



# Potential Analysis and Optimization of Combined Cooling, Heating, and Power (CCHP) Systems for Eco-Campus Design Based on Comprehensive Performance Assessment

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Liu Z, Gao W, Qian F, Zhang L and Kuroki S (2021) Potential Analysis and Optimization of Combined Cooling, Heating, and Power (CCHP) Systems for Eco-Campus Design Based on Comprehensive Performance Assessment. Front. Energy Res. 9:781634. doi: 10.3389/fenrg.2021.781634 At present, countries all around the world have implemented energy-saving and emission reduction measures to achieve carbon neutralization. The combined cooling, heating, and power (CCHP) system is a high-efficiency energy system that can promote energy-saving and decrease carbon emissions. The choices of installed capacity and operation strategies impacts the economy, energy-saving, and environmental protection of combined cooling, heating, and power systems. The aim of this study was to determine the potential and comprehensive benefits of combined cooling, heating, and power systems based on the comprehensive performance assessment. In this study, a comprehensive performance index (CPI) method was presented to optimize the configurations and operation strategies of combined cooling, heating, and power systems in a Japan eco-campus, based on historically monitored data. According to the influencing factors of the combined cooling, heating, and power system in comprehensive performance index evaluation, the adaptability and development potential of economy, energy saving, and CO<sub>2</sub> emission reduction were evaluated to consider future renovation of energy systems. In this study, we adopted a seasonal time-of-use (STOU) electricity price to evaluate the economic performance of combined cooling, heating, and power systems and compared them to the time-of-use (TOU) electricity price. The results indicated that the seasonal time-ofuse electricity price was more economic in regions that had high cooling demand in summer. By comparing the CO<sub>2</sub> emission coefficient of electricity in different regions in Japan, we could estimate that more than 40% of the cleaner energy ratio was positive. The results obtained can provide suggestions for the future development of combined cooling, heating, and power systems.

Keywords: optimization model, comprehensive performance index (CPI), seasonal time-of-use (STOU) electricity price, sensitivity analysis, combined cooling, heating, power (CCHP) system

## INTRODUCTION

Owing to the continuous growth in the world's energy demand, the problems of energy consumption, greenhouse gas emission, and environmental pollution have become increasingly prominent (Jing et al., 2018). Combined cooling, heating, and power (CCHP) system has been recognized as an efficient and economic method to realize the integration of power generation, cooling, and heating through the cascade utilization of energy; notably, the comprehensive energy utilization efficiency of the system can reach 85% (Papadimitriou et al., 2020). There are various types of equipment in CCHP systems, and there is a coupling relationship between the equipment (Wu and Wang 2006). The equipment installed capacity and operation strategy have a significant impact on the economic and environmental benefits and energy efficiency of the systems. The configuration of equipment is crucial in such cases. Unreasonable configuration of equipment types and excessive capacity can lead to the waste of investment and low utilization efficiency of systems, whereas undersized capacity cannot meet the demand of the building in the area load demand, which may lead to an increase (rather than decrease) in energy consumption. At present, the economic benefits of CCHP systems are greatly reduced due to the mismatch of installed capacity (Lin et al., 2020). Therefore, to improve the performance of CCHP systems, the capacity and operation optimization of CCHP systems has become an important research direction.

Numerous studies have been conducted on the optimization of CCHP systems. Wang et al. (Wang et al., 2010a) optimized the capacity of power generation unit (PGU) selected in the design period and the fixed ratio of electric cooling to cool demand used in operation period. Ren et al. (Ren and Gao 2010) optimized the configuration and technology combination alternatives by minimizing the total energy cost. Furthermore, Ren et al. (Ren et al., 2021) optimized the hybrid CCHP systems for three buildings (hotel, office, and market) under different operation strategies. Kim et al. (Kim et al., 2019) selected the capacity of PGUs, value of thermal storage system, cooling/heating capacity ratio supplied by electrically driven systems, and maximum heat power from the storage system as the decision variables to optimized the CCHP system.

Notably, different optimization algorithms were applied to CCHP systems. Wang et al. (Wang et al., 2010b) employed particle swarm optimization algorithm (PSOA) to optimize the capacity of PGUs and heat storage tank, on-off coefficient of PGU, and ratio of electric cooling to cooling load. Sanaye et al. (Sanaye and Khakpaay 2014) optimized the capacity of gas engine, backup boiler, energy storage tank, electrical and absorption chiller by combining an optimization algorithm with the maximum rectangle method. Kong et al., (Kong et al., 2009) adopted a non-linear-programming (NLP) costminimization optimization model to determine the operation strategies for the CCHP system. Bischi et al. (Bischi et al., 2014) employed mixed integer nonlinear programming (MINLP) to determine an operating schedule. Cao et al. (Cao et al., 2020) used owl search algorithm (OSA) to increase the efficiency of the CCHP system, in comparison with the separation production

system. Ghersi et al. (Ghersi et al., 2021) adopted genetic algorithm (GA) to optimize the capacity of the CCHP system.

Conventional optimization is based on economy, and the most important parameter affecting economy is electricity price. Different electricity price mechanisms have different effects on the investment cost, operating cost, and energy saving of the CCHP system. Generally, to simplify calculations, most researchers used a fixed electricity price mechanism (Li et al., 2020; Soltani et al., 2020). Some researchers used time-of-use (TOU) electricity price to improve CCHP system utilization efficiency and reduce investment and operating costs (Wu et al., 2014). However, only a few studies have been conducted on the STOU electricity price mechanism. Seasonal price refers to an electricity price mechanism that reflects the cost of power supply in different seasons. The main purpose is to suppress the excessively rapid growth of electricity load during peak seasons to reduce investment and operating costs. However, only a few studies have been conducted on the combination of peak-valley and seasonal electricity price mechanisms.

Sensitivity analysis determines the change of decision evaluation criteria by changing one or more uncertainties. Yan et al. (Yan et al., 2016) and Zheng et al. (Zheng et al., 2018) analyzed the sensitivity of electricity price and natural gas price and explained the changes in important criteria at different prices. Zhang et al. (Zhang et al., 2020) analyzed the performance of the CCHP system and deduced that it can be improved by changing the electricity price, natural gas price, investment subsidy, and carbon tax. Delgado et al. (Delgado et al., 2017) analyzed the sensitivity of interest rate, heat export, and energy price escalation rates to address the behavior of the results due to changes in the economic context.

