Storage Systems

$$F_{H_2} = \sum (C_{el}Q_{el} + C_{fc}Q_{fc} + C_{hst}Q_{hst} + C_{MR}Q_{MR}) \quad (33)$$

In the equation,  $C_{el}$ ,  $C_{fc}$ ,  $C_{hst}$  and  $C_{MR}$  are the unit operational and maintenance costs of the electrolyzer, hydrogen fuel cell, hydrogen storage tank, and methane reactor, respectively,  $Q_{el}$ ,  $Q_{fc}$ ,  $Q_{hst}$  and  $Q_{MR}$  are the installed capacity of the electrolyzer, hydrogen fuel cell, hydrogen storage tank, and methane reactor, respectively.

(2) Operational and Maintenance Cost of Carbon Capture Power Plants[32].

$$F_{chsom} = \frac{\chi}{1-\chi} (F_{chs} + F_{fuel}) \quad (34)$$

$$F_{chs} = \frac{\rho_c V_c}{365n(1-s)} * (1+18.6\%) \quad (35)$$

In the equation,  $\chi$  is the proportion of operational and maintenance costs to the total cost.  $F_{chs}$  is the depreciation cost of the carbon capture power plant.  $F_{fuel}$  is the coal consumption cost of the combined heat and power (CHP) unit.  $\rho_c$  is the unit cost of capacity.  $V_c$  is the total installed capacity.  $n$  is the service life.  $s$  is the line loss rate[33].

(3) Operational and Maintenance Cost of Electric Boilers

$$F_{epom} = \frac{\rho_E V_E \delta}{365} \quad (36)$$

In the equation,  $\rho_E$  is the installation cost required for a unit capacity of electric boilers,  $V_E$  is the installed capacity of the electric boiler.  $\delta$  is the proportion of annual maintenance costs of the electric boiler to the total construction cost.

#### 3.1.4. Carbon trading cost

Refer to equation (19)

### 3.2. Constraint conditions

#### 3.2.1. The constraint on wind and solar power output

$$0 \leq P_{wind0}(t) \leq P_{wind,N} \quad (37)$$

$$0 \leq P_{pv0}(t) \leq P_{pv,N} \quad (38)$$

In the equation,  $P_{wind,N}$  and  $P_{pv,N}$  are the rated installed capacity of wind farms and solar power plants, respectively

#### 3.2.2. The constraint of electricity balance

$$\sum_{i \in \theta} P_{CHP}^i(t) + P_{pv}(t) + P_{wind}(t) + P_{grid.buy}(t) + P_{HFC,e}(t) = P_{load}(t) + P_{el}(t) + P_{EH}(t) + P_{CCS}(t) \quad (39)$$

$$0 \leq P_{grid.buy}(t) \leq P_{grid.buy}^{max} \quad (40)$$

In the equation,  $P_{grid.buy}(t)$  is the purchasing power from VPP to the higher-level power grid during time period  $t$ .  $P_{HFC,e}(t)$  is the power input of hydrogen fuel cells during time period  $t$ .  $P_{load}(t)$  is the electric load power during time period  $t$ .  $P_{el}(t)$  is the power of the electrolyzer during time period  $t$ .  $P_{EH}(t)$  is the power of the electric boiler during time period  $t$ .  $P_{CCS}(t)$  is the power of the carbon capture and storage (CCS) system during time period  $t$ .  $P_{grid.buy}^{max}$  is the upper limit of purchasing power.

3.2.2. The constraint of thermal balance

$$\sum_{i \in \theta} H_{CHP}^i(t) + H_{EH}(t) + H_{HFC,h}(t) = H_{load}(t) \quad (41)$$

In the equation,  $H_{EH}(t)$  is the thermal power converted by electric boilers in time period  $t$ ,  $H_{HFC,h}(t)$  is the thermal power input by hydrogen fuel cells in time period  $t$ , and  $H_{load}(t)$  is the thermal load power in time period  $t$ .

3.2.3. The constraint of hydrogen power balance

$$P_{el,H_2}(t) = P_{H_2,MR}(t) + P_{H_2,HFC}(t) + P_{ES}^{H_2}(t) \quad (42)$$

In the equation,  $P_{el,H_2}(t)$  is the hydrogen production power of the electrolyzer.  $P_{H_2,MR}(t)$  is the hydrogen consumption power of the methane reactor.  $P_{H_2,HFC}(t)$  is the hydrogen consumption power of the hydrogen fuel cell.  $P_{ES}^{H_2}(t)$  is the hydrogen storage power in the hydrogen storage tank.

3.2.4. The constraints of the hydrogen energy storage system

EL, MR, HFC, and HST can be described by equations (1) to (15).

3.2.5. The constraints on carbon capture quantity for CCS

To ensure the utilization and regular maintenance of CCS, a minimum capture rate must be set. Therefore, the constraint on the carbon capture quantity for CCS can be expressed as follows[34],

$$\eta_{min} E_{CHP}(t) \leq E_{CCS}(t) \leq \eta_{max} E_{CHP}(t) \quad (43)$$

In the equation, where  $\eta_{max}$  and  $\eta_{min}$  are the upper and lower bounds of the carbon capture rate for CCS devices, respectively.

3.2.6. Capacity constraint of electric boilers

$$0 \leq H_{EH}(t) \leq H_{EH} \quad (44)$$

In the equation,  $H_{EH}$  is the capacity for configuring electric boilers.

3.2.7. Constraint on electric-thermal conversion of electric boilers

$$H_{EH}(t) = \eta_{EH} P_{EH}(t) \quad (45)$$

In the equation,  $\eta_{EH}$  is electric-thermal conversion efficiency during the operation of electric boilers.