In addition to economic performance, the influencing factors of CCHP systems are also very important for energy saving and emission reduction (Wei et al., 2016). Therefore, it is essential to evaluate the comprehensive performance assessment of CCHP systems. Tamjidi et al. (Farahbakhsh and Chahartaghi 2020) assessed the payback period and profitably index of a novel integrated CCHP system from energy and economic perspectives. Li et al. (Li et al., 2019) presented a CCHP and ground source heat pump (GSHP) coupling system equipped with a heat exchanger and used life cycle cost saving rate and primary energy consumption saving ratio compared with separated generation system. Additionally, Wang et al. (Wang et al., 2011) used a comprehensive evaluation index to optimize the PGU capacity and the ratio of electric cooling to the cooling load.

As mentioned above, although many studies have focused on CCHP system optimization, there is still a lack of knowledge about the comprehensive performance analysis of the system to improve its development potential. The purpose of this study is to consider the comprehensive performance assessment of energy conservation and environmental protection and discuss the impact of different electricity price mechanisms on the development of CCHP system. In this study, the GA method was used to optimize the capacity of PGU and operation strategies for CCHP systems. Then, the economy, energy saving, and  $CO_2$  emission reduction of the CCHP system were analyzed. Finally,



we conducted the sensitivity analysis of energy price and  $CO_2$ emission reduction. This study is organized as follows: *Methods* section introduces the energy flow of the CCHP and separated production (SP) systems and puts forth the evaluation index of CCHP systems and genetic algorithm (GA) optimization method used in our study. *Case Study* section introduces a case study and the corresponding parameters of a CCHP system. Section 4 analyzes the operation strategies, comprehensive performance, and sensitivity analysis of energy price and  $CO_2$  emission reduction potential of CCHP systems. The conclusions are provided in Section 5.

### METHODS

#### Energy Flow of CCHP and SP Systems

Firstly, the model of CCHP systems and SP systems were established and the decision variables were proposed. Then a single objective comprehensive evaluation system was established for assessing cost saving, energy saving, and  $CO_2$  emission reduction. Finally, the GA was used to optimize the CCHP and SP systems.

The energy flow of CCHP systems and SP systems was introduced, which was then, used to calculate the power generation, energy consumption, and capacity of a power generation unit (PGU) and auxiliary equipment to obtain the optimal result of these systems.

The CCHP system used in our study was driven by PGU, as shown in **Figure 1A**. Natural gas was supplied to PGU to produce electricity. Considering the optimal economy for users, the power generated by PGU is supplied directly to users. If generated power cannot meet the electricity demand, the shortage of power can be purchased from the power grid. The exhaust heat from PGU was recovered by the heat recovery unit, and then the steam generated by the heat recovery unit is used as a heat source to heat the heat exchanger to meet the heat demand of users. When the recovered heat could not meet the heating demand, sufficient heat was provided by the auxiliary boiler. The cooling demand was provided by a heat recovery unit through an absorption chiller, and the insufficient cooling was supplied by the electric chiller.

As shown in **Figure 1B**, the electricity demand of SP systems was supplied by the power grid, cooling demand was supplied by the electric chiller, and the heating demand was supplied by a gas boiler.

The balance of the electricity demand of CCHP systems is expressed as follows:

$$E_{grid} + E_{pgu} = E + E_{ec} , \qquad (1)$$

where  $E_{grid}$  is the electricity purchased from the power grid (kWh), (due to it is not easy to dispose of excess electricity in remote regions or in regions where the excess electricity is not allowed to be sold to the power grid; therefore, we do not consider selling the excess electricity to the power grid.);  $E_{pgu}$  is the electricity generated by the PGU (kWh); *E* is the electricity demand of the building (equipment, lights, etc.) (kWh), and  $E_{ec}$  is the electricity consumed by the electric chiller.

The fuel energy consumption of the PGU,  $F_{pgu}$  (kWh), was estimated using the following equation:

$$F_{pgu} = \frac{E_{pgu}}{\eta_{pgu}},\tag{2}$$

where  $E_{pgu}$  is the electricity generated by the PGU (kWh);  $\eta_{pgu}$  is the power generation efficiency of PGU.

The waste heat generation of PGU,  $Q_r$  (kWh), was estimated using the following equation:

$$Q_r = F_{pgu} \times \left(1 - \eta_{pgu}\right) \times \eta_r,\tag{3}$$

where  $F_{pgu}$  is the fuel energy consumption of the PGU (kWh);  $\eta_{pgu}$  is the power generation efficiency of PGU;  $\eta_r$  is the efficiency of the heat recovery unit.

The waste heat from the PGU was used to cover the cooling and heating demand and can be expressed as follows:

$$Q_{ac} = Q_r \times COP_{ac} , \qquad (4)$$

$$Q_{he} = Q_r \times \eta_{he},\tag{5}$$

where  $Q_{ac}$  and  $Q_{he}$  are the cooling load produced by the absorption chiller and the heating load produced by the heat exchanger, respectively (kWh);  $COP_{ac}$  is the coefficient of performance (COP) of the absorption chiller;  $Q_r$  is the waste heat generation of PGU (kWh), and  $\eta_{he}$  is the efficiency of the heat exchanger.

$$Q_{ac} + Q_{ec} = Q_c, \tag{6}$$

$$Q_{rh} + Q_{ab} = Q_h, \tag{7}$$

where  $Q_{ac}$  is the cooling load produced by the absorption chiller (kWh);  $Q_{ec}$  is the cooling load produced by the electric chiller (kWh).  $Q_c$  and  $Q_h$  are the cooling and heating demands of the building, respectively (kWh);  $Q_{rh}$  is the heat supplied to the heat exchanger (kWh), and  $Q_{ab}$ is the supplementary heat from the auxiliary boiler (kWh).

The cooling demand generated by the electric chiller,  $Q_{ec}$ , and electricity consumption of the electric chiller,  $E_{ec}$ , can be expressed as:

$$Q_{ec} = x \cdot Q_c, \tag{8}$$

$$E_{ec} = \frac{Q_{ec}}{COP_{ec}},\tag{9}$$

Where  $Q_{ec}$  is the cooling load produced by the electric chiller (kWh); *x* is the ratio of cooling load provided by electricity to the total cooling load of the building;  $Q_c$  is the cooling demand of the building (kWh), and  $COP_{ec}$  is the COP of the electric chiller.