3.2.8. Constraints on thermal and electric output and ramping of CHP units

$$\begin{cases} P_{CHP}^{i,\min} \leq P_{CHP}^i(t) \leq P_{CHP}^{i,\max} \\ H_{CHP}^{i,\min} \leq H_{CHP}^i(t) \leq H_{CHP}^{i,\max} \\ -R_{CHP}^{i,\downarrow} \leq P_{CHP}^i(t+1) - P_{CHP}^i(t) \leq R_{CHP}^{i,\uparrow} \end{cases} \quad (46)$$

In the equation,  $P_{CHP}^{i,\max}$  and  $P_{CHP}^{i,\min}$  are the lower and upper limits of electric power for the i-th CHP unit,  $H_{CHP}^{i,\max}$  and  $H_{CHP}^{i,\min}$  are the lower and upper limits of thermal power for the i-th CHP unit,  $R_{CHP}^{i,\uparrow}$  and  $R_{CHP}^{i,\downarrow}$  are the lower and upper limits of ramping rate for the i-th CHP unit.

### 3.2.9. Operational Region Constraints for Combined Heat and Power Generation

Due to the thermoelectric coupling characteristics and the unique operation mode of heat-driven electricity generation, there exist specific thermoelectric operating ranges for two types of heat-driven electricity generation units[35].

For backpressure CHP units, the electrical output and heat output need to maintain a certain proportional relationship. This is represented by the slope of the line in Figure 2(a). When operating in a "heat-led" mode, this type of unit has only one operational state, namely,

$$P_{CHP}^i(t) = \gamma_{CHP} H_{CHP}^i(t) = \frac{P_{CHP}^{\max} - P_{CHP}^{\min}}{H_{CHP}^{\max} - H_{CHP}^{\min}} H_{CHP}^i(t) \quad (47)$$

In the equation,  $P_{CHP}^{\max}$  and  $P_{CHP}^{\min}$  are the maximum and minimum electric output of the i-th CHP unit, respectively,  $H_{CHP}^{\max}$  and  $H_{CHP}^{\min}$  are the maximum and minimum thermal output of the i-th CHP unit, respectively.

The operational range of an absorption-type CHP unit, considering both thermal and electric output, is depicted in Figure 2(b). The constraints on the operational range of the absorption-type CHP unit, considering both thermal and electric output, can be represented by the following equation.

$$\begin{cases} P_{CHP}^{i,\min} - c_{v2}^i H_{CHP}^i(t) \leq P_{CHP}^i(t) \leq P_{CHP}^{i,\max} - c_{v1}^i H_{CHP}^i(t) & 0 \leq H_{CHP}^i \leq H_{CHP}^{i,med} \\ c_m^i (H_{CHP}^i(t) - H_{CHP}^{i,med}) + P_{CHP}^{i,\min} \leq P_{CHP}^i(t) \leq P_{CHP}^{i,\max} - c_{v1}^i H_{CHP}^i(t) & H_{CHP}^{i,med} \leq H_{CHP}^i \leq H_{CHP}^{i,\max} \end{cases} \quad (48)$$

In the equation,  $P_{CHP}^{i,\max}$  and  $P_{CHP}^{i,\min}$  are the maximum and minimum electric output of the i-th CHP unit, respectively.  $H_{CHP}^{i,\max}$  and  $H_{CHP}^{i,\min}$  are the maximum and minimum thermal output of the i-th CHP unit, respectively.  $H_{CHP}^{i,med}$  is the thermal output corresponding to the minimum electric output of the i-th CHP unit.  $c_{v1}^i$  and  $c_{v2}^i$  are the decrease in maximum and minimum output under constant turbine intake when extracting a unit of heat for the i-th unit.  $c_m^i$  is the coefficient of the ratio between electric output and thermal output when the i-th CHP unit operates under back pressure conditions.

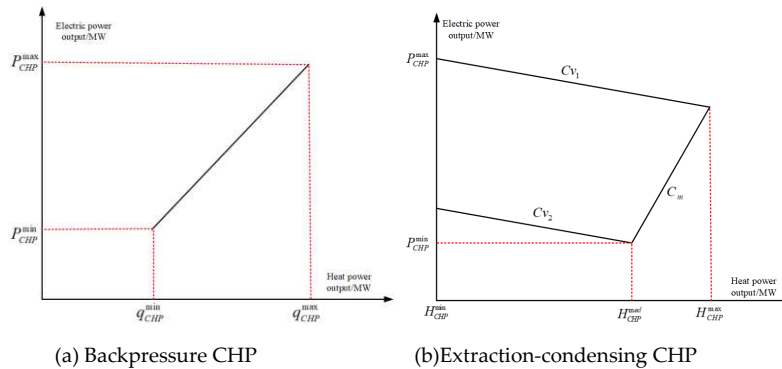


Figure 2. Thermal-electric operating characteristics of backpressure CHP and extraction-condensing CHP.

### 3.3. Algorithm flowchart for model solving

The VPP low-carbon economic dispatch model established in the first two sections of this chapter is solved using a genetic algorithm, and the solving process is shown in Figure 3.

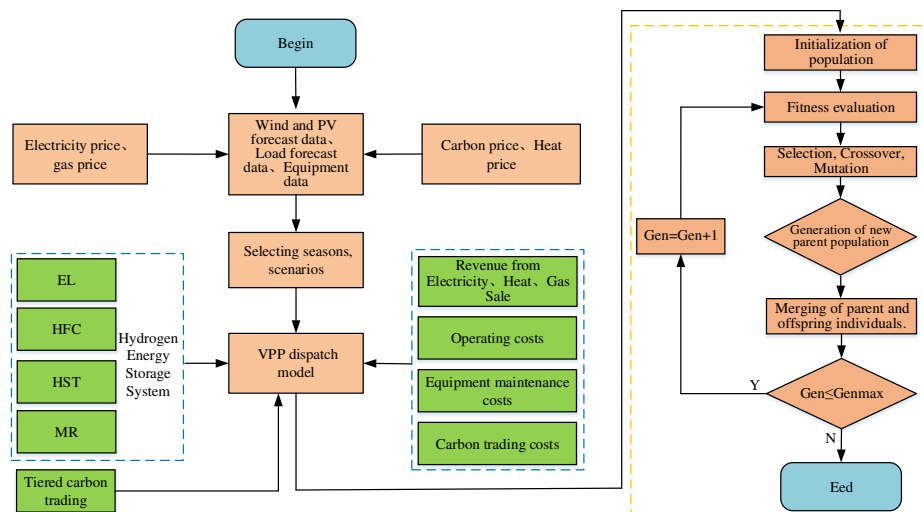


Figure 3. Flowchart for model solving.

The solving process of the VPP low-carbon economic dispatch model is as follows: First, input the predicted data of wind power, photovoltaic power, and load for all three seasons, as well as equipment parameters, electricity, heat, gas, carbon prices, etc. Second, select different seasons, consider different scenarios, choose corresponding data and the VPP low-carbon economic dispatch model as the original data for model solving. Finally, use the electrical and thermal output of some equipment as the fitness calculation (VPP net profit), perform selection, crossover, and mutation operations to generate a new parent population, merge the two populations, determine if the iteration number has been reached, if not, start iterative optimization until the maximum iteration number is reached, end the solving process, and output the final optimization results.

#### 4. Case study analysis

##### 4.1. Case study parameters

To validate the effectiveness of the proposed low-carbon economic model, a case study is set up for verification. The optimization scheduling is carried out on a 24-hour cycle. The installed capacities of the virtual power plant generators are as follows: 372MW for CHP units (consisting of one backpressure CHP unit and one extraction-condensing CHP unit), 220MW for the wind farm, and 100MW for the solar power station. The carbon trading prices are set at 90 yuan/ton for both traditional carbon trading and tiered carbon trading, with an interval length ( $l$ ) of 200 tons and a price growth rate ( $\alpha$ ) of 25%. The parameters of the VPP system equipment are shown: the coal consumption characteristics of the CHP units are shown in Table 1, and the environmental cost parameters are shown in Table 2. The electricity and gas prices of the VPP are shown in Figure 3, with a heat price of 90 yuan/MWh. The calculations were performed on a computer equipped with an Intel Core i7-10750H 2.60GHz processor and 16GB of memory. The model was developed using MATLAB and solved using a genetic algorithm.

The coal consumption characteristics parameters of the two CHP units are shown in Table 2.

**Table 1.** Coal Consumption Characteristics Parameters of CHP Units.

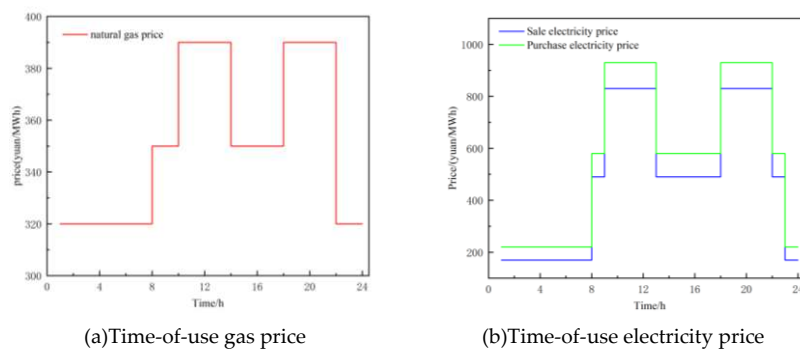
Generator Unit	$c_0$	$c_1$	$c_2$	$c_3$	$c_4$	$c_5$
CHP1	12	0.03	0.02	0.0013	0.0017	0.00012
CHP2	25	0.012	0.016	0.0012	0.0048	0.00013

The environmental cost parameters associated with pollutants generated by the two CHP units are shown in Table 2.

**Table 2.** Environmental Cost Parameters of VPP.

contaminant	$d_{eij}/(\text{kg}/(\text{MWh}))$	$V_{eij}/(\text{yuan}/\text{kg})$	$V_{ij}/\text{yuan}$
SO <sub>2</sub>	6.48	6.4	1.0
NO <sub>x</sub>	2.88	8.0	2.0
CO <sub>2</sub>	623	0.044	0.01
CO	0.1083	1.0	0.16

The energy price of VPP, as shown in Figure 4, mainly includes natural gas prices, selling electricity prices, and purchasing electricity prices.



**Figure 4.** VPP energy price chart.

#### 4.2. Scenario Setting

To verify the effectiveness and rationality of considering hydrogen energy storage and stepped carbon trading in the VPP optimization scheduling model, the CCS equipment was installed on the CHP unit, and the following three scenarios were set for simulation under the input data of wind and solar load forecasts for the cooling season, transition season, and heating season. Finally, the scheduling results were analyzed to provide corresponding scheduling strategies.

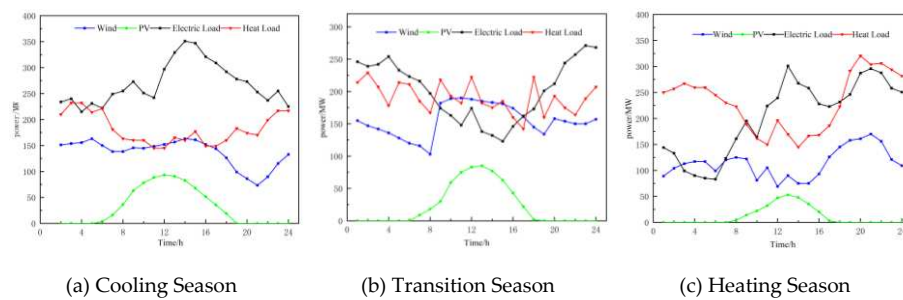
Scenario 1. The CHP unit is decoupled with electric boilers and without hydrogen energy storage, considering traditional carbon trading mechanisms.

Scenario 2. The CHP unit is decoupled with electric boilers and with hydrogen energy storage, considering traditional carbon trading mechanisms.

Scenario 3. The CHP unit is decoupled with electric boilers and with hydrogen energy storage, considering stepped carbon trading mechanisms.