The fuel energy consumption of the auxiliary boiler,  $F_{ab}$  (kWh), was calculated using the following equation:

$$F_{ab} = \frac{Q_{ab}}{\eta_{ab}},\tag{10}$$

where  $Q_{ab}$  is the supplementary heat from the auxiliary boiler (kWh), and  $\eta_{ab}$  is the efficiency of the auxiliary boiler.

The total fuel energy consumption of the CCHP systems,  $F^{CCHP}$  (kWh), was calculated using the following equation:

$$F^{\rm CCHP} = F_{pau} + F_{ab}.$$
 (11)

The total electricity purchased from the grid of SP systems,  $E^{SP}$  (kWh), was calculated using the following equation:

$$E_{ec} = \frac{Q_c}{COP_{ec}},\tag{12}$$

$$E^{\rm SP} = E + E_{ec}.\tag{13}$$

The total fuel energy consumption of the SP systems,  $F^{SP}$  (kWh), was calculated using the following equation:

$$F^{\rm SP} = \frac{Q_h}{\eta_{he} \times \eta_b},\tag{14}$$

where  $\eta_b$  is the efficiency of the boiler.

#### **Decision Variables**

#### Power Generation Unit Capacity

PGU capacity has a significant effect on the economic, energysaving, and environmental performance of CCHP systems. When the capacity of the PGU is established, the capacity of heat recovery unit is determined using the maximum recovery heat of PGU. The absorption chiller uses the recovery heat of PGU to meet cooling demands, and therefore, the capacity of the system changes according to PGU. The capacity of other equipment was calculated using the cooling and heating loads.

# Ratio of Cooling Load Provided by Electricity to Total Cooling Load

The total cooling load of the building was provided by the absorption chiller and the electric chiller. When the recovery heat generated by the PGU was sufficient to meet the cooling demand, the electric chiller stopped operating. Otherwise, the electric chiller needed to be operated to supplement the insufficient cooling demand. Considering the change of cooling demand at each moment, the optimized ratio of cooling load provided by the electricity to total cooling load ratio was not a fixed value, owing to the innumerable changes in the cooling demand. Therefore, it was necessary to optimize the ratio of cooling load provided by the electricity to total cooling load ratio.

## **Evaluation Index**

#### Annual Total Cost Reduction

The annual investment cost (AIC) is the total investment cost of all equipment of CCHP systems, \$/year, and can be expressed as:

$$AIC = R \times \sum_{m=1}^{m} (N_m \times I_m),$$
(15)

$$R = \frac{i \times (1+i)^n}{(1+i)^n - 1},$$
(16)

where  $N_m$  is the capacity of the *m* th equipment (kW);  $I_m$  is the investment cost of the *m* th equipment per unit capacity (kW/ year); *R* is the coefficient of investment recovery; *i* is the annual interest rate; *n* is the number of years of service life of the equipment.

The annual maintenance cost (AMC) was calculated using the following equation:

$$AMC = \sum_{m=1}^{m} (N_m \times M_m), \qquad (17)$$

where  $M_m$  is the maintenance cost of the *m* th equipment per unit capacity (kW/year).

The annual operating cost (AOC) is the total cost of the gas consumption and electricity purchase in a year, \$, and was calculated using the following equation (due to the labour cost accounts for a small proportion of the total operating cost, it can be neglected):

$$AOC = \sum_{t=1}^{8760} \left( E_{grid} \times C_e + F \times C_f \right), \tag{18}$$

where *F* is the total natural gas consumption (kWh); and  $C_e$  and  $C_f$  are the energy price of electricity and natural gas, respectively, /kWh.

The annual total cost (ATC) is the sum of the above three costs and can be calculated using the following equation:

$$ATC = AIC + AMC + AOC.$$
(19)

The cost-saving ratio (CSR) is the annual total cost-saving ratio of the CCHP systems compared with SP systems:

$$CSR = \left(1 - \frac{ATC^{CCHP}}{ATC^{SP}}\right) \times 100.$$
 (20)

#### Primary Energy Consumption

Primary energy consumption (PEC) refers to the consumption of total fuels to meet the demand for electricity and thermal

demands (kWh) and can be calculated using the following equation:

$$PEC = F_{total} + \frac{E_{grid}}{\eta_{grid} \times \eta_{tr}},$$
(21)

where  $F_{total}$  is the total amount of fuel applied to meet the electrical and thermal demands (kWh);  $\eta_{grid}$  is the power generation efficiency of power plants, and  $\eta_{tr}$  is the transmission efficiency of power grid.

Primary energy saving ratio (PESR) was defined to assess the energy consumption of CCHP systems in comparison with SP systems, using the following equation:

$$PESR = \left(1 - \frac{PEC^{CCHP}}{PEC^{SP}}\right) \times 100.$$
 (22)

#### Carbon Dioxide Emission Reduction

The impact of CCHP systems on the environment mainly comes from carbon dioxide emission (CDE); it can be determined using the emission conversion factors as follows:

$$CDE = E_{grid} \times \mu_e + F \times \mu_f, \tag{23}$$

where  $\mu_e$  is the CO<sub>2</sub> emission conversion factor of electricity from the grid (kg CO<sub>2</sub>/kWh);  $\mu_f$  is the CO<sub>2</sub> emission conversion factor of natural gas from the grid (kg CO<sub>2</sub>/m3).

Furthermore, the carbon dioxide emission reduction (CDER) was calculated using the following equation:

$$CDER = \left(1 - \frac{CDE^{CCHP}}{CDE^{SP}}\right) \times 100.$$
(24)

#### **Payback Period**

The static investment payback period refers to the time required to recover the entire investment amount without considering the value of time. The static payback period (PB) of the system was calculated using the following equation:

$$PB = \frac{AIC_{CCHP} + AMC_{CCHP} + AOC_{CCHP}}{AOC_{SP} - AOC_{CCHP}},$$
(25)

where  $AIC_{CCHP}$ ,  $AMC_{CCHP}$ ,  $AOC_{CCHP}$  are the investment, maintenance, and operating costs of CCHP systems, respectively, and  $AOC_{SP}$  is the operating cost of the SP systems.