#### 4.3. Analysis of Scheduling Results under Different Scenarios

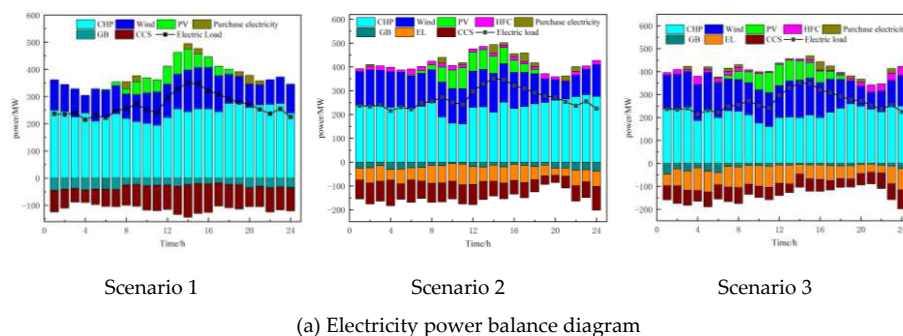
The predicted data for wind power, photovoltaic power, electric load, and heat load for the cooling season, transition season, and heating season are shown in Figure 5. By comparing the VPP's electricity and heat sales revenue, fuel costs, wind and solar curtailment costs, and carbon emissions under the three scenarios set in the three seasons, the optimal scheduling strategy was selected and analyzed.



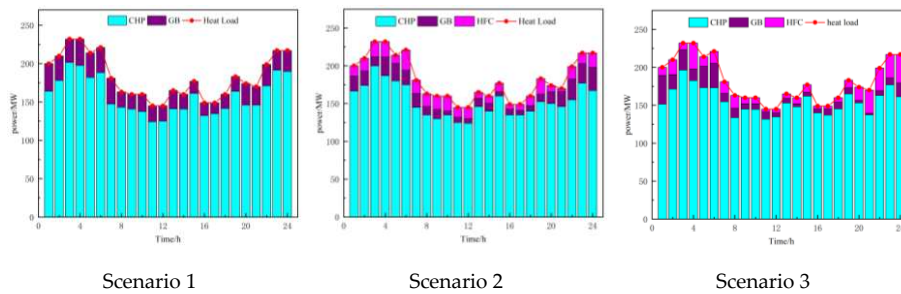
**Figure 5.** Electric heating load demand and wind-solar power generation prediction curves in different seasons.

##### 4.3.1. Analysis of Scheduling Results during the Cooling Season

The analysis of scheduling results during the cooling season is shown in Figure 6, which displays the electric power and heat power balance in three different scenarios. The parameter comparison of VPP revenue under different scenarios is presented in Table 3.



(a) Electricity power balance diagram



(b) Thermal power balance diagram

Figure 6. Power Balance Chart of Electricity and Heat during the Cooling Season.

Table 3. Parameter Comparison of VPP Revenue under Different Scenarios during the Cooling Season.

	Revenue from sales of electricity, heat and gas/ $\times 10^4$ yuan	Fuel cost/ $\times 10^4$ yuan	Purchase cost of electricity/ $\times 10^4$ yuan	Cost of wind and solar power curtailment/ $\times 10^4$ yuan	Carbon trading cost/ $\times 10^4$ yuan	Carbon emission s/t	Net income/ $\times 10^4$ yuan
Scenario 1	279.89	98.67	10.99	19.73	16.32	1272	97.21
Scenario 2	266.73	74.74	13.85	17.17	11.7	1157	126.10
Scenario 3	264.41	66.11	8.50	9.83	6.59	733	146.25

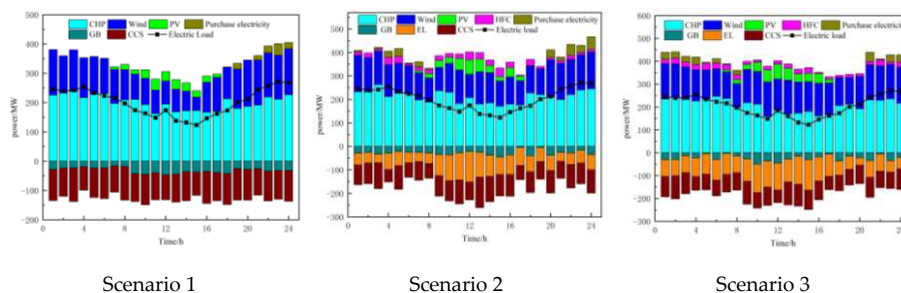
Combining Figure 6 and Table 3, it can be observed that due to the "heat-driven electricity" constraint, the output power of the combined heat and power (CHP) units cannot be reduced, resulting in a large amount of curtailed wind and solar power in Scenario 1. This leads to significant curtailment costs. In Scenario 2, the introduction of a hydrogen energy storage system allows for greater integration of wind and solar power during periods of high generation. During peak load periods, the system can release electricity and heat, reducing the output of CHP units and thus lowering fuel costs. As a result, the fuel cost in Scenario 2 is reduced by 24.25%. However, the introduction of the hydrogen energy storage system leads to a 4.7% decrease in revenue from selling electricity, heat, and gas due to considerations of its operation and maintenance costs. In order to reduce carbon emissions, the purchasing cost of electricity increases by 26%. Additionally, the costs and emissions associated with carbon trading decrease by 28.43% and 9.04% respectively. Despite the decrease in revenue from selling electricity, heat, and gas, the net profit increases by 29.71%. In Scenario 3, an optimized carbon trading mechanism is introduced based on Scenario 2, which further reduces the fuel cost by 11.55% and increases the integration of wind and solar power, leading to a 4.27% reduction in curtailment costs. The purchasing cost of electricity decreases by 38.62%, and the costs and emissions associated with carbon trading decrease by 43.67% and 36.64% respectively. Although there is a 0.87% decrease in revenue from selling electricity, heat, and gas, the overall net profit increases by 15.6%. Therefore, under cooling season conditions, it can be concluded that the proposed model in this paper can increase the integration of wind and solar power, reduce carbon

emissions, and improve the economic benefits of the virtual power plant (VPP), demonstrating its practicality.

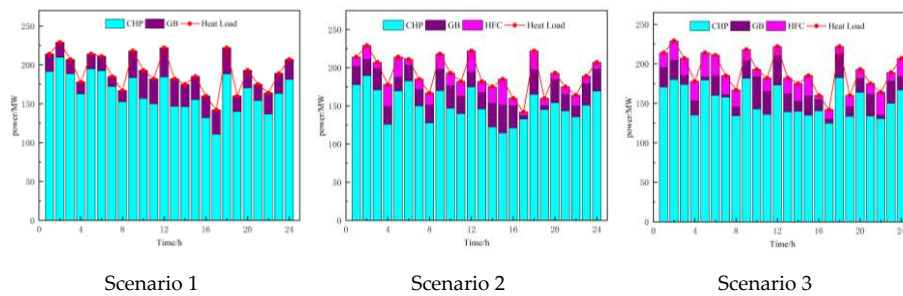
As shown in Figure 6, the power balance diagram for Scenario 3 is as follows: From 1:00 to 5:00, when the photovoltaic (PV) power is zero and the wind power is relatively low while the heat demand and electricity load are high, wind power is fully absorbed. The absorbed wind power is used for heat generation through an electric boiler and supplied by a combined fuel cell to reduce the heat output of the CHP units. This not only reduces the fuel cost but also enhances the flexibility and peak shaving capability of the system. The remaining wind power is consumed through electrolyzers and carbon capture devices to maintain a low-carbon level. Due to the need to maintain the power balance, the VPP purchases a small amount of electricity from the main grid. From 6:00 to 14:00, the heat demand decreases sharply and reaches a low point, while the electricity load increases rapidly and enters a peak period. At this time, due to the low heat demand and the constraint of "heat-driven electricity," the fuel cell and electric boiler outputs are limited by the minimum heat output of the CHP units. As a result, the heat output of the CHP units is low, leading to a decrease in electricity output and a reduction in carbon emissions. The carbon capture output decreases, and the electrolyzer output increases to consume the remaining wind and solar power. Additionally, more hydrogen gas is produced for methane synthesis to improve the profitability of selling gas. In order to maintain the power balance, the VPP experiences occasional curtailment and purchases a small amount of electricity. From 15:00 to 20:00, the electricity load decreases rapidly, and the heat demand gradually increases. At the same time, the power output of PV and wind decreases. This leads to an increase in the heat output of the CHP units. The electric boiler and fuel cell increase their heat outputs to reduce the heat output of the CHP units, resulting in a decrease in carbon capture output. The electricity output of the CHP units increases, and to maintain the power balance, the VPP has to purchase electricity from the main grid. This occurs during a period of high electricity prices, resulting in higher purchasing costs. From 21:00 to 24:00, the electricity load continues to decrease, the heat demand increases, and the wind power also increases. The PV power is zero at this time. The fuel cell bears most of the remaining heat demand, and the VPP has high electricity and heat outputs, leading to higher carbon emissions. Therefore, the carbon capture device output increases, while the electrolyzer output decreases. There is no wind curtailment, but there are occasional small amounts of electricity purchases. Although this reduces the economic efficiency, the purchasing cost is still lower compared to Scenarios 1 and 2, resulting in overall higher net economic benefits. Based on the above analysis, it can be concluded that the proposed model in this paper can increase the integration of wind and solar power, reduce carbon emissions, and improve the economic benefits of the VPP under cooling season conditions.

#### 4.3.2. Analysis of Scheduling Results during the Transition Season.

The analysis of scheduling results during the transition season is shown in Figure 7, which displays the electric power and heat power balance in three different scenarios. The parameter comparison of VPP revenue under different scenarios is presented in Table 4.



(a) Electricity power balance diagram



(b) Thermal power balance diagram

Figure 7. Power Balance Chart of Electricity and Heat during the Transition Season.

Table 4. Parameter Comparison of VPP Revenue under Different Scenarios during the Transition Season.

Scenario	Revenue from sales of electricity, heat and gas/ $\times 10^4$ yuan	Fuel cost/ $\times 10^4$ yuan	Purchase cost of electricity/ $\times 10^4$ yuan	Cost of wind and solar power curtailment/ $\times 10^4$ yuan	Carbon trading cost/ $\times 10^4$ yuan	Carbon emissions /t	Net income/ $\times 10^4$ yuan
Scenario 1	342.52	137.10	6.76	29.57	14.76	1070	125.63
Scenario 2	324.85	107.19	13.27	19.72	8.85	960	155.81
Scenario 3	323.84	99.21	9.01	14.12	5.31	589	174.89

Based on Figure 7 and Table 4, it can be seen that due to the "heat-first, electricity-second" principle, the output of the CHP unit cannot be reduced, which leads to a large amount of wind and solar power being wasted during periods of low electricity demand. In particular, there is a long period of wind power curtailment during the transition season, resulting in high costs for wind and solar power curtailment, as well as high fuel costs and carbon emissions in Scenario 1. Scenario 2 introduces a hydrogen energy storage system, which can absorb excess wind and solar resources, increase the consumption of wind and solar power, and reduce the electricity and heat output of the CHP unit, thereby reducing the carbon emissions of the VPP. Compared with Scenario 1, the fuel costs, wind and solar power curtailment costs, carbon trading costs, and carbon emissions are reduced by 21.82%, 33.31%, 33.85%, and 10.28%, respectively, while the revenue of the VPP increases by 24.02%. In Scenario 3, an optimized CHP output is achieved through a stepped carbon trading mechanism, resulting in a further reduction in fuel costs, carbon emissions, carbon trading costs, wind and solar power curtailment costs, and electricity purchases, while net income increases by 12.24%. The electric heat power balance diagram in Scenario 3 shows that during the 1:00-8:00 period, the PV output is almost zero, wind power gradually decreases, and the heat load fluctuates within a small range at a high level. The electric boiler consumes some of the wind power and converts it into heat energy, while the rest of the wind power is consumed by the carbon capture and electrolysis facilities. To maintain heat power balance and reduce the heat output of the CHP unit, the fuel cell output is high, generating a large amount of heat and electricity to meet the demand. However, due to the high electric and heat output, the carbon emissions of the VPP remain high, which requires the carbon capture and electrolysis facilities to increase their output to reduce carbon emissions, resulting in insufficient wind and solar power to meet the electricity demand. Therefore, the VPP has to