#### **Objective Function**

The weight coefficient method was used to weight sum each evaluation index for obtaining the final optimization results in this study. The comprehensive performance index (CPI) was considered as the objective function of the model and the maximum value; it was defined using the following equation:

$$\begin{cases} Max CPI = \omega_1 CSR + \omega_2 PESR + \omega_3 CDER\\ \omega_1 + \omega_2 + \omega_3 = 1\\ 0 \le \omega_1, \omega_2, \omega_3 \le 1 \end{cases}, \quad (26)$$

where  $\omega_1$ ,  $\omega_2$ , and  $\omega_3$  are the weight coefficient of three indexes (CSR, PESR, and CDER, respectively). Notably, the optimal



performance of CCHP systems is hardly achieved using the varying results of optimal cost saving, energy saving, and CO<sub>2</sub> emission reduction due to the different weight distribution. Wang et al. (Wang et al., 2011) analyzed ten different cases of weight distribution and proposed that a better optimal result can be obtained when the weights are equaled. Therefore,  $\omega_1, \omega_2, \omega_3$  were selected as 1/3.

#### Optimization

GA was designed and proposed according to the evolution law of organisms in nature. It is a method to search for the optimal solution by simulating the natural evolution process. GA can be used for global optimization because it can extend the search space to the whole problem (Wen et al., 2020).

Notably, the optimization procedure of the CCHP systems is shown in **Figure 2**. It can be summarized as follows:

- 1. The initial population was created randomly.
- 2. Each individual of the population was coded into a binary number.
- 3. Due to the objective value being greater than 0, the opposite number of objective values was used as the input of fitness function. Then, the fitness of each individual was evaluated. If the objective function was optimal, the optimal individual was output. Otherwise, we proceeded on to the next step.
- 4. The individuals with high fitness values were selected, because the higher the fitness value, the more likely an individual is to be chosen for crossover.
- 5. Then, new individuals were created through reproduction, crossover, and mutation.

#### TABLE 1 | Comparison of different cases and basic case.

Parameters	Basic case	Case 1	Case 2	Case 3
COP of electric chiller	3	4	3	4
Gas engine power generation efficiency	0.3	0.3	0.45	0.45
Gas engine heat efficiency	0.477	0.477	0.327	0.327

6. A new population with new individuals was created. When the max comprehensive performance index (CPI) was satisfied, the optimization was concluded. If not, the optimization process was restarted from Step 3.

In this study, the GA method was implemented using MATLAB software. The GA function of MATLAB was used to solve the objective function. It should be pointed out that a negative sign must be added to revise the default minimum value of the result in MATLAB to the maximum value, because a maximum value is required as the result of the simulation.

#### Introduction of Case Studies

In this study, we compared different cases for energy saving analysis. The power generation efficiency of the gas engine and the coefficient of performance (COP) of the electric chiller affected the energy saving of the CCHP system. Three cases were considered for comparison with the basic case, and the measurements are shown in Table 1. In Case 1, the power generation efficiency and thermal efficiency of the gas engine remained unchanged, and the COP of the electric chiller increased to 4. In Case 2, the COP of the electric chiller remained unchanged, and the power generation efficiency of the gas engine is increased to 0.45; to ensure that the comprehensive energy utilization rate remained unchanged, the thermal efficiency of the gas engine was reduced to 0.327. In Case 3, the power generation efficiency of the gas engine increased to 0.45, thermal efficiency reduced to 0.327, and the COP of the electric chiller increased to 4.

## CASE STUDY

#### Introduction of Case and Energy Demands

In this study, we chose the eco-campus of the Kitakyushu Science and Research Park (KSRP) in Japan as an example (Ren et al., 2010). KSRP is located in Kitakyushu, a world-renowned environmental symbiosis city, and is a scientific research core for environmentally friendly construction in Kitakyushu. The total area of KSRP is approximately 335 ha. The eco-campus has been using CCHP system since 2001 to provide electricity, cooling, and heating demand for the energy center, collaboration center, conference center, library, gym, teaching building and experiment building, technology development and exchange center. The buildings in the area are prefabricated buildings of 4-floor and below, and the fence structure has reached the standard of high-level energy-saving buildings. The area has received the A-class certification from CASBEEblock/region of Japan. The CCHP system can satisfy the larger electricity, cooling, and heating demand of the eco-campus, and effectively reduce the energy cost. The hourly electricity, cooling, and heating demands were obtained through the energy center of the KSRP (Figure 3).

Generally, there are two operation strategies of the CCHP system: following the electrical load and following the thermal load. When the system follows the electrical load, the excess heat will be generated. If there is no storage heat device, the excess heat will not be fully utilized and lead to the low utilization efficiency of energy. When the system follows the thermal load, it gives priority to meet the cooling and heating load of the building. If generated power cannot meet the electricity demand, the shortage of power can be purchased from the power grid, which makes full use of waste heat resources and makes the system more efficient of the energy utilization. The eco-campus energy demand is mainly electricity, heating and cooling. The demand for heating and cooling are significantly greater than the demand for electricity, and there is no heat storage device designed in the system. Therefore, in order to avoid more energy cost due to larger heating and cooling load and inefficient energy utilization, this study adopts following the thermal load (FTL).

#### Setting of Parameters

According to the investigation and based on the information provided by the energy center of the eco-campus and related studies, the technical parameters and investment cost and maintenance cost of the main equipment of the system are shown in **Table 2**. To reduce the operation cost, we adopted the STOU electricity price mechanism. The prices of electricity and gas and GA parameters are shown in **Table 3**.

## **RESULTS AND DISCUSSION**

#### **Results of Optimization**

The equipment capacity of the CCHP system obtained after optimization is shown in **Table 4**. It can be seen that the costsaving ratio was 25.02%, primary energy saving ratio was 41.14%,  $CO_2$  emission reduction ratio was -3.58%, and CPI was 20.86%. Because the  $CO_2$  emission coefficient of gas is 2.21 kg  $CO_2/m^3$  and electricity is 0.463 kg  $CO_2/kWh$ , the gas engine was only used for power generation; notably, more  $CO_2$  was generated when the recovered heat was not used. Therefore, in our study, the  $CO_2$  emission of CCHP system was higher than that of separated production (SP) system.

**Figure 4A** shows the hourly electricity generated from the gas engine and purchased from the grid. The yellow line in **Figure 4A** indicates the electricity purchased from the grid, and the lower part indicates the excess electricity generated by the gas engine.



TABLE 2 | Technical parameters and investment cost and maintenance cost of the system.