purchase electricity from the main grid, increasing its purchase cost. During the 9:00-16:00 period, the electricity demand continues to decrease and remains at a low level throughout the day. The PV output slowly increases, but wind power rapidly increases and remains at a high level. The heat load still fluctuates within a small range, and the electric boiler output increases, while the fuel cell output decreases and the electrolysis output increases to consume more wind and solar power. However, due to the "heat-first, electricity-second" principle of the CHP unit and the capacity constraints of the electrolysis equipment, wind and solar power curtailment occurs, increasing the cost of wind and solar power curtailment. During the 17:00-24:00 period, the electricity demand rapidly increases again, while the heat load still fluctuates within a small range. The PV output gradually decreases to zero, and wind power also decreases. At this time, the electric boiler output decreases, and the fuel cell burns a large amount of hydrogen to provide heat and electricity, increasing the flexibility and adjustability of the CHP unit's electricity output. However, due to the high output of the CHP unit, the carbon emissions of the VPP remain high. To maintain a low level of carbon emissions, the carbon capture facility output increases, while the hydrogen storage tank and electrolysis output supply more hydrogen to promote CO<sub>2</sub> methanation, reducing carbon emissions while also increasing gas sales revenue. In some periods, wind and solar power curtailment and electricity purchases still occur, but compared with Scenario 2, the amount of wind and solar power curtailment and electricity purchases is smaller, resulting in higher net income. In conclusion, the VPP low-carbon economic dispatch model established in this paper still has high economic benefits and carbon emission reduction capabilities when used as input during the transition season.

#### 4.3.3. Analysis of Scheduling Results during the Heating Season

The analysis of scheduling results during the heating Season is shown in Figure 8, which displays the electric power and heat power balance in three different scenarios. The parameter comparison of VPP revenue under different scenarios is presented in Table 5.

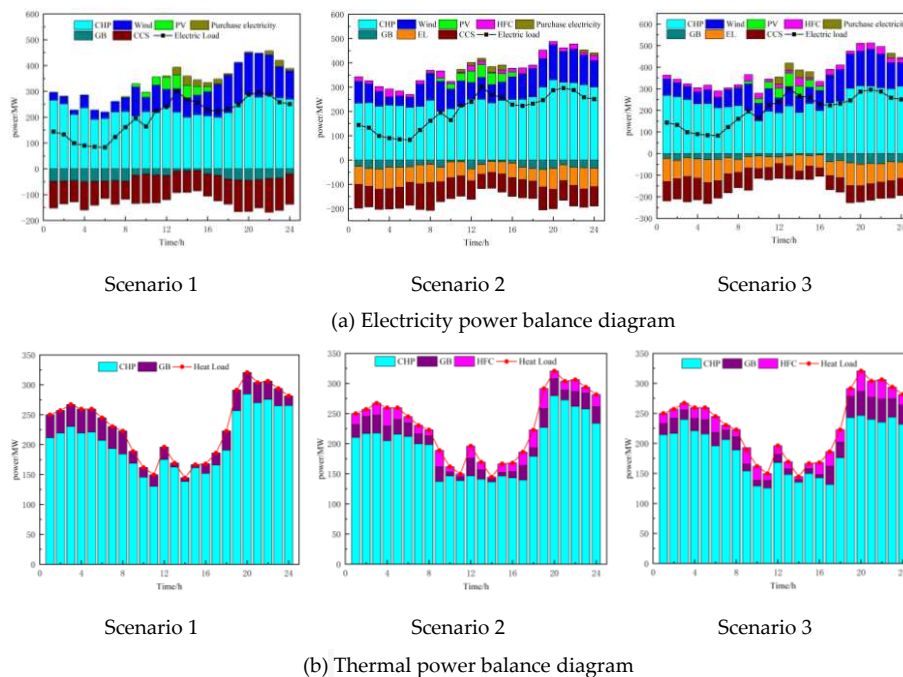


Figure 8. Power Balance Chart of Electricity and Heat during the Cooling Season.

**Table 5.** Parameter Comparison of VPP Revenue under Different Scenarios during the Cooling Season.

	Revenue from sales of electricity, heat and gas/ $\times 10^4$ yuan	Fuel cost/ $\times 10^4$ yuan	Purchase cost of electricity/ $\times 10^4$ yuan	Cost of wind and solar power curtailment/ $\times 10^4$ yuan	Carbon trading cost/ $\times 10^4$ yuan	Carbon emissions/t	Net income/ $\times 10^4$ yuan
Scenario 1	312.80	116.86	13.01	15.13	19.23	1356	148.78
Scenario 2	301.13	94.16	7.16	12.09	12.51	1042	167.79
Scenario 3	297.02	80.77	11.36	7.82	6.92	767	177.67

Based on Figure 8 and Table 5, it can be seen that in Scenario 1, which only includes electric boilers and carbon capture, all costs are higher than the other two scenarios. In contrast, Scenarios 2 and 3 incorporate hydrogen energy storage systems, resulting in a higher consumption of wind and solar resources and a decrease in CHP unit's heat and power output. This reduces the cost of curtailed wind and solar energy, as well as fuel costs. Compared to Scenario 1, Scenario 2's fuel costs decreased by 19.42%, while its carbon trading costs and emissions decreased by 34.94% and 23.16%, respectively, and VPP's net income increased by 12.77%. Compared to Scenario 2, Scenario 3 introduces a tiered carbon trading mechanism that optimizes CHP output, reducing carbon emissions and trading costs. Fuel costs decreased by 14.22%, curtailed wind and solar energy costs decreased by 35.3%, and carbon trading costs and emissions decreased by 44.68% and 26.39%, respectively. Although Scenario 3 resulted in an increase in purchased electricity costs by 58.65%, the net income still increased by 5.88%. Therefore, the VPP low-carbon economic dispatch model established in this paper can optimize the output of VPP equipment, reduce operating costs and carbon emissions, and improve economic benefits during the heating season. Figure 8's power balance diagram for Scenario 3 shows that during the 1:00-8:00 period, the electrical load first decreases and then rapidly increases, while the thermal load is in the early peak period and gradually decreases. At this time, the photovoltaic output is almost zero, and wind power output is low and slowly increasing. Due to the high thermal load, the electric boiler converts wind power into heat, while the fuel cell burns hydrogen to generate heat and electricity to meet the demand for electric heat load. However, due to the thermal load being high and electric load being low, a large amount of wind power is curtailed, resulting in high curtailed wind and solar energy costs, although still lower than Scenarios 1 and 2. During the 9:00-13:00 period, the electrical load rapidly increases and is in the first peak period of the day, while the thermal load is at its lowest point. Meanwhile, the photovoltaic power output gradually increases to its peak, and wind power begins to fluctuate and decrease. Due to the reduced thermal load, the capacity for the electric boiler and fuel cell to convert heat into electricity is reduced, limiting their ability to consume wind and solar energy. CHP unit's power output decreases, reducing carbon emissions, and thus carbon capture output also decreases. However, due to the high electrical load, wind and solar energy shortages occur, and VPP has to purchase electricity from the main grid to maintain power balance. During the 14:00-20:00 period, the thermal load rapidly increases and is in the peak period, while the electrical load first decreases and then slowly increases, also in the second peak period. At this time, wind power also starts to increase and is in the peak period of the day, while photovoltaic power gradually decreases to zero. Due to the rapid increase in thermal load, the electric boiler consumes more wind power, and the fuel cell burns more hydrogen to reduce CHP