Variable	Symbol	Value
Gas engine power generation efficiency <sup>a</sup>	$\eta_{DQU}$	0.30
Gas engine heat efficiency <sup>a</sup>	$\eta_{tb}$	0.477
Heat recovery unit efficiency <sup>a</sup>	$\eta_r$	0.80
Heat exchanger unit efficiency <sup>a</sup>	$\eta_{be}$	0.80
COP of absorption chiller <sup>a</sup>	COPac	0.70
COP of electric chiller <sup>a</sup>	COP <sub>ec</sub>	3.00
Boiler efficiency <sup>a</sup>	$\eta_b$ , $\eta_{ab}$	0.80
Power generation efficiency of power plant <sup>b</sup>	$\eta_{qrid}$	0.35
Grid transmission efficiency <sup>b</sup>	$\eta_{tr}$	0.92
CO <sub>2</sub> conversion factor of electricity (kg CO <sub>2</sub> /kWh) <sup>c</sup>	$\mu_{e}$	0.463
$\rm CO_2$ conversion factor of fuel (kg $\rm CO_2/m^3)$ $^{\rm c}$	$\mu_{f}$	2.21

Equipment	Investment cost (\$/kW <sup>d</sup> )	Maintenance cost (\$/kW/year)		
Gas engine	750 <sup>a</sup>	30.00 <sup>e</sup>		
Heat recover unit	130 <sup>a</sup>	5.20 <sup>e</sup>		
Heat exchanger <sup>f</sup>	31	0.05		
Absorption chiller <sup>g</sup>	154	1.24		
Electric chiller <sup>g</sup>	108	1.05		
Boiler <sup>g</sup>	31	0.07		

<sup>a</sup>The parameter values were provided by the energy center of the eco-campus.

<sup>b</sup>The parameter values and cost were determined according to Song (Song et al., 2020).

°The CO<sub>2</sub> emission conversion factors were determined according to the Kyushu Electric Power and Saibu Gas company in Japan (Zhao et al., 2020).

eMaintenance cost was assumed as 4% of the investment cost according to Ali (Ali et al., 2018).

<sup>f</sup>Heat exchanger price was determined according to Wang (Wang et al., 2010a).

<sup>g</sup>The costs were determined according to Song (Song et al., 2020).

Notably, the excess electricity was generated by the gas engine in winter or summer, when the cooling and heating demands were high (and the electricity price was high). Because the system following the thermal load, the system prioritized meeting the cooling and heating demands, which increased the gas engine power generation (higher than the electricity demand). During the transition seasons, there was no demand for cooling and heating, and the gas engine power generation only needed to meet the electricity demand; in this case, the required electricity was purchased from the grid.

**Figure 4B** shows the hourly operation strategies of the absorption chiller and electric chiller. The electric chiller provided cooling mainly during the period of valley electricity prices and low cooling demands. The absorption chiller provided

cooling during the day when electricity prices were high, and the electric chiller covered the unmet cooling demand during peak electricity prices.

**Figure 4C** shows the hourly operation strategies of the cooling and heating equipment. The gray line in **Figure 4C** represents the recovered heat generated by the gas engine. Due to the high demand for cooling and heating in winter and summer, the recovered heat could be fully utilized. However, during the transition season, there was no demand for cooling and heating, but large electricity demand; therefore, a gas engine was required to generate electricity to meet the electricity demand, and the recovered heat at this time was wasted.

Figures 5A,B shows the optimal strategies of the typical days in summer and winter. It can be seen that the gas engine runs

<sup>&</sup>lt;sup>d</sup>1 \$ = 108.74 Yen.

TABLE 3 | Prices of electricity and gas and GA parameter.

Time				Prices
Electricity	Summer	Peak time	13:00–16:00 h	0.248 \$/kWh
		Daytime	8:00-13:00, 16:	0.213 \$/kWh
			00–22:00 h	
	Other seasons	Daytime	8:00–22:00 h	0.203 \$/kWh
	All year	Night	22:00-8:00 h	0.120 \$/kWh
Natural gas		-		0.20 \$/m3
Parameter			Value	
Population size			80	
Generations			100	
Migration fraction			0.1	
Crossover fraction			0.8	
Search space of PGU	capacity		[0,3000]	
Search ratio of cooling	provided by electricity to		[0,1]	
total cooling load				

Equipment	Gas engine	Heat recovery unit	Absorption chiller	Electric chiller	Heat exchanger	Auxiliary boiler
Capacity (kW)	1,473	2,342	1,874	1,881	1,874	1,186
		C	ССНР		SP	
ATC		940.866		1,25	4,799	25.02
PEC		15,591,460		26,489,058		41.14
CDE		3,569,203		3,445,791		-3.58
CPI						20.86

from 8:00 to 21:00 and stops from 22:00 to 7:00. During the valley electricity price period in summer, all the cooling demand is provided by the electric chiller. During the day that the cooling demand is provided by the absorption chiller, and the insufficient cooling demand during the peak electricity price period is supplemented by the electric chiller. During the valley price period in winter, all the heating demand is provided by the auxiliary boiler. The heating demand is provided by the heat exchanger during the day, and the insufficient heat is supplemented by the auxiliary boiler. Because the gas engine stops during the valley electricity price period, the electricity at this time is all purchased from the grid to meet the electricity demand. The electricity supply of the gas engine during the day is determined by the demand for cooling and heating, and the unmet electricity demand is fulfilled by the grid. Figures 5C,D shows the economic comparison between the CCHP system and the SP system for typical days in summer and winter. It can be seen that the CCHP system has more economic advantages than the separate production system no matter in summer or winter. However, the energy cost of the CCHP system is higher than the separate production system during the period when the CCHP system is stop running, due to the heating and cooling demand during the valley electricity price period is provided by auxiliary equipment, which results in higher energy costs. In summer, CCHP systems save 53.47% of energy costs

compared to separate production systems, and 51.20% of energy costs in winter. Therefore, using CCHP systems under this operation strategy has more economic potential than the separate production system.

### Comprehensive Performance Analysis Cost Saving Analysis

In Japan, there are many electricity pricing mechanisms. In this section, we have compared the seasonal time-of-use (STOU) and time-of-use (TOU) prices (Figure 6). We observed that the Primary energy saving ratio (PESR) and carbon dioxide emission reduction (CDER) were basically unaffected by the changes in the electricity price. The electric chiller needed to be operated to meet the largest cooling demand from 13:00 h to 16: 00 h in summer, and peak electricity appeared in the period because of the STOU electricity mechanism. To save the operating cost during the peak period of electricity consumption, the gas engine was shut down during the valley price period, and all the cooling load was provided by the electric chiller. The gas engine was started during the day to meet the cooling demand as much as possible. In this way, the cooling load supplemented by the electric chiller was reduced, and the operation cost during the peak electricity price period in summer was saved in a large section. When the TOU price was adopted, the cost-saving ratio of the CCHP system was 24.31%. When the STOU was considered, the cost-saving ratio of the CCHP system was 25.02%. Thus, the TOU price has advantages



for the economy of the CCHP system, but for the regions having large cooling demands in summer, it was more economic to adopt the STOU pricing mechanism.

#### **Energy Saving Analysis**

**Figure 7** shows the energy consumption of the CCHP system in different cases. All cases had better energy-saving performance than the basic case; Case 3 was the ideal case and could save energy by 61.49%. Notably, the electricity purchase in Case 1 was significantly higher than that in Case 2, and the natural gas consumption of Case 2 was higher than that of Case 1, while the CDER remained the same. This is because Case 2 improved the power generation efficiency of the gas engine and increased the power generation of the gas engine, while the reduction of the thermal efficiency reduced the recovery heat generated by the gas engine and required more natural gas consumption to meet the heating demand in winter. Thus, improvement in the COP of the electric chiller and the power generation efficiency of the gas engine can save energy consumption.

#### CO<sub>2</sub> Emission Reduction Analysis

The  $CO_2$  emission reduction performance in this study was negative. However, in Japan, the  $CO_2$  emission coefficient of electricity is different in each region. The reason for the different  $CO_2$  emission coefficients of electricity is that the proportion of renewable energy and nuclear power, which do not emit carbon dioxide, is different. **Table 5**, shows the  $CO_2$ emission coefficient of electricity in different regions, and the results are shown in **Figure 8**. In our study, the CDER of Hokkaido, Tohoku, Kinki, and Chugoku were positive, while those of other regions were negative. This shows that the CCHP system is more suitable in regions where the  $CO_2$ emission coefficient of electricity is greater than 0.5 and the CDER is positive. And we convert the  $CO_2$  emission coefficient of electricity into the clean energy ratio, accounting for 40%.

## **Sensitivity Analysis**

# Influence of Energy Price on the Economic Performance of CCHP System

The electricity price affects the operating cost of the CCHP system, and the operating costs account for a large proportion of the total system costs. Consider the electricity price in Table 3 as the basic price, and decrease or increase 0-50% of that to analyze the impact of electricity price on the CCHP system's economic performance. Figure 9A shows the change in the payback period and the total cost-saving ratio of the CCHP system, with different electricity prices, when the gas price remained unchanged. With the increase in electricity price, the payback period showed a downward trend, while the cost-saving ratio showed an upward trend. When the electricity price dropped by 50%, the payback period of the CCHP system was 12.6 years, and the total cost-saving ratio (CSR) of that was 4.11%. However, when the electricity price increased by 50%, the payback period of the CCHP system was about 3.6 years, and the total CSR of that was 32.98%. This indicates that a drop in the electricity price can decrease the economic performance of the CCHP system. This is because all electricity consumption of the SP system was purchased from the grid, while the CCHP system could generate electricity by the gas engine; the electricity deficit was fulfilled by the grid, which greatly reduced the amount of electricity purchased.

The natural gas price also affects the economic performance of the CCHO systems. The impact of gas price on the economic performance of the CCHP system is shown in **Figure 9B**. Contrary to the electricity price, the payback period of the CCHP system showed an increasing trend with increasing gas price, whereas the total CSR showed a downward trend. When the gas price dropped by 50%, the payback period was 4.4 years, and the total CSR was 30.75%. When the gas price increased by 50%, the payback period was 6.3 years, and the total CSR was 19.54%. The natural gas consumption of the CCHP system was greater than that of the SP system because natural gas was required by the CCHP







system for power generation and boiler operation. Therefore, the increase in gas price can lead to a decrease in the economic performance of the CCHP system.



# Influence of $CO_2$ Emission Coefficients on the Economic Performance of CCHP System

The  $CO_2$  emission coefficient of electricity affected the  $CO_2$  saving potential of CCHP systems. The  $CO_2$  emission

**TABLE 5** | CO<sub>2</sub> emission coefficient of electricity in different regions.

Region	Hokkaido	Tohoku	Kanto	Chubu	Kinki	Chugoku	Shikoku	Kyushu
CO <sub>2</sub> emission coefficients (kg/kWh) <sup>a</sup>	0.601	0.521	0.441	0.426	0.530	0.585	0.382	0.463

<sup>a</sup>The CO<sub>2</sub> emission conversion factors were determined according to the Hokkaido Electric Power, Northeastern Electric Power, Mito Electric Power, Aichi Electric Power, Wakayama Electric Power, Chugoku Electric Power, Shikoku Electric Power, and Kyushu Electric Power company in Japan.



coefficient in this study was calculated for the Kyushu region; the CDER was negative for the CCHP system, while the comprehensive performance index was positive. **Figure 10** shows the effect of  $CO_2$  emission coefficient decreasing from 0 to 90%. Notably, the overall development direction of the power system in Japan is towards low-carbon development. When the  $CO_2$  emission coefficient of electricity in the Kyushu region was reduced to 67%, the impact of the economic and energy-saving index was offset, and the comprehensive performance index was below 0, which was not suitable for the CCHP system.

Through the sensitivity analysis of energy price and  $CO_2$  emission coefficient of electricity, it can be concluded that when the parameters change greatly, the comprehensive performance of CCHP systems will be significantly affected.

In this part, firstly, the optimization results are analyzed. Then the development potential of CCHP system is analyzed from three factors: cost saving, energy saving and carbon saving. Finally, the sensitivity analysis of energy price and carbon emission coefficient provides suggestions for the promotion of cogeneration system.

## CONCLUSION

In this study, we optimized and evaluated the comprehensive performance of the CCHP system for an eco-campus in Japan. The genetic algorithm (GA) method was used to determine the capacity of each piece of equipment and the operation strategies of the CCHP system. A comprehensive performance index was



proposed to evaluate the economy, energy-saving, and  $CO_2$  emission reduction potential of the CCHP system. Then, sensitivity analysis was conducted for determining the impacts of electricity and natural gas prices and  $CO_2$  emission on the performance of the CCHP system. The main conclusions of our study are as follows:

1. The economic performance of the CCHP system was better than that of the SP system and the total cost of the system could be reduced by 25.02%. The electricity and natural gas prices were



selected as the factors that affect the economic performance of the CCHP system. With the increase of electricity price, the economic performance of the CCHP system improved; however, in the case of natural gas price, the opposite effect occurred. With the increase of natural gas prices, the economic performance of the system decreased. When the electricity price changed, the change range of the system payback period was from 3.6 to 12.6, while in the case of when the natural gas price changed, the change range of the payback period was from 4.4 to 6.3. This shows that changes in the electricity price can affect the economic performance of the CCHP system more than changes in the natural gas price. By comparing the economy of seasonal TOU price and TOU price in areas that have an excessive cooling demand in summer.