heat output and decouple heat and electricity to maintain CHP unit's flexibility and peak-shaving capabilities. However, CHP unit's heat and power output still slowly increase, resulting in VPP's highest carbon emissions of the day. Carbon capture output and electrolysis cell output increase to reduce carbon emissions, and hydrogen is produced to supply the fuel cell and methane generator to reduce system carbon emissions and increase gas sales revenue. Although wind power is fully consumed at this time, there is still a shortage of electricity, and VPP has to purchase electricity from the main grid, resulting in higher purchased electricity costs during this period. During the 21:00-24:00 period, the thermal load, electrical load, and wind power output all begin to decrease, and the photovoltaic output is zero. The electric boiler output decreases slightly, while the hydrogen fuel cell output increases to reduce CHP heat output and decouple heat and electricity. However, due to the high thermal load, CHP heat output remains high, and there is also a high demand for electricity, resulting in high carbon emissions for VPP. Carbon capture output and electrolysis cell output increase to reduce carbon emissions, and hydrogen is produced to supply the fuel cell and methane generator to reduce system carbon emissions and increase gas sales revenue. Although wind power is fully consumed during this period, there is still a shortage of electricity, and VPP has to purchase electricity from the main grid, resulting in higher purchased electricity costs. However, compared to the first two scenarios, Scenario 3 still has higher net income.

In summary, this section compares three different scenarios with the same load input during the power supply season, transition season, and heating season by establishing a VPP low-carbon economic dispatch model that considers hydrogen energy storage and tiered carbon trading. The results show that the model has high practicality during all three seasons, reducing VPP carbon emissions, increasing wind and solar consumption, and improving net income.

#### 4.4. Sensitivity Analysis of VPP System Parameters

Hydrogen energy plays a crucial role in decoupling the heat and power coupling mode of CHP units, strengthening the coupling of electric and thermal loads, and improving the consumption of new energy sources in this paper. Similarly, different parameters of carbon trading mechanisms can directly affect the internal operation of VPP. Therefore, this section focuses on the impact of these parameters on VPP's carbon emissions and net profits. Using wind and solar load forecasting data for the transition season, simulation analysis was conducted under Scenario 3, and the results are shown in Figures 9 and 10.

##### 4.4.1. Sensitivity Analysis of Hydrogen Energy Storage System Equipment Capacity

The capacity of various hydrogen energy storage system equipment (electrolysis cell and hydrogen fuel cell) on the economic benefits and carbon emissions of VPP were studied, and the results are shown in Figure 8.

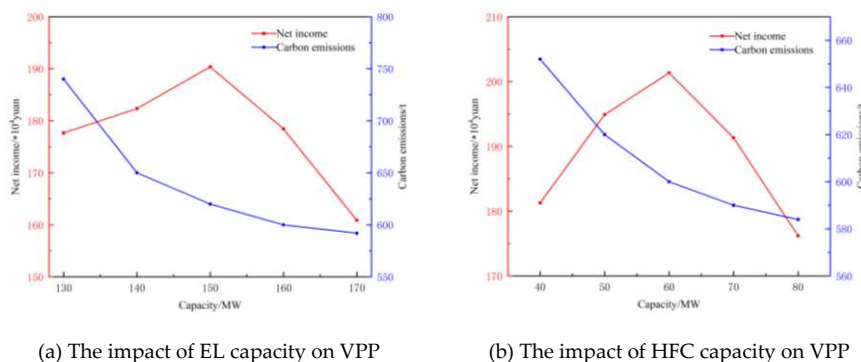


Figure 8. The impact of hydrogen energy storage on VPP.

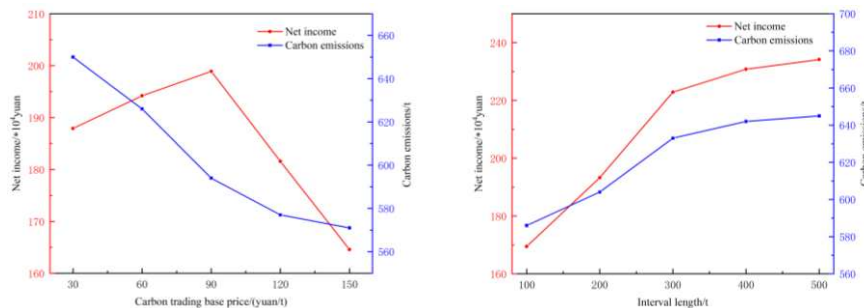
As shown in Figure 8(a), when the capacity of the electrolyzer is less than 150MW, as the configured capacity increases, more hydrogen is produced by electrolysis, and the fuel cell burns more hydrogen to generate electricity and heat, increasing the consumption of new energy and rapidly reducing the system's carbon emissions. The benefits generated are greater than the operational costs, resulting in an increase in the VPP's net income. When the capacity exceeds 150MW, although more hydrogen is produced, it cannot be fully utilized due to the limitations of the fuel cell and hydrogen storage tank, resulting in waste of hydrogen resources and electrolyzer capacity, and the rate of carbon emission reduction slows down. Moreover, the operational costs exceed the benefits generated, leading to a decrease in the VPP's net income.