2. By comparing the COP of the electric chiller and the power generation efficiency of the gas engine, we found that the improvement of the COP of the electric chiller and the power generation efficiency of the gas engine can greatly save the energy consumption of the CCHP system. When the efficiencies of these two parameters were improved at the same time, energy-saving was optimal.

### REFERENCES

- Agency for Natural Resources and Energy (2021). Available at: https://www. enecho.meti.go.jp/.
- Ali, H., Eldrup, N. H., Normann, F., Andersson, V., Skagestad, R., Mathisen, A., et al. (2018). Cost Estimation of Heat Recovery Networks for Utilization of Industrial Excess Heat for Carbon Dioxide Absorption. *Int. J. Greenhouse Gas Control.* 74 (May), 219–228. doi:10.1016/j.ijggc.2018.05.003
- Bischi, A., Taccari, L., Martelli, E., Amaldi, E., Manzolini, G., Silva, P., et al. (2014). A Detailed MILP Optimization Model for Combined Cooling, Heat and Power System Operation Planning. *Energy*. 74 (C), 12–26. doi:10.1016/j.energy.2014.02.042
- Cao, Y., Wang, Q., Wang, Z., Jermsittiparsert, K., and Shafiee, M. (2020). A New Optimized Configuration for Capacity and Operation Improvement of CCHP System Based on Developed Owl Search Algorithm. *Energ. Rep.* 6, 315–324. doi:10.1016/j.egyr.2020.01.010

3. After optimization, the result of CDER was negative because there was a wide variation in the  $CO_2$  emission coefficients of electricity and gas. However, the  $CO_2$  emission coefficients of electricity in different regions were different. By comparing the  $CO_2$  emission coefficients of electricity in different regions, we could conclude that the regions having a clean energy ratio higher than 40% were more suitable for the promotion of the CCHP system.

Overall, this study optimized and evaluated the CCHP system of a specific building to promote its comprehensive performance. And the influence of different electricity price mechanisms on the development of the CCHP system was analyzed. Our results can provide a reference for eco-campus to establish a CCHP system to improve the comprehensive performance. The comprehensive performance assessment method used in this study put forward suggestions on the adaptability and development potential of CCHP systems in the future.

This study mainly improved the performance by optimized the installed capacity and operation strategies of the CCHP system. However, the failure during equipment operation also seriously affects the development of CCHP system. Therefore, a more detailed optimization analysis of CCHP system should be carried out in combination with equipment maintenance in the future work Agency for Natural Resources and Energy, 2021.

## DATA AVAILABILITY STATEMENT

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

## **AUTHOR CONTRIBUTIONS**

ZL, WG, and FQ contributed to the design of the study. ZL and LZ collated and analyzed the data. ZL and FQ have analyzed the data of the manuscript. ZL wrote the first draft of the manuscript. WG, FQ, LZ, and SK wrote sections of the manuscript. All authors contributed to manuscript revision, read, and approved the submitted version.

- Delgado, B. M., Cao, S., Hasan, A., and Sirén, K. (2017). Multiobjective Optimization for Lifecycle Cost, Carbon Dioxide Emissions and Exergy of Residential Heat and Electricity Prosumers. *Energ. Convers. Manage.* 154 (April), 455–469. doi:10.1016/j.enconman.2017.11.037
- Farahbakhsh, M. T., and Chahartaghi, M. (2020). Performance Analysis and Economic Assessment of a Combined Cooling Heating and Power (CCHP) System in Wastewater Treatment Plants (WWTPs). *Energ. Convers. Manage.* 224 (August). doi:10.1016/j.enconman.2020.113351
- Ghersi, D. E., Amoura, M., Loubar, K., Desideri, U., and Tazerout, M. (2021). Multi-Objective Optimization of CCHP System with Hybrid Chiller Under New Electric Load Following Operation Strategy. *Energy.* 219, 119574. doi:10.1016/j.energy.2020.119574
- Jing, R., Zhu, X., Zhu, Z., Wang, W., Meng, C., Shah, N., et al. (2018). A Multi-Objective Optimization and Multi-Criteria Evaluation Integrated Framework for Distributed Energy System Optimal Planning. *Energ. Convers. Manage*. 166 (April), 445–462. doi:10.1016/j.enconman.2018.04.054

- Kim, J., Jung, Y., and Lee, H. (2019). Optimization of Dynamic Poly-Generation System and Evaluation of System Performance in Building Application. *Energ. Convers. Manage.* 201 (July), 112128. doi:10.1016/j.enconman.2019.112128
- Kong, X. Q., Wang, R. Z., Li, Y., and Huang, X. H. (2009). Optimal Operation of a Micro-Combined Cooling, Heating and Power System Driven by a Gas Engine. *Energ. Convers. Manage*. 50 (3), 530–538. doi:10.1016/j.enconman.2008.10.020
- Li, B., Hu, P., Zhu, N., Lei, F., and Xing, L. (2019). Performance Analysis and Optimization of a CCHP-GSHP Coupling System Based on Quantum Genetic Algorithm. Sustain. Cities Soc. 46 (December 2018), 101408. doi:10.1016/ j.scs.2018.12.036
- Li, Y., Tian, R., Wei, M., Xu, F., Zheng, S., Song, P., et al. (2020). An Improved Operation Strategy for CCHP System Based on High-Speed Railways Station Case Study. *Energ. Convers. Manage.* 216 (May), 112936. doi:10.1016/ j.enconman.2020.112936
- Lin, H., Yang, C., and Xu, X. (2020). A New Optimization Model of CCHP System Based on Genetic Algorithm. Sustain. Cities Soc. 52 (March 2019), 101811. doi:10.1016/j.scs.2019.101811
- Papadimitriou, A., Vassiliou, V., Tataraki, K., Giannini, E., and Maroulis, Z. (2020). Economic Assessment of Cogeneration Systems in Operation. *Energies.* 13 (9), 2206. doi:10.3390/en13092206
- Ren, F., Wei, Z., and Zhai, X. (2021). Multi-Objective Optimization and Evaluation of Hybrid CCHP Systems for Different Building Types. *Energy*. 215, 119096. doi:10.1016/j.energy.2020.119096
- Ren, H., and Gao, W. (2010). A MILP Model for Integrated Plan and Evaluation of Distributed Energy Systems. *Appl. Energ.* 87 (3), 1001–1014. doi:10.1016/ j.apenergy.2009.09.023
- Ren, H., Zhou, W., Nakagami, K. i., Gao, W., and Wu, Q. (2010). Multi-Objective Optimization for the Operation of Distributed Energy Systems Considering Economic and Environmental Aspects. *Appl. Energ.* 87 (12), 3642–3651. doi:10.1016/j.apenergy.2010.06.013
- Sanaye, S., and Khakpaay, N. (2014). Simultaneous Use of MRM (Maximum Rectangle Method) and Optimization Methods in Determining Nominal Capacity of Gas Engines in CCHP (Combined Cooling, Heating and Power) Systems. *Energy*. 72, 145–158. doi:10.1016/j.energy.2014.05.018
- Soltani, M., Chahartaghi, M., Majid Hashemian, S., and Faghih Shojaei, A. (2020). Technical and Economic Evaluations of Combined Cooling, Heating and Power (CCHP) System With Gas Engine in Commercial Cold Storages. *Energ. Convers. Manage.* 214 (May), 112877. doi:10.1016/ j.enconman.2020.112877
- Song, Z., Liu, T., Liu, Y., Jiang, X., and Lin, Q. (2020). Study on the Optimization and Sensitivity Analysis of CCHP Systems for Industrial Park Facilities. *Int. J. Electr. Power Energ. Syst.* 120 (February), 105984. doi:10.1016/ j.ijepes.2020.105984
- Wang, J.-J., Jing, Y.-Y., and Zhang, C.-F. (2010a). Optimization of Capacity and Operation for CCHP System by Genetic Algorithm. *Appl. Energ.* 87 (4), 1325–1335. doi:10.1016/j.apenergy.2009.08.005
- Wang, J., Zhai, Z., Jing, Y., and Zhang, C. (2010b). Particle Swarm Optimization for Redundant Building Cooling Heating and Power System. *Appl. Energ.* 87 (12), 3668–3679. doi:10.1016/j.apenergy.2010.06.021

- Wang, J., Zhai, Z., Jing, Y., Zhang, X., and Zhang, C. (2011). Sensitivity Analysis of Optimal Model on Building Cooling Heating and Power System. *Appl. Energ.* 88 (12), 5143–5152. doi:10.1016/j.apenergy.2011.07.015
- Wei, D., Chen, A., Sun, B., and Zhang, C. (2016). Multi-Objective Optimal Operation and Energy Coupling Analysis of Combined Cooling and Heating System. *Energy*. 98, 296–307. doi:10.1016/j.energy.2016.01.027
- Wen, Q., Liu, G., Wu, W., and Liao, S. (2020). Genetic Algorithm-Based Operation Strategy Optimization and Multi-Criteria Evaluation of Distributed Energy System for Commercial Buildings. *Energ. Convers. Manage.* 226 (August), 113529. doi:10.1016/j.enconman.2020.113529
- Wu, D. W., and Wang, R. Z. (2006). Combined Cooling, Heating and Power: A Review. Prog. Energ. Combustion Sci. 32 (5–6), 459–495. doi:10.1016/ j.pecs.2006.02.001
- Wu, Q., Ren, H., Gao, W., and Ren, J. (2014). Multi-Criteria Assessment of Combined Cooling, Heating and Power Systems Located in Different Regions in Japan. *Appl. Therm. Eng.* 73 (1), 660–670. doi:10.1016/ j.applthermaleng.2014.08.020
- Yan, B., Xue, S., Li, Y., Duan, J., and Zeng, M. (2016). Gas-Fired Combined Cooling, Heating and Power (CCHP) in Beijing: A Techno-Economic Analysis. *Renew. Sustain. Energ. Rev.* 63, 118–131. doi:10.1016/j.rser.2016.05.036
- Zhang, L., Gao, W., Yang, Y., and Qian, F. (2020). Impacts of Investment Cost, Energy Prices and Carbon Tax on Promoting the Combined Cooling, Heating and Power (CCHP) System of an Amusement Park Resort in Shanghai. *Energies.* 13 (6), 4252. doi:10.3390/en13164252
- Zhao, X., Gao, W., Qian, F., Li, Y., Ushifusa, Y., Yang, Z., et al. (2020). Economic Performance of Multi-Energy Supply System in a Zero-Carbon House. *Energy and Buildings*. 226, 110363. doi:10.1016/j.enbuild.2020.110363
- Zheng, X., Wu, G., Qiu, Y., Zhan, X., Shah, N., Li, N., et al. (2018). A MINLP Multi-Objective Optimization Model for Operational Planning of a Case Study CCHP System in Urban China. *Appl. Energ.* 210, 1126–1140. doi:10.1016/ j.apenergy.2017.06.038

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# NOMENCLATURE

AIC annual investment cost (\$/year) AMC annual maintenance cost (\$/year) AOC annual operating cost (\$/kWh) ATC annual total cost (\$/year) C cost (\$) CCHP combined cooling heating and power CDE carbon dioxide emission CDER COP coefficient of performance CO<sub>2</sub> carbon dioxide CPI comprehensive performance index CSR cost-saving ratio E electricity demand (kWh) **F** fuel consumption (m<sup>3</sup>) FTL following the thermal load GA genetic algorithm I investment cost (\$) KSRP Kitakyushu science and research park **M** maintenance cost (\$) N capacity of the equipment (kWh) PEC primary energy consumption PESR primary energy consumption ratio PGU power generation unit **Q** heat (kWh)  $\boldsymbol{SP}$  separated production

**STOU** seasonal time-of-use **TOU** time-of-use

## **Greek letter**

 $\eta$  efficiency  $\mu$  CO<sub>2</sub> emission conversion factor  $\omega$  weight vector

# Subscript

**ab** auxiliary boiler ac absorption chiller **b** boiler *c* cooling *e* electricity ec electric chiller **f** fuel grid electricity grid **h** heating he heat exchanger *m* equipment number **pgu** power generation unit *r* recovery heat *rh* recovery heat supplied to heat exchanger **t** hours total total amount of fuel tr transmission of power grid