As shown in Figure 8(b), when the capacity of the fuel cell is less than 60MW, as the configured capacity increases, the fuel cell can burn more hydrogen to generate more electricity and heat, reducing the output of the CHP unit and increasing the sales revenue of the VPP for electricity and heat, while also reducing carbon emissions. When the capacity exceeds 60MW, although the configured capacity increases, it is limited by the electrolyzer and hydrogen storage tank, and the operational costs increase significantly, resulting in a decrease in the VPP's net income. Although carbon emissions still decrease, the rate of reduction slows down and gradually approaches saturation.

According to the above analysis, from the perspective of carbon emission reduction and increasing the consumption of new energy, it can be concluded that when the configured capacity of the electrolyzer is greater than 150MW and the hydrogen fuel cell capacity is greater than 60MW, the VPP's net income is maximized, and the carbon emissions are moderate. Further increasing the configured capacity will only lead to a decrease in the system's net income and waste of capacity. Therefore, a reasonable setting of the capacity of the hydrogen energy storage system equipment can effectively guide the VPP's carbon emissions, net income, and consumption of new energy.

#### 4.4.2. Sensitivity Analysis of Carbon Trading Parameters

Now, we mainly analyze the impact of carbon trading benchmark price and carbon emission interval length on system carbon emissions and net income. The results are shown in Figure 9.



(a) The impact of carbon trading benchmark price on VPP

(b) The impact of interval length on VPP

**Figure 9.** The impact of parameterization in the form of tiered carbon trading on VPP.

As shown in Figure 9(a), when the carbon trading benchmark price is greater than 90 yuan/t, as the carbon trading benchmark price increases, the proportion of carbon emission target cost also increases, and the role of carbon trading cost becomes stronger. VPP has to reduce carbon emissions to reduce carbon trading costs, so the carbon emissions also begin to rapidly decrease, and VPP's profits also rapidly decrease. When the carbon trading benchmark price is less than 90 yuan/t, although the carbon trading price increases, the price is still relatively low, and VPP's carbon

emissions increase. However, from the overall trend, the carbon trading price has a relatively large impact on the system's carbon emissions and net income. Therefore, from a long-term perspective, a reasonable carbon trading price will have broader application prospects in reducing carbon emissions.

As shown in Figure 9(b), when the interval length is less than 400t, as the interval length increases, the carbon trading price is at a low level because the increasing interval length reduces the punishment intensity of stepped carbon trading. VPP's carbon emissions also rapidly increase, and VPP's net income also increases. When the interval length is greater than 400t, carbon emissions are traded based on the benchmark price and the first gradient price, and the impact of the interval length on carbon emissions is relatively small. Stepped carbon trading is transformed into fixed carbon trading, and VPP's carbon emissions and net income slowly increase and tend to stabilize.

From the above analysis, it can be concluded that from the perspective of current energy conservation and emission reduction, when the carbon trading benchmark price is greater than 90 CNY/t, VPP's net income reaches its maximum. Although increasing the carbon benchmark price will continue to reduce carbon emissions, it will also lead to a sharp decline in VPP's net income. When the interval length is less than or equal to 400t, VPP's carbon emissions and net income rapidly increase, while when the interval length is greater than 400t, the system's carbon emissions and net income slowly increase and tend to stabilize. Therefore, setting a reasonable carbon trading benchmark price and interval length can reasonably guide the system's carbon emissions, achieve a balance between VPP's low-carbon operation and economic operation.

## 5. Conclusion

This paper proposes an optimization and scheduling strategy for virtual power plants (VPPs) considering the complementary use of electric and thermal energy and the decarbonization of energy in multiple scenarios. By enabling the collaborative operation of multiple devices, the VPP achieves energy complementarity and optimized scheduling, leading to carbon reuse. The following conclusions can be drawn from the proposed scheduling strategy:

(1)Introducing hydrogen energy storage systems and a tiered carbon trading mechanism based on carbon capture facilitates carbon reuse. On one hand, it reduces carbon emissions from the VPP and increases the integration of renewable energy. On the other hand, the generated methane can be supplied to the natural gas consumption system, further enhancing the economic benefits of the VPP.

(2)Through the collaborative operation of multiple units, the coupling of hydrogen energy storage and electric boilers enables the decoupling of heat and power in combined heat and power (CHP) units. This effectively optimizes the output of CHP units, improves their operational flexibility and peak shaving capabilities, reduces coal consumption costs, lowers carbon emissions, enhances the utilization of renewable energy generation, and mitigates the contradiction between renewable energy generation and electricity demand. It achieves a balance between supply and demand, optimizes the energy structure of the VPP, and improves its economic benefits.

(3)Sensitivity analysis of the VPP's low-carbon economic conditions is conducted by considering different parameters for tiered carbon trading and the capacity of hydrogen energy storage devices. The results demonstrate that reasonable parameter settings and capacity configurations are more conducive to reducing carbon emissions and increasing the economic benefits of the VPP.

(4)Lastly, three scenarios are established to comprehensively compare the scheduling results of different scenarios in the same season, considering different load inputs. This validates the practicality of the proposed model and demonstrates that the optimization and scheduling approach has high generality and economic benefits, effectively improving the VPP's ability to integrate renewable energy generation and reduce carbon emissions.

However, this paper only considers measures to reduce carbon emissions from the supply side and does not address the demand response from the load side. Demand response has gradually matured and is of great significance for energy conservation, emission reduction, and promoting the integration of renewable energy. To tap into the resources on the load side, it is necessary to incorporate demand response into the VPP's low-carbon economic scheduling model, treating VPP

devices as dispatchable assets. This enables source-load interaction and further "peak shaving and valley filling" through demand response, reducing carbon emissions in the VPP, increasing the integration of renewable energy, enhancing the operational flexibility of the VPP, and reducing the impact of fluctuations in wind and solar energy.

